

# Image Enhancement by Histogram Processing



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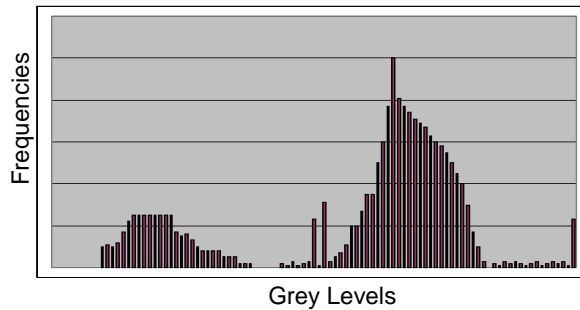
**@ IEEE Bombay Section**

- **Treasurer** (2020)
- **Executive Committee Member** (2015)

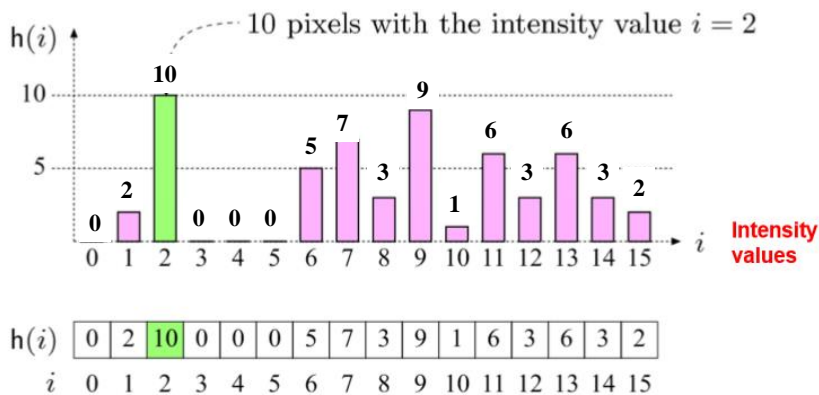
## Image Histogram

**The Histogram of an image is a Graph of Gray Value Vs Frequency of Gray Value in the image**

It gives the distribution of grey levels in the image. Histogram provides a global description of the appearance of an image. Information obtained from histogram is very large in quality.



## Image Histogram



- Histograms: only statistical information
- No indication of pixels locations

# Image Contrast

The contrast of a grayscale image indicates how easily objects in the image can be distinguished

- **High contrast image:** many distinct intensity values.
- **Low contrast:** image uses few intensity values.

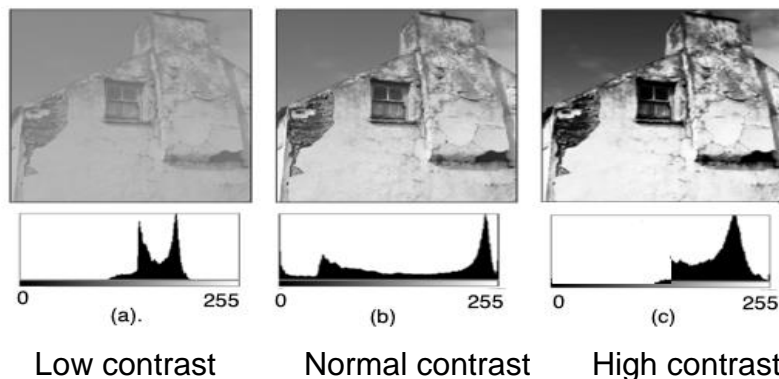
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## Histograms and Contrast

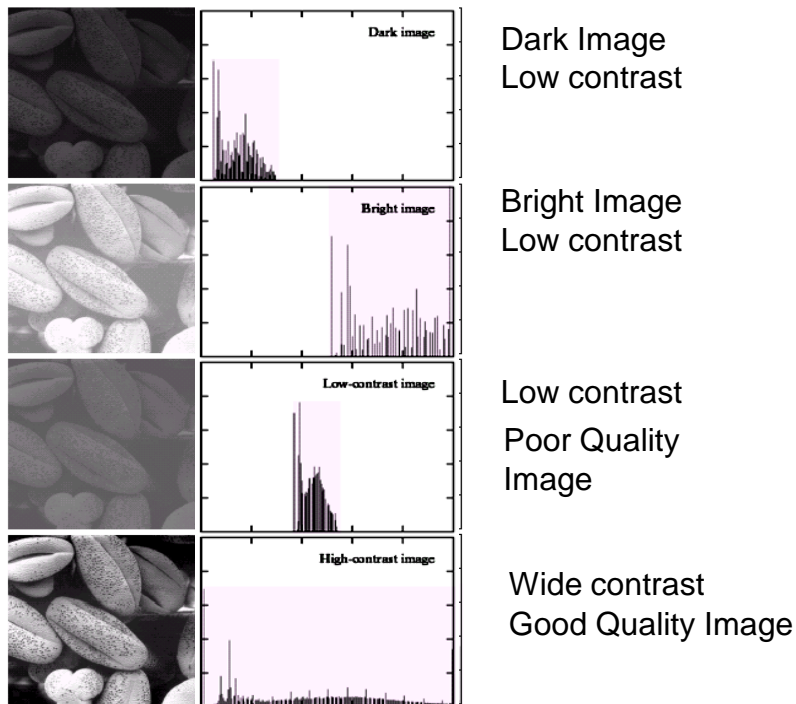
Good Contrast?

