



# Intensity Transforms & Histogram Operations

---

EE551

## Week 2 – Intensity Transforms & Histogram Operations

Ref. chapters 3 – Gonzalez & Woods

2023

---



## In this section...

---

- Pixel-level operations
  - Intensity adjustment (thresholding, contrast adjustment, histogram processing)
-



# Pixel-Level Operations

---

- Addition and subtraction
  - Multiplication and division
    - Watch for overflow or underflow!
  - Use the correct function
  - Logical operations – useful for processing binary images (1 or 0)
-

# Intensity Transformations

---

- There are a number of ways in which we can process the grey-levels of the pixels in an image to achieve desired effects.
  - The goal may be to get a processed image which is visually better, or it may be used as a step in a sequence of operations designed to extract information from an image.
-



# Grey-scale transformations

---

- Input grey-scale  $r \longrightarrow s$ , the output grey-scale

$$s = T(r)$$

- Log transformation – enhances contrast in darker regions.

$$s = c \log(1 + r)$$

- Exponential

$$s = c[(1 + \alpha)^r - 1]$$

- Power law transformation

$$s = cr^\gamma$$

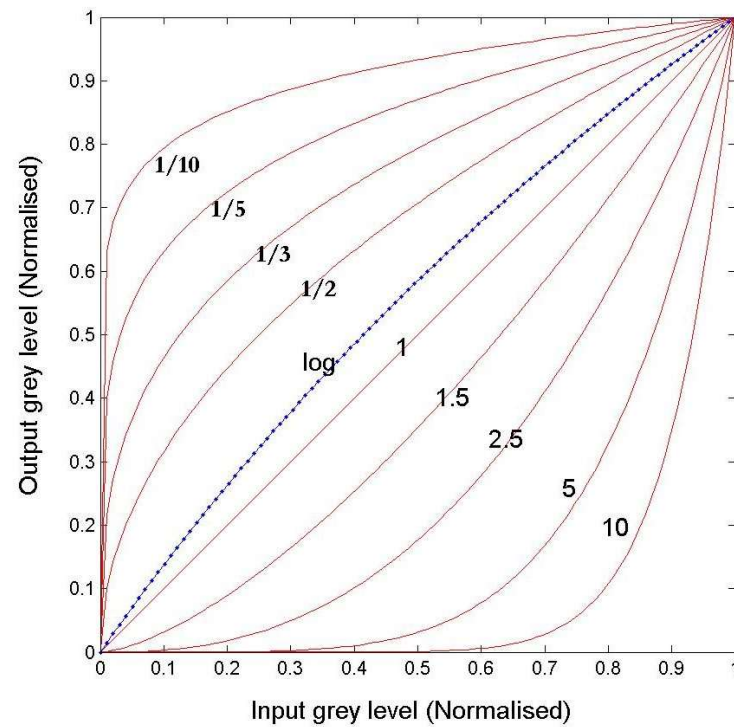
A value  $\gamma < 1$  assigns more grey-scale values to the lower input values, thus increasing the contrast in the darker parts of the image.  
Conversely, a value  $\gamma > 1$  increases the contrast of the brighter regions of the image

---



# Power Law transformation

---





# Power Law transformation

---

Original



$\gamma = 1/3$



**Contrast enhancement of the darker regions.  
Note the increased detail visible in the coat.**

---



# Image Histograms

---

- For a variety of reasons, images sometimes don't have sufficient contrast (e.g. poor quality image sensors, under/over exposure)
  - The simplest way to ascertain this is by visual examination of the image and/or its histogram – this gives the relative population of all the grey levels in the image
-





# Image Histograms

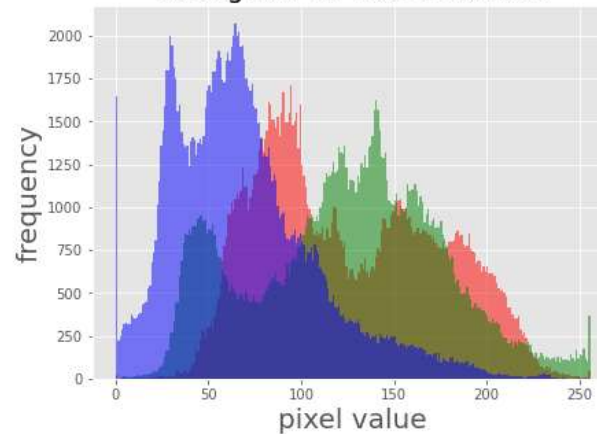
---

- We can consider the histogram as a discrete probability density function determining the likelihood that each grey level is occupied.

