

# Image Processing in Python

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# Image Enhancement



- › No Explicit definition
- › Methods
  - Spatial Domain:
    - Linear
  - › Nonlinear
  - › Frequency Domain:
    - Linear
    - Nonlinear



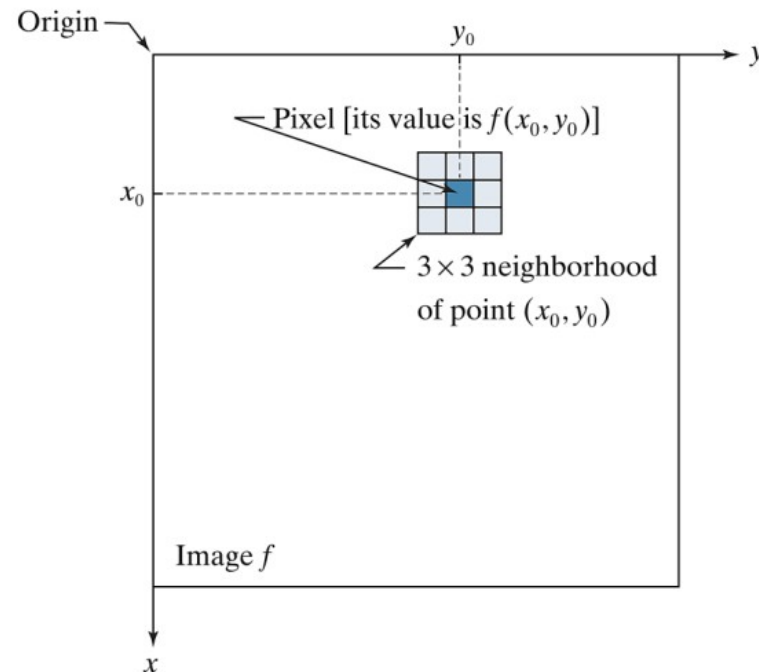
# Image Enhancement



## Spatial Domain Process

› Formulation and Illustration:

$$g(x, y) = T\{f(x, y)\}$$

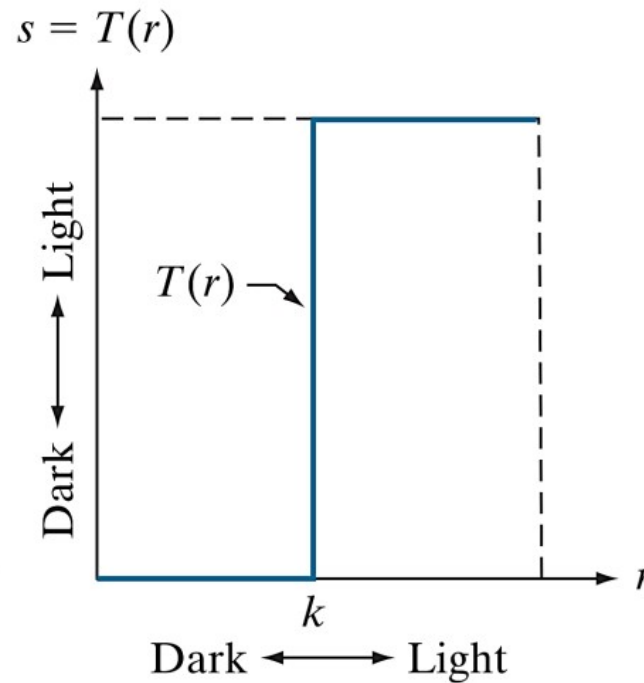
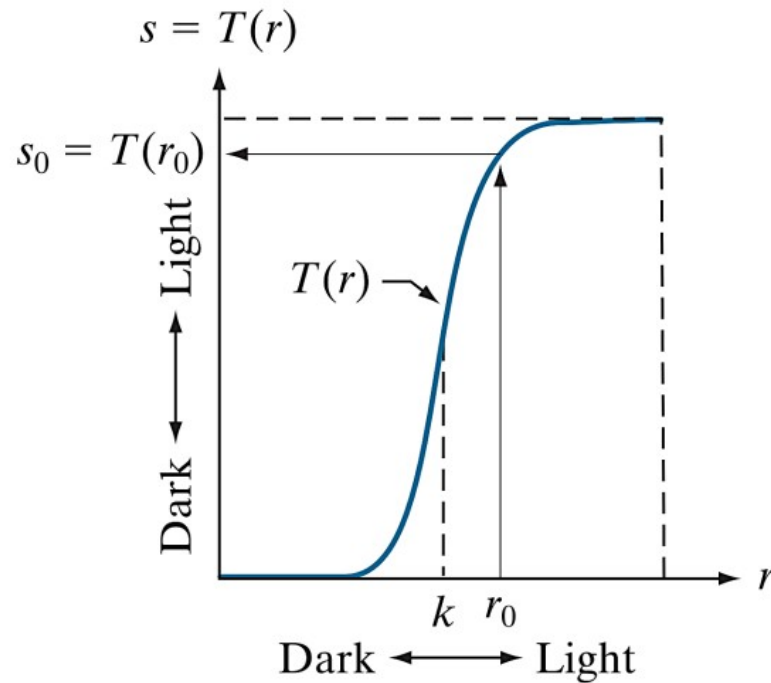