Widely spread intensity values & large difference between min and max intensity values



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### Image Enhancement by Histogram Processing :

- (i) Histogram of dark image, bright image and low contrast image is **narrow**
- (ii) This can be done by adjusting the Probability Density Function (PDF) of the original Histogram of the image so that the Probability spreads equally

**Example :**



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(iii) Histogram Processing involves the modification of input image histogram to increase the dynamic range of gray values

(iv) This improves the visual quality of image on display device

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## [1] Histogram Equalization

- (i) Histogram Equalization Tx increases dynamic range of gray levels of input image so that they are evenly distributed.
- (ii) The histogram of the output image is almost uniform over the entire range of gray levels.
- (iii) In Histogram Equalization, output image is obtained by mapping each pixel with value  $r_k$  in the input image into a corresponding pixel with value  $S_k$  in the output image.

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## Histogram Equalisation

The formula for histogram equalisation is given where

- $r_k$ : input intensity
- $s_k$ : processed intensity
- $k$ : the intensity range (e.g 0.0 – 1.0)
- $N_j$ : the frequency of intensity  $j$
- $N$ : the sum of all frequencies

$$\begin{aligned} s_k &= T(r_k) \\ &= \sum_{j=1}^k p_r(r_j) \\ &= \sum_{j=1}^k \frac{N_j}{N} \end{aligned}$$

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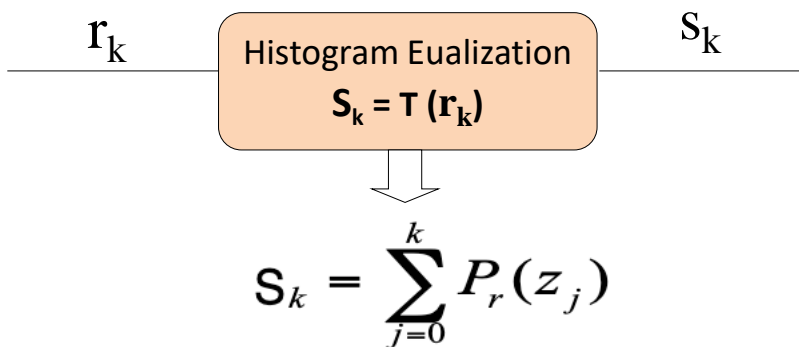
**For Example :** Consider 3 bit image F such that,  
 $F(x,y) = |x - y|$  for  $x,y = 0,1,2,3,4,5,6,7$

X \ Y	0	1	2	3	4	5	6	7
0	0	1	2	3	4	5	6	7
1	1	0	1	2	3	4	5	6
2	2	1	0	1	2	3	4	5
3	3	2	1	0	1	2	3	4
4	4	3	2	1	0	1	2	3
5	5	4	3	2	1	0	1	2
6	6	5	4	3	2	1	0	1
7	7	6	5	4	3	2	1	0

**Frequency Table**

INPUT $r_k$	Freq. $Nr_k$
0	8
1	14
2	12
3	10
4	8
5	6
6	4
7	2

- **Step-1 : Equalize Histogram**



INPUT $r_k$	Norm $r_k$	Freq. $Nr_k$	PDF Pr	CDF $S_k$	Equalized Gray Value $S_k$
0	0	8	0.125	0.125	1
1	1/7	14	0.219	0.344	2
2	2/7	12	0.187	0.531	4
3	3/7	10	0.156	0.687	5
4	4/7	8	0.125	0.812	6
5	5/7	6	0.094	0.906	7
6	6/7	4	0.063	0.969	7
7	1	2	0.031	1	7

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## Step-2 : Find Output Image

Replace every  $r_k$  by the corresponding value of  $S_k$

INPUT $r_k$	Equalized Gray Value $S_k$
0	1
1	2
2	4
3	5
4	6
5,6,7	7

**F=**

0	1	2	3	4	5	6	7
1	0	1	2	3	4	5	6
2	1	0	1	2	3	4	5
3	2	1	0	1	2	3	4
4	3	2	1	0	1	2	3
5	4	3	2	1	0	1	2
6	5	4	3	2	1	0	1
7	6	5	4	3	2	1	0