Input image



histogram for RGB channels





# Thresholding

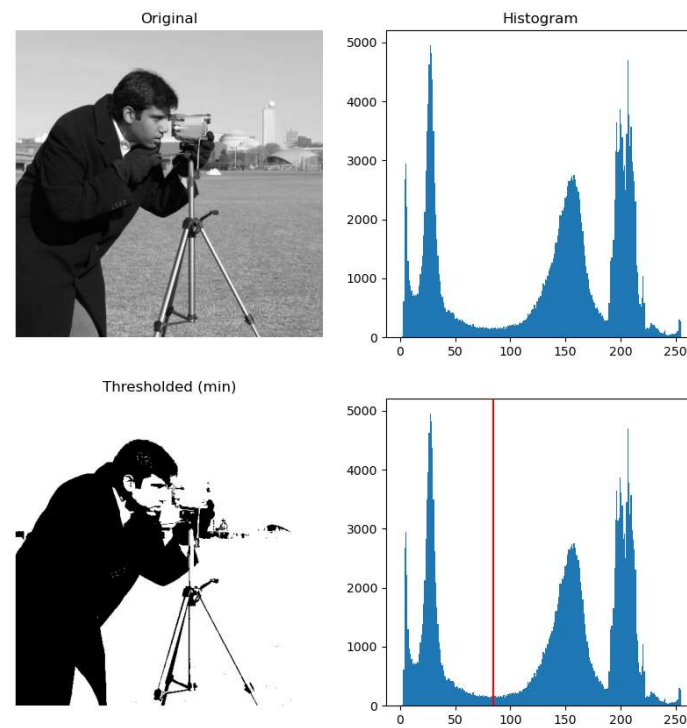
---

- Useful to produce a binary image to delineate objects in a scene (e.g. for segmentation)
  - Histogram can be used to select a threshold for producing a binary image
  - Automatic threshold
  - Adaptive threshold
    - Based on “local statistics” in the region of the pixel of interest
-



# Thresholding

---





# Thresholding example – fixed threshold

---

original image



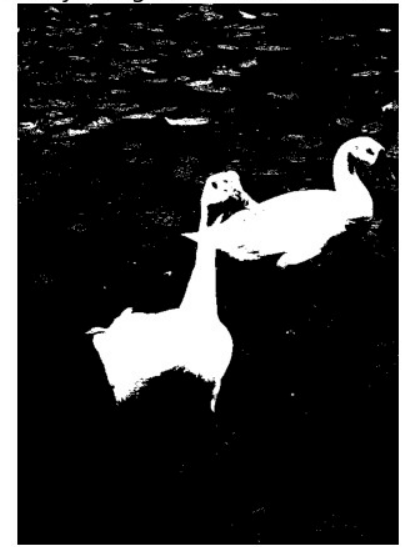
binary image with threshold=100



binary image with threshold=150



binary image with threshold=200





# Half-toning

---

- In the previous slide, you may have noticed that the binary images obtained with different gray-level thresholds are not shaded properly –resulting in an artifact known as *false contours*
  - False contours are a problem in printing – e.g. a black and white newspaper print is a binary image, generated with black dots on a white background. False contours would not be acceptable for black and white printing
  - One way to limit the impact of contouring is to add uniformly distributed white noise to the image prior to quantization. This is called *half-toning*
-





# Half-toning

---

original image (with noise)



binary image with threshold=100



binary image with threshold=150



binary image with threshold=200





## Contrast stretching

---

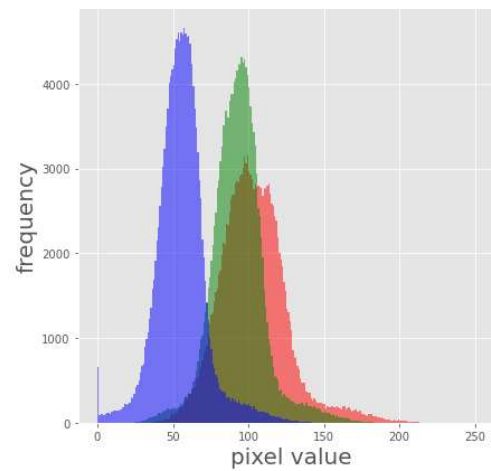
- A simple technique that effectively assigns all the permissible grey levels to the dominant region of the histogram.
  - Makes the image use more of the dynamic range of the image.
  - In simple terms, this involves scaling pixel values according to the actual and desired dynamic ranges
  - Simple approach just looks at the max and min pixel values of the input image – but this is sensitive to outliers
  - Better to look at some statistics of the input image
-