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## Spatial Domain Process

- › For  $1 \times 1$  window,  $s = T(r)$ 
  - Contrast Enhancement/Stretching/Point process



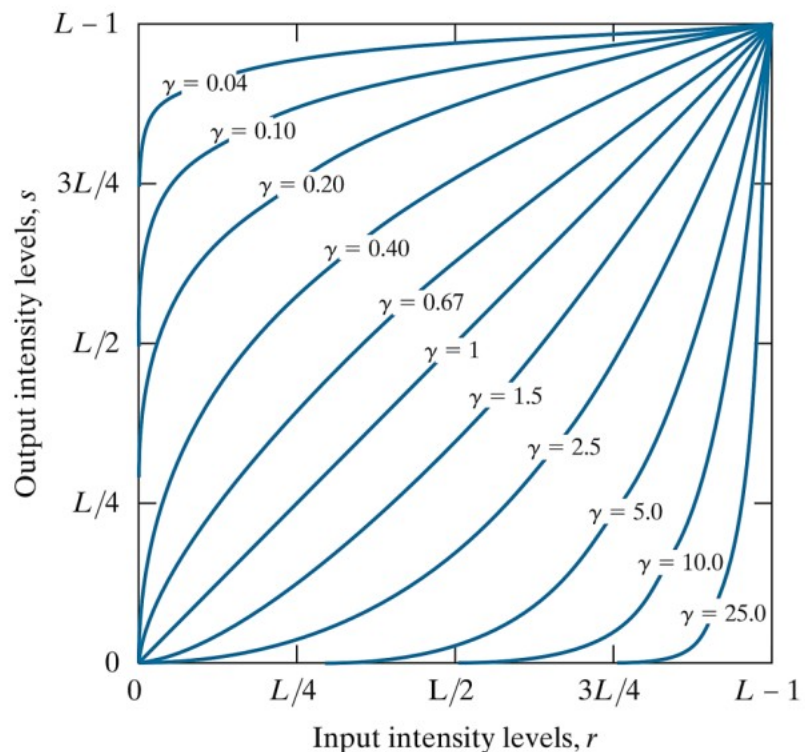
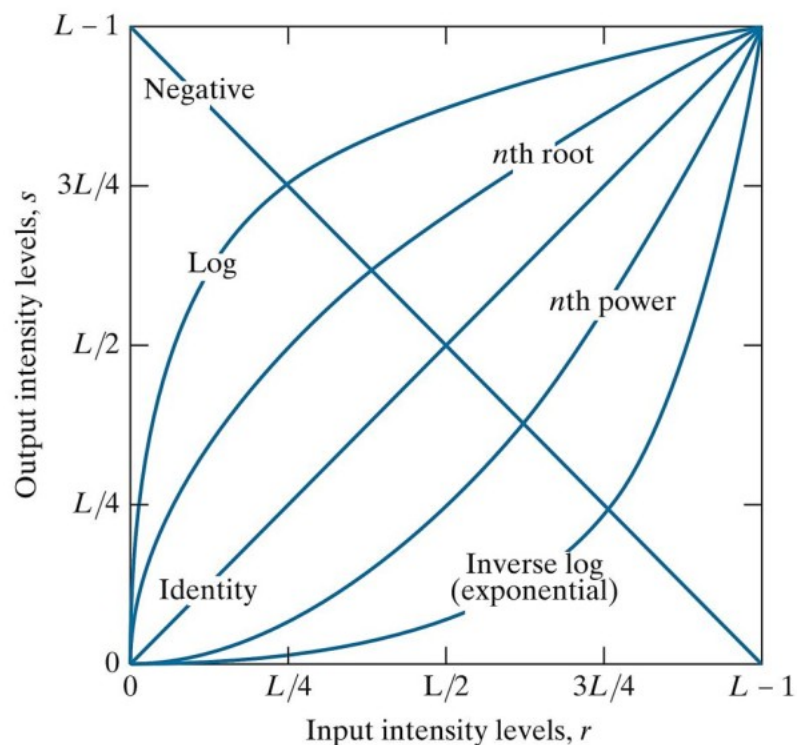