Input Image

**A=**

1	2	4	5	6	7	7	7
2	1	2	4	5	6	7	7
4	2	1	2	4	5	6	7
5	4	2	1	2	4	5	6
6	5	4	2	1	2	4	5
7	6	5	4	2	1	2	4
7	7	6	5	4	2	1	2
7	7	7	6	5	4	2	1

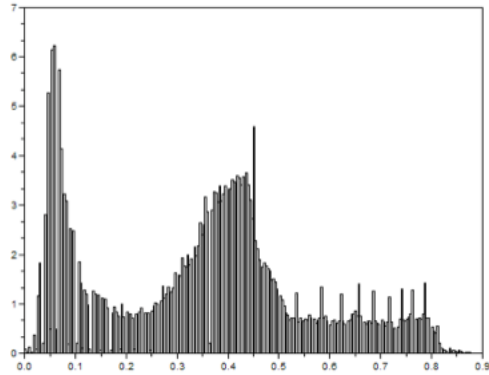
Equalized Output Image



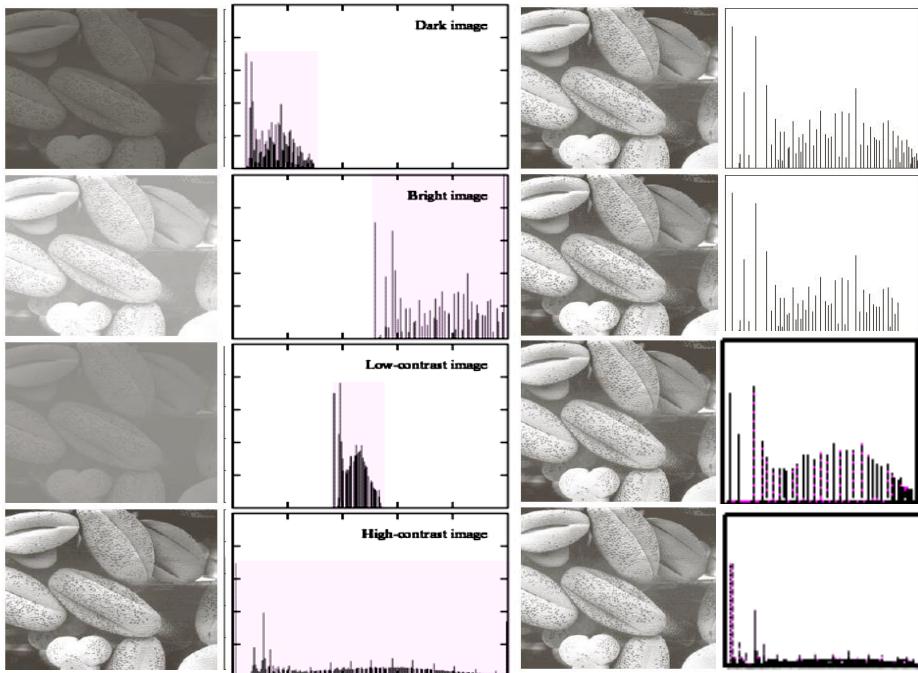
**Example :**



Image



Histogram : (Good contrast)



## [2] Histogram Specification

- (i) Histogram Specification Tx modifies histogram of input image as per the specified image histogram.
- (ii) Histogram of the output image closely matches with the histogram of the specified image.

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## Histogram Specification Algorithm

### (I) Equalize Histogram A

$$S_k = T(r_k)$$

$$S_k = \sum_{j=0}^k P_r(r_j)$$

### (II) Equalize Histogram B

$$v_k = T(z_k)$$

$$V_k = \sum_{j=0}^k P_r(z_j)$$

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## Histogram Specification Algorithm.....

### (III) Equalize Histogram A as per Histogram B

Express  $Z_k$  as a function of  $r_k$

$$Z_k = G^{-1} (V_k)$$

Now, Equate  $S_k$  with  $V_k$

Put  $V_k = \text{Appropriate value of } S_k$

$$Z_k = G^{-1} (S_k)$$

Put  $S_k = T (r_k)$

$$Z_k = G^{-1} [ T (r_k) ]$$

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Q1 Histogram of Input Image A is given below.

- (a) Modify the histogram A as given in histogram B.
- (b) Plot the histogram of the Input and Output Image.

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▪ **Input Image Histogram (A) :**

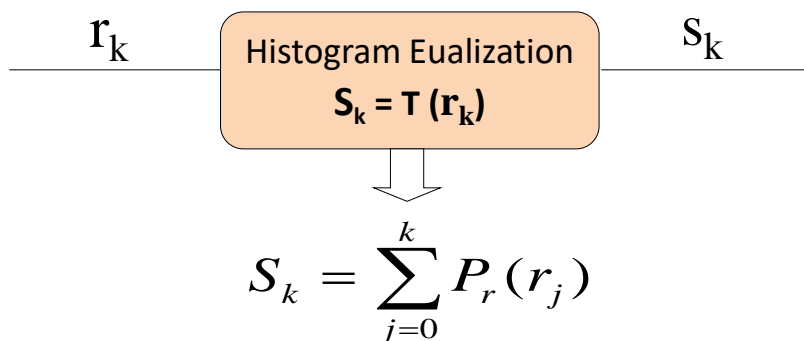
Gray Level $r_k$	0	1	2	3	4	5	6	7
No of Pixels $N_{rk}$	790	1023	850	656	329	245	122	81

• **Specified Histogram (B) :**

Gray Level $z_k$	0	1	2	3	4	5	6	7
No of Pixels $N_{zk}$	0	0	0	614	819	1230	819	614

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• **Step-1 : Equalize Input Image Histogram A**

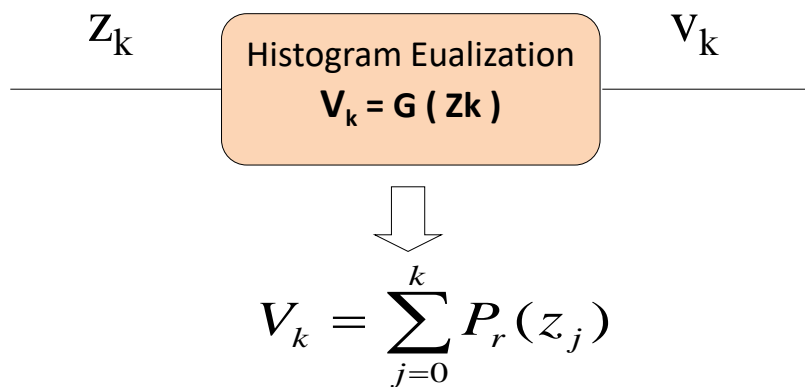


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INPUT rk	Norm rk	Freq. Nr <sub>k</sub>	PDF Pr	CDF S <sub>k</sub>	Equalized Gray Value S <sub>k</sub>
0	0	790	0.192	0.192	1
1	1/7	1023	0.249	0.441	3
2	2/7	850	0.207	0.648	5
3	3/7	656	0.160	0.808	6
4	4/7	329	0.080	0.888	6
5	5/7	245	0.059	0.947	7
6	6/7	122	0.029	0.976	7
7	1	81	0.019	1	7

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- **Step-2** : Equalize Specified Histogram **B**



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INPUT $Z_k$	Norm $Z_k$	Freq. $N_{Z_k}$	PDF $P_r$	CDF $V_k$	Equalized $V_k$
0	0	0	0	0	0
1	1/7	0	0	0	0
2	2/7	0	0	0	0
3	3/7	614	0.150	0.150	1
4	4/7	819	0.200	0.350	2
5	5/7	1230	0.300	0.650	5
6	6/7	819	0.200	0.850	6
7	1	614	0.150	1.00	7

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- **Step-3** : Equalize Histogram A as per Histogram B

Express  $Z_k$  as a function of  $r_k$   $Z_k = G^{-1} [ T ( r_k ) ]$

Col 1	Col 2	Col 3	Col 4	Col 5
INPUT $r_k$	Equalized $S_k$	Closest $V_k$	Inverse $Z_k$	Freq. of $Z_k$ In the output Image $N_k$
0	1	1	3	790
1	3	2	4	1023
2	5	5	5	850
3, 4	6	6	6	985
5, 6, 7	7	7	7	448

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- **Step-4** : Find Frequency Table of Output Image

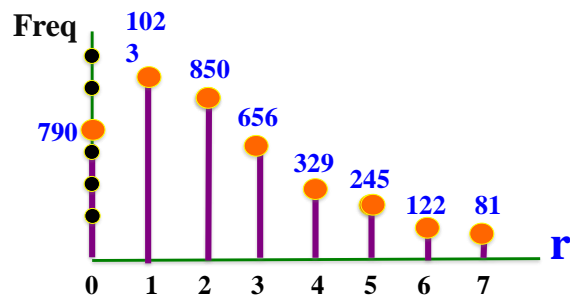
Output Image Gray Value : $Z_k$	Freq. of $Z_k$ In the output Image $N_k$
0	0
1	0
2	0
3	790
4	1023
5	850
6	985
7	448