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## Spatial Domain Process

› Gray Level Transformation,  $s = T(r)$



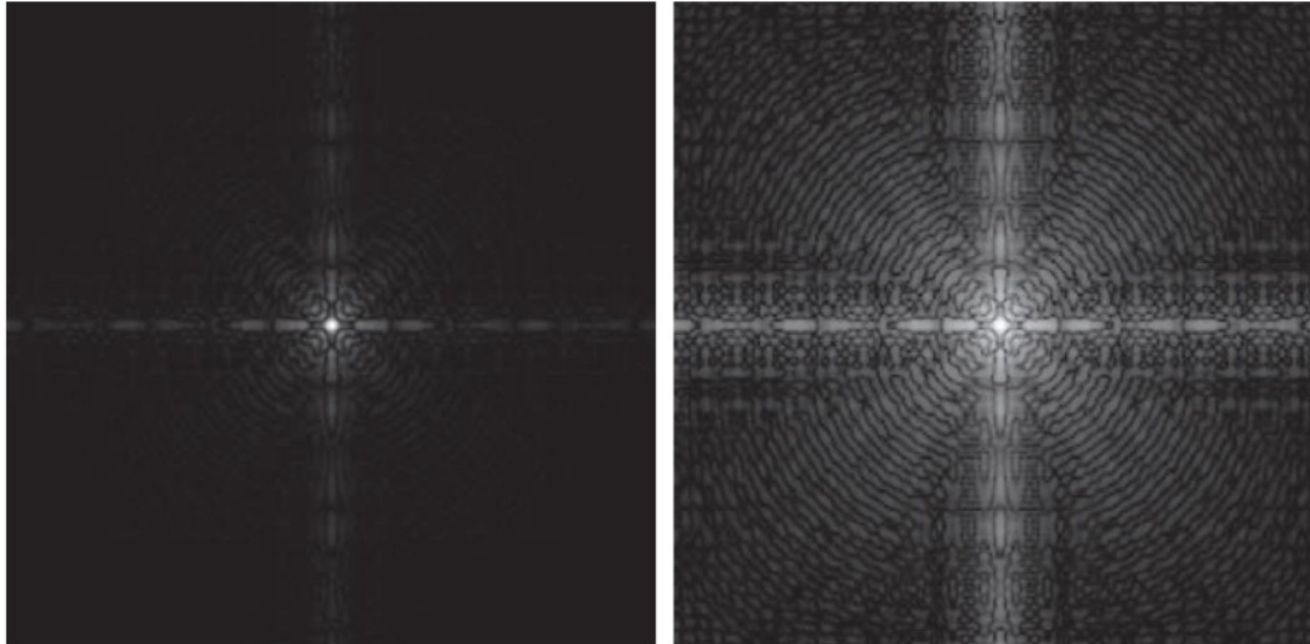
# Image Enhancement



## Spatial Domain Process

› Logarithmic Transformation:

$$s = (L - 1) \frac{\log(r + 1)}{\log(L)}$$



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## Spatial Domain Process

› Power-Law Transformation:

$$s = (L - 1) \left( \frac{r}{L - 1} \right)^\gamma$$



$\gamma = 1.0$



$\gamma = 0.6$



$\gamma = 0.4$



$\gamma = 0.3$

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› Power-Law Transformation:

$$s = (L - 1) \left( \frac{r}{L - 1} \right)^\gamma$$



$\gamma = 1.0$



$\gamma = 3.0$



$\gamma = 4.0$



$\gamma = 5.0$



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› Power-Law Transformation:

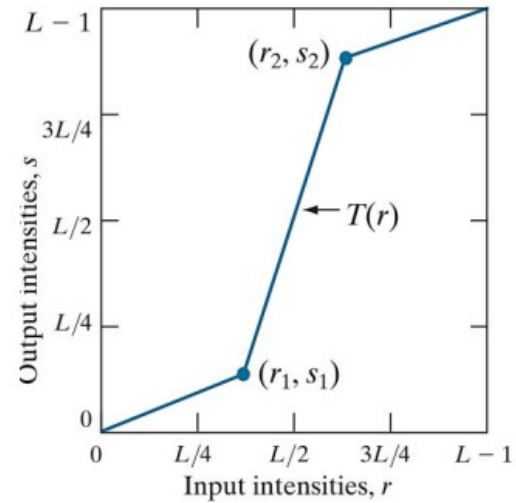
$$s = (L - 1) \left( \frac{r}{L - 1} \right)^\gamma$$



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## › Hand Design Transform



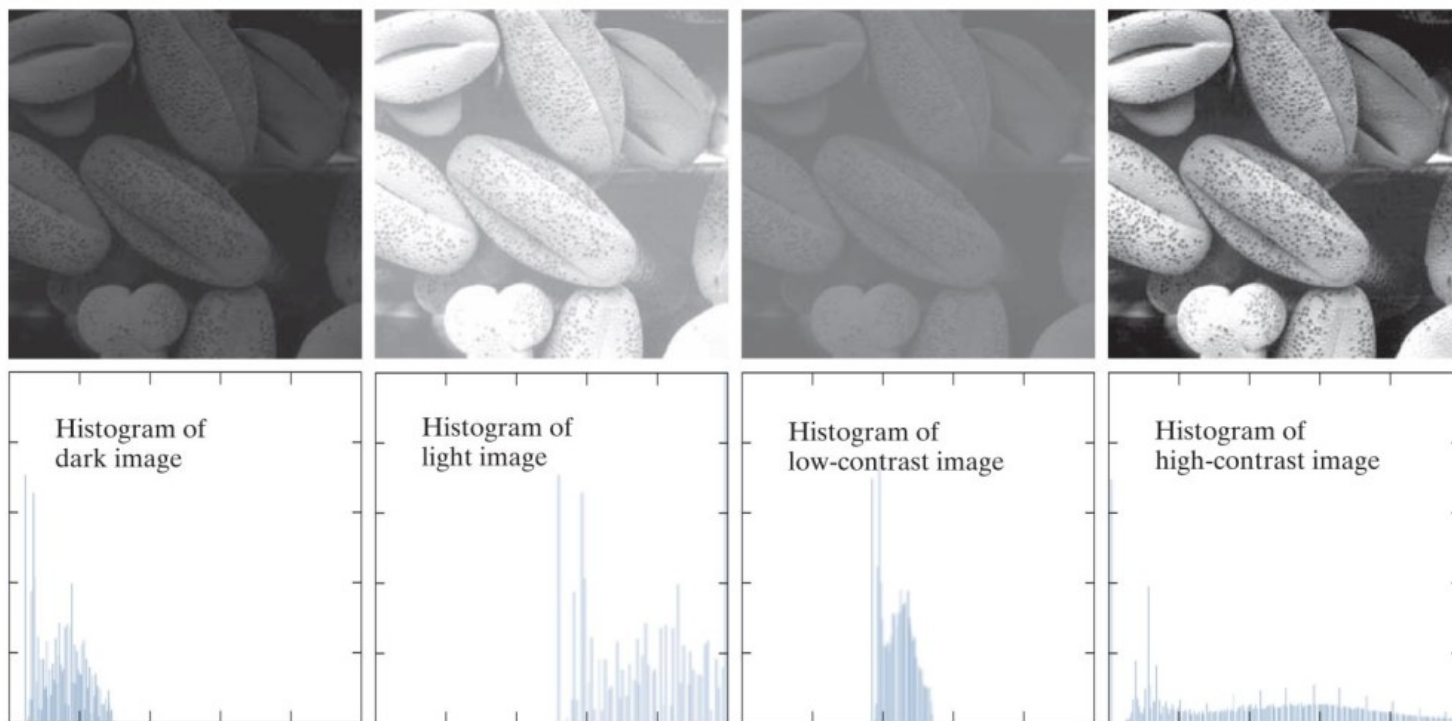
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## Histogram Processing