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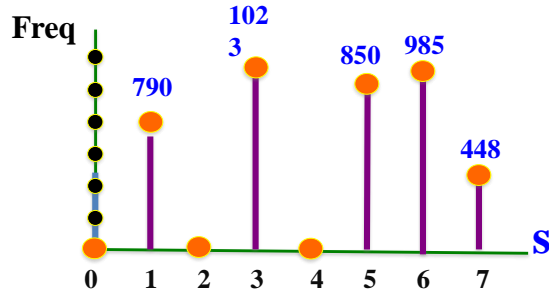
**Input Histogram (A)  
and Equalized  
Histogram**

rk	$Nr_k$	Sk	$Ns_k$
0	790	0	0
1	1023	1	790
2	850	2	0
3	656	3	1023
4	329	4	0
5	245	5	850
6	122	6	985
7	81	7	448

**Input Histogram (A) :**



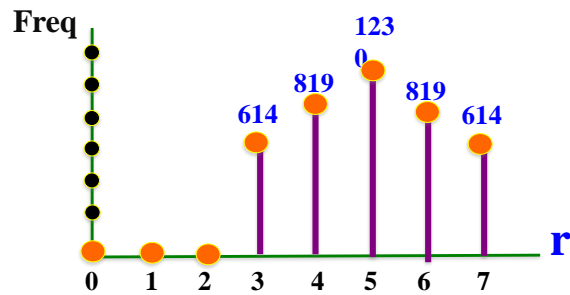
**Equalized Input Histogram (A)**



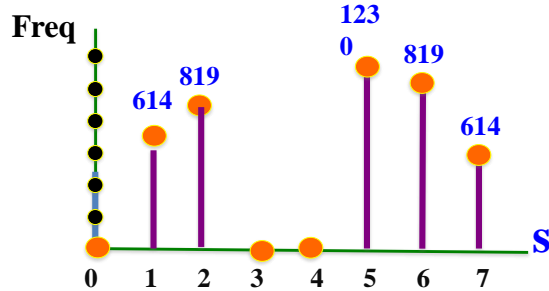
### Specified Histogram (B) & Equalized Histogram

Z <sub>k</sub>	Nz <sub>k</sub>	V <sub>k</sub>	Nv <sub>k</sub>
0	0	0	0
1	0	1	614
2	0	2	819
3	614	3	0
4	819	4	0
5	1230	5	1230
6	819	6	819
7	614	7	614

### Specified Histogram (B) :



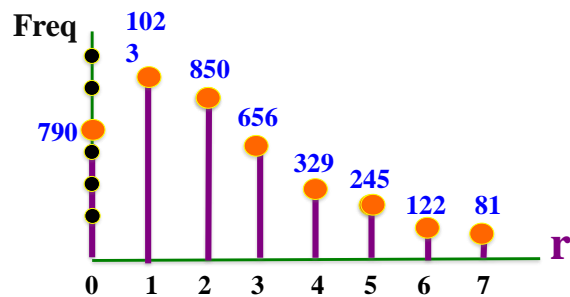
### Equalized Histogram (B) :



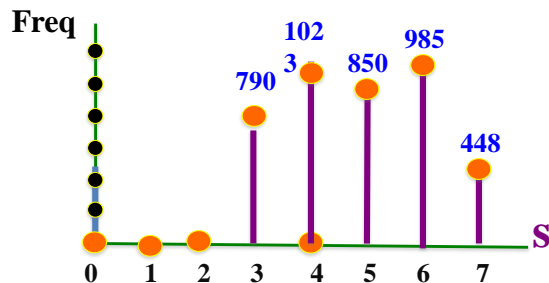
### Input Histogram (A) and Equalized Histogram as per B

rk	Nr <sub>k</sub>	Z <sub>k</sub>	Nz <sub>k</sub>
0	790	0	0
1	1023	1	0
2	850	2	0
3	656	3	790
4	329	4	1023
5	245	5	850
6	122	6	985
7	81	7	448

### Input Histogram (A) :

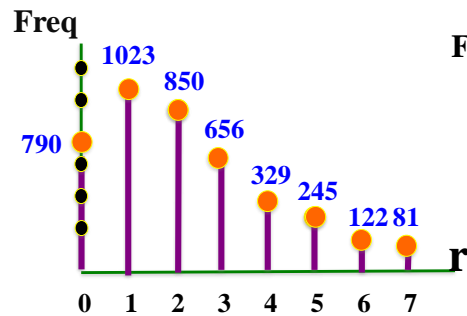


### Equalized Input Histogram as per (B)

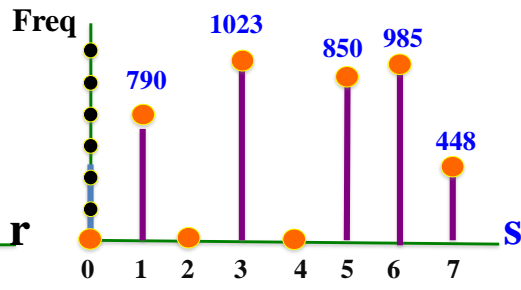




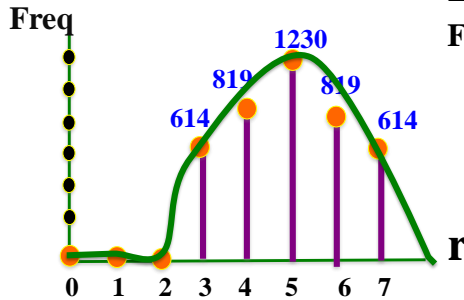
**Input Histogram (A) :**



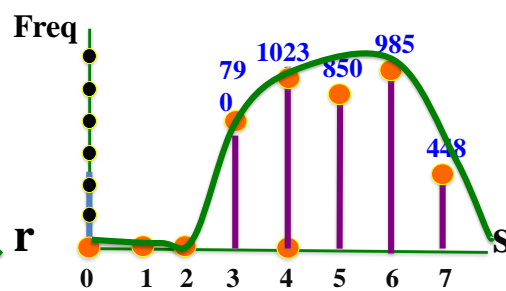
**Equalized Input Histogram (A)**



**Specified Histogram (B) :**



**Equalized Histogram(A) as per (B)**



### [3] Histogram Stretching

Histogram Stretching Tx increases the dynamic range of Gray values of input image **linearly**.

**Eg** Frequency table of 3 bit input image is given below. Increase the dynamic range to [0 to 7] and find new image frequency table.

Gray Level $r_k$	0	1	2	3	4	5	6	7
Frequency $N_{rk}$	100	90	85	70	0	0	0	0

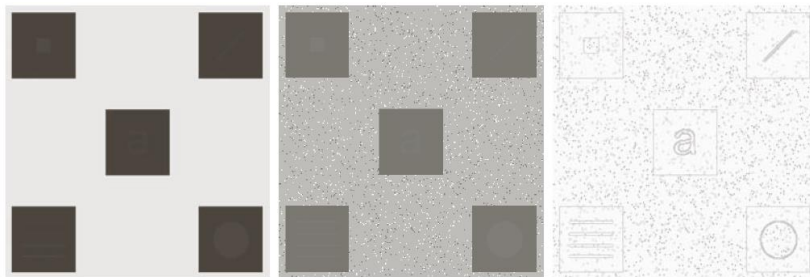
## [4] Local Histogram Equalization

Local HE is done by applying Transformation function over the intensity distribution in neighborhood of every pixel

At each pixel, Histogram of the points in the neighbourhood is computed and either Histogram equalization or Histogram Specification is either obtained

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Local Histogram Processing....



a b c

(a) Original Image

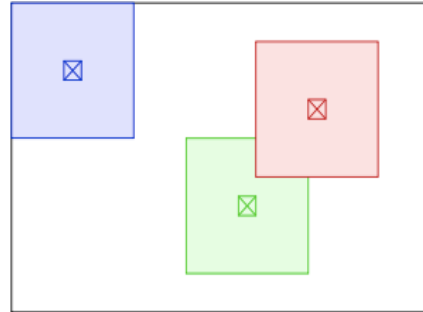
(b) Result of Global HE

(c) Result of Local HE

- Image in (a) is slightly noisy but the noise is imperceptible.
- HE enhances the noise in smooth regions (b).
- Local HE reveals structures having values close to the values of the squares and small sizes to influence HE (c).

## [4] Adaptive Histogram Equalization (AHE)

The adaptive method computes several histograms, each corresponding to a distinct section of the image, and uses them to redistribute the lightness values of the image.



It is therefore suitable for improving the local contrast and enhancing the definitions of edges in each region of an image.