› Image **Histogram** and **Normalized Histogram**:

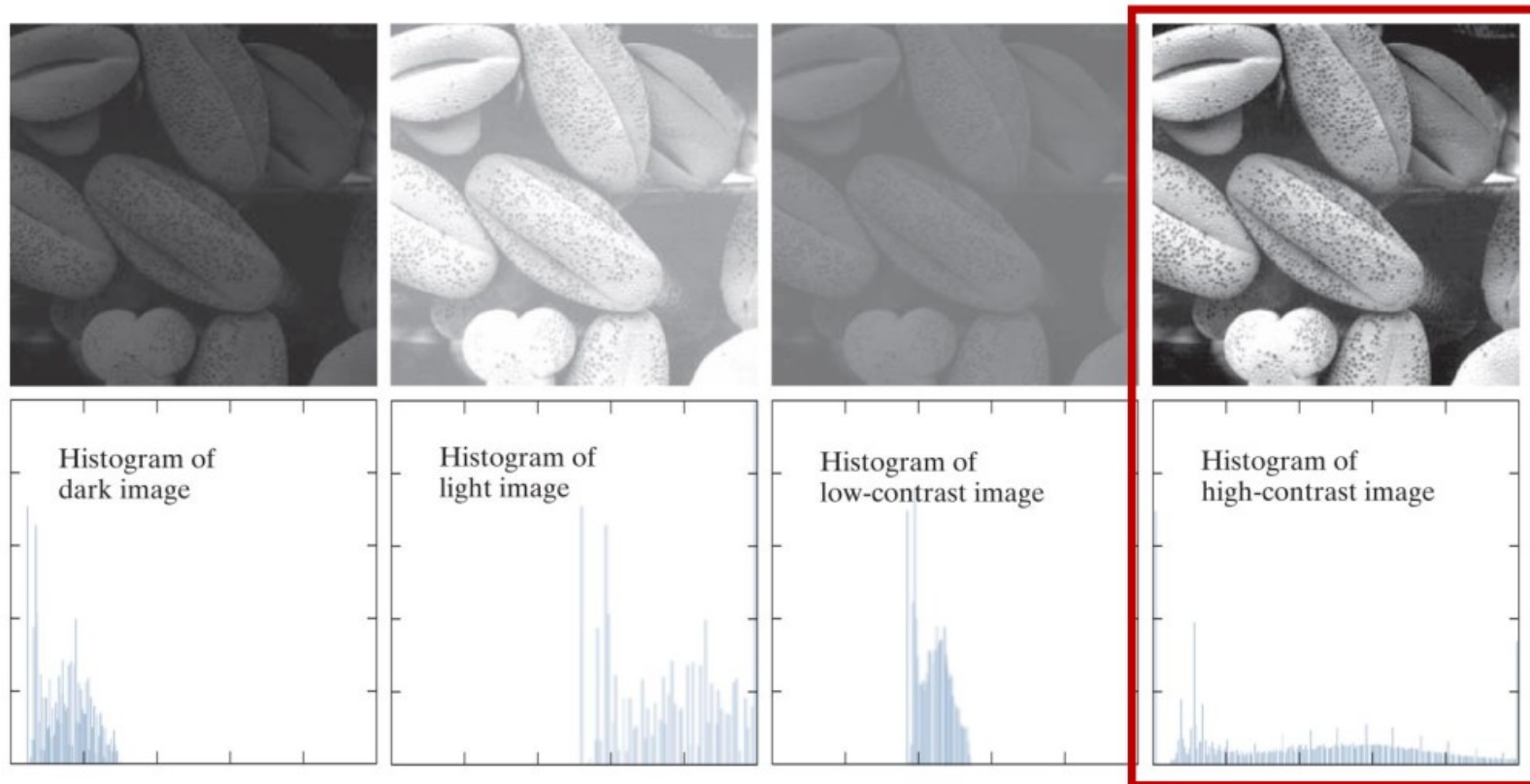
$$› h(r_k) = n_k, \quad k = 0, 1, 2, \dots, L - 1 \Rightarrow p(r_k) = \frac{n_k}{MN}$$