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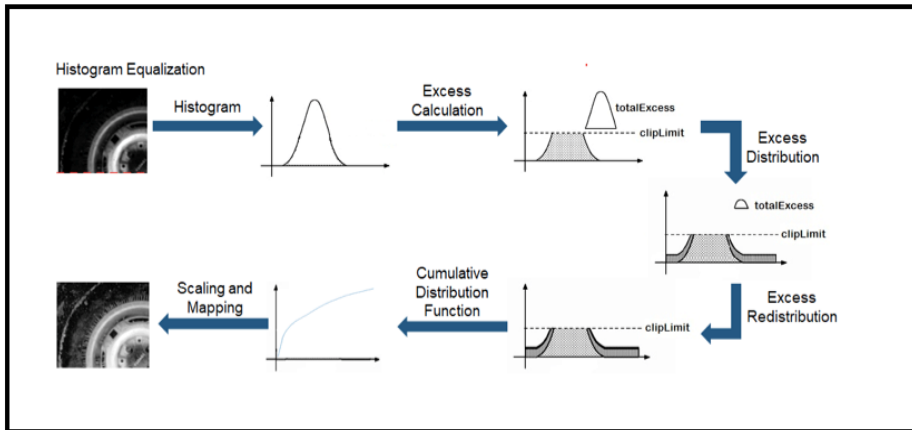
## [6] Contrast Limited Adaptive Histogram Equalization (CLAHE)

CLAHE is a variation of Adaptive histogram equalization (AHE) that prevents contrast over-amplification.

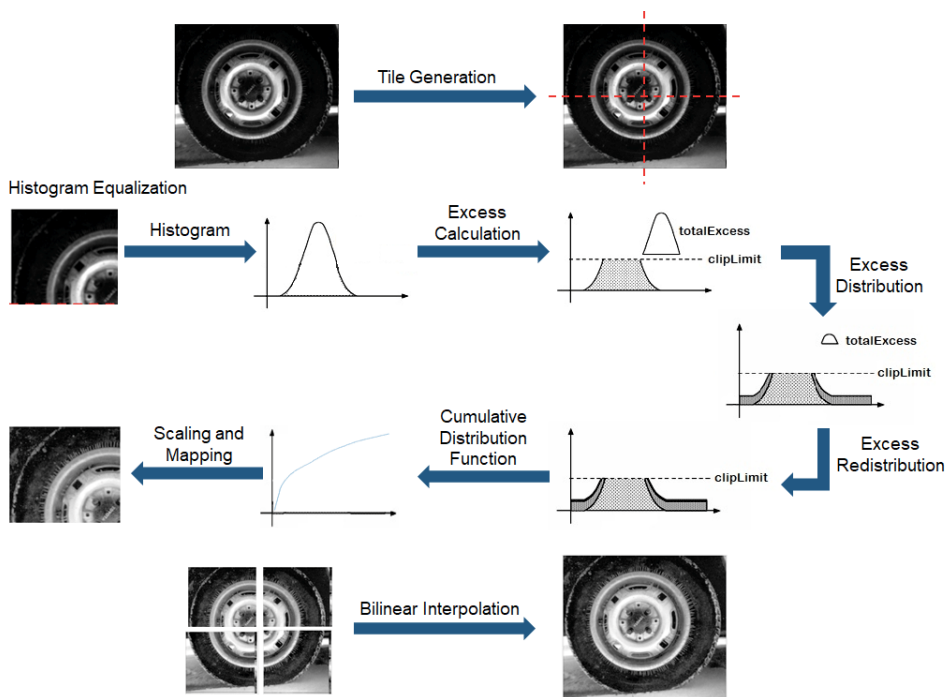
The input image is first divided into sections. Each section is called a tile. The input image is divided into four tiles. Histogram equalization is then performed on each tile using a pre-defined clip limit.

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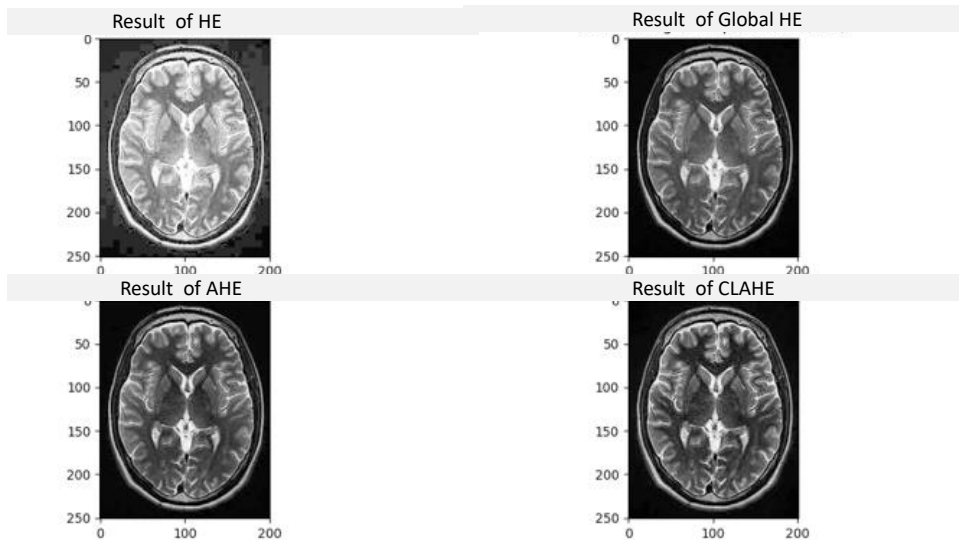
Histogram equalization is then performed on each tile using a pre-defined clip limit.



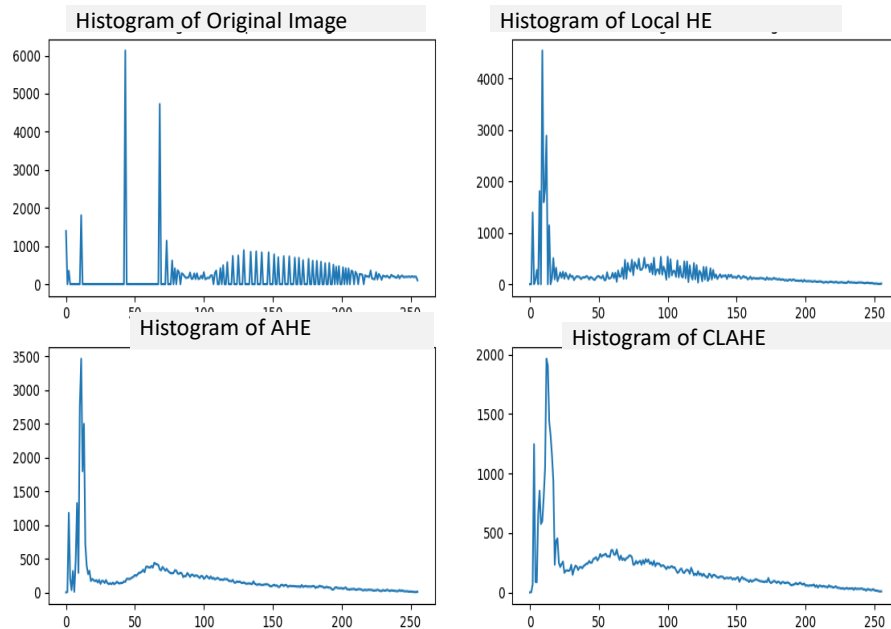
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## Results of HE, Local HE, AHE and CLAHE:



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## [7] Gray Level Grouping (GLG)

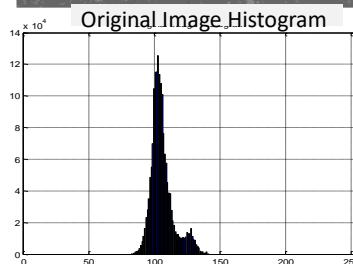
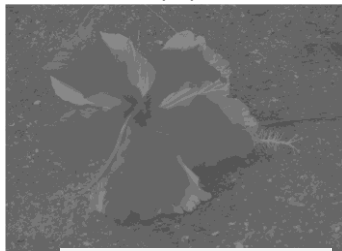
- Group the histogram components into a proper number of gray-level *bins* according to their amplitudes
- This creates empty gray levels on the grayscale
- Redistribute these groups of histogram components *uniformly* over the grayscale.
- The concentrated histogram components spread out and image contrast is increased.
- **The grayscale is utilized efficiently**
- **Over-contrast problem is also avoided.**

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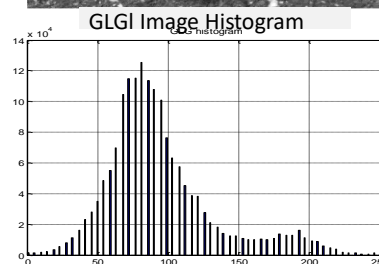
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## Gray Level Grouping (GLG)....

Original Image



GLG Image



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- **Dr. Kiran TALELE** is an Associate Professor in Electronics & Telecommunication Engineering Department of Bharatiya Vidya Bhavans' Sardar Patel Institute of Technology, Mumbai with 33+ years experience in Academics.
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He is also a Head of Sardar Patel Technology Business Incubator, Mumbai.
- His area of research is Digital Signal & Image Processing, Computer Vision, Machine Learning and Multimedia System Design.
- **He has published 85+ research papers at various national & international refereed conferences and journals. He has filed published 12+ patents at Indian Patent Office. One patent is granted in 2021.**
- He is a Treasurer of IEEE Bombay Section and Mentor for Startup Incubation & Intellectual Asset Creation.
- He received incentives for excellent performance in academics and research from Management of S.P.I.T. in 2008-09. He is a recipient of P.R. Bapat IEEE Bombay Section Outstanding Volunteer Award 2019.