# Image Enhancement



› Effect of histogram on Image quality:

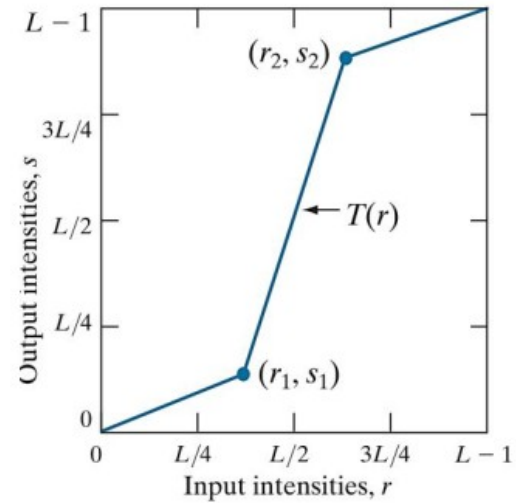




# Image Enhancement



## › Hand Design Transform



# Image Enhancement

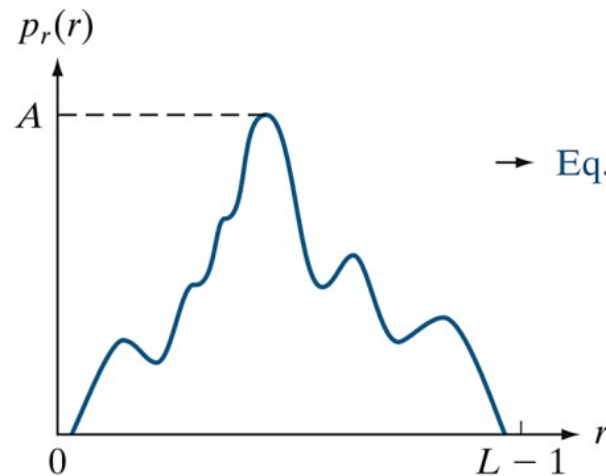


## Histogram Equalization

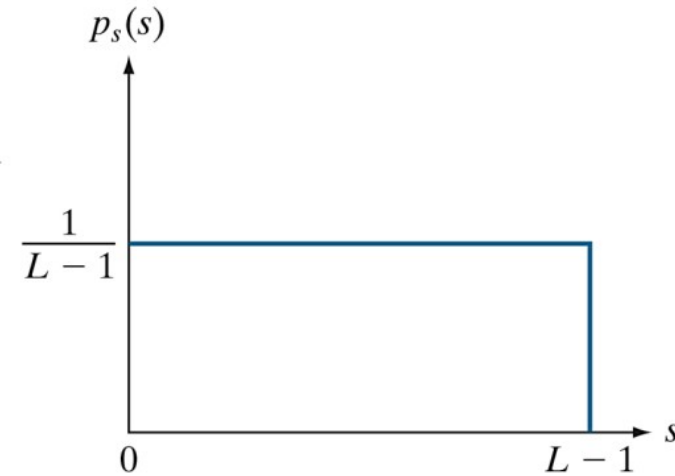
› Continuous case:

$p_r(r) \sim \text{Input Image pdf}$

$$s = T(r) = (L - 1) \int_0^r p_r(w) dw \propto \text{Uni}[0, L - 1]$$



→ Eq. (3-11) →



# Image Enhancement

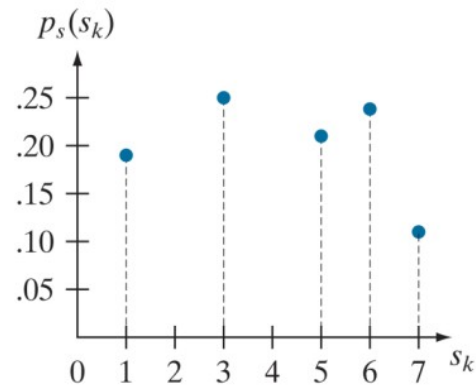
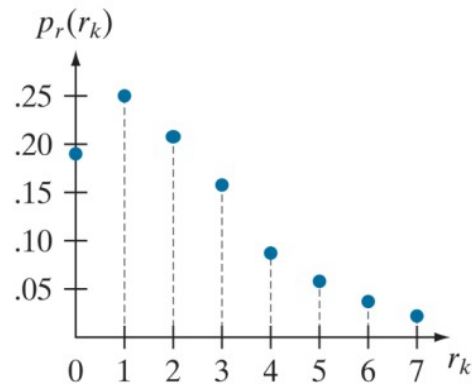


## Histogram Equalization

› Discrete case:

$$p_r(r_k) = \frac{n_k}{MN}$$

$$s = T(r) = (L - 1) \sum_{j=0}^k p_r(r_j) \propto ???$$

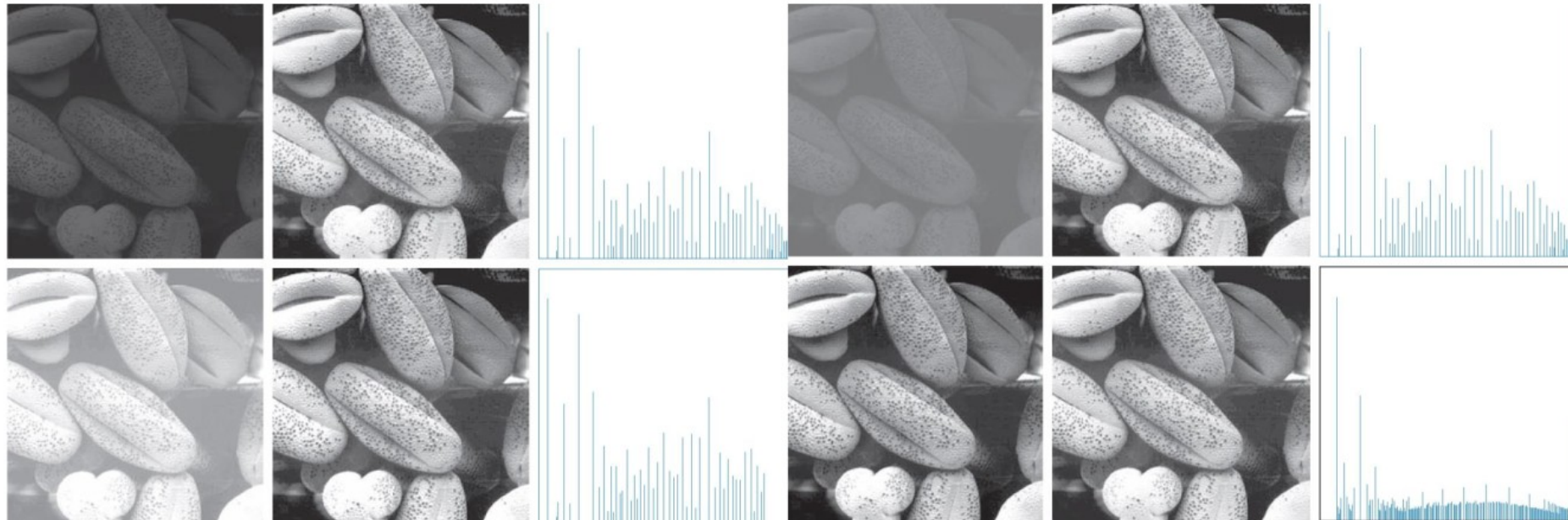


# Image Enhancement



## Histogram Equalization

- › Example:
  - Exact equalization is NOT achieved!







Thank you!