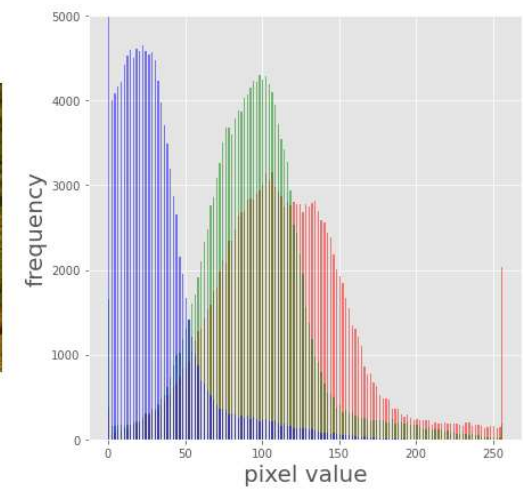
# Contrast Stretching

---

Before Contrast Stretch



After Contrast Stretch







# Histogram Equalisation

---

- This is a more sophisticated technique which attempts to transform the distribution of input grey levels to an output distribution which conforms to a flat profile
  - The probability of all grey levels being occupied is equal.
  - This increases the global contrast.
-



# Histogram Equalisation

---

original input (earth from sky)



after histogram equalization





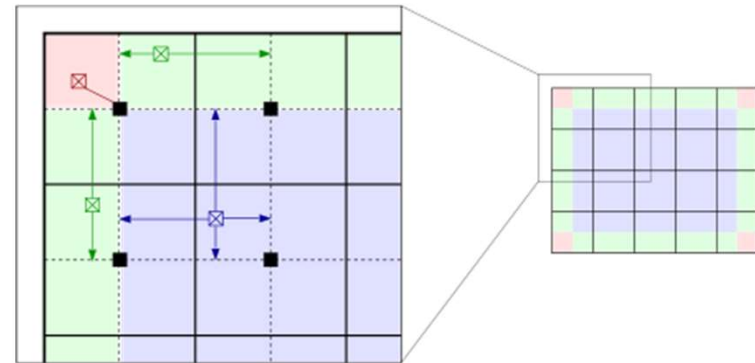
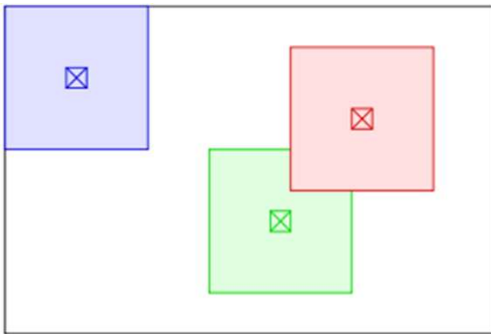
# Histogram Equalisation

---

- Although a powerful and useful technique, it is limited.
  - Histogram equalisation takes no account of the nature of the image (a car, a desert scene, ....), or any specific “areas of interest” in the image
  - Often it is local contrast that we want to improve
  - This is where adaptive histogram equalization has advantages
-



# Adaptive Histogram Equalization – local histograms, weighted combination

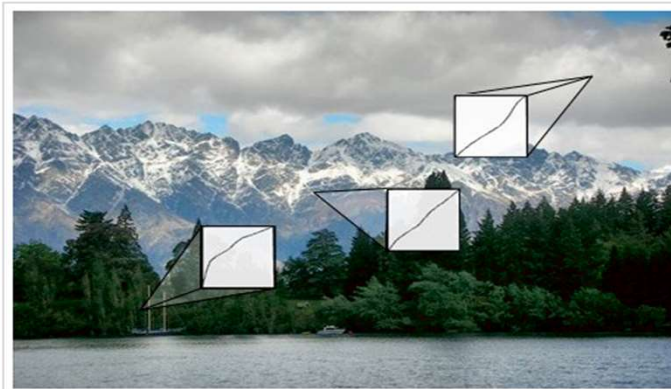


Single adjustment curve applied

Show adjustment curve

Iridix result

Show Iridix local adjustments



Single adjustment curve applied

Show adjustment curve

Iridix result

Show Iridix local adjustments



# Adaptive Histogram Equalisation

---

original input (earth from sky)



after histogram equalization



after adaptive histogram equalization







# Adaptive Histogram Equalisation

original input (earth from sky)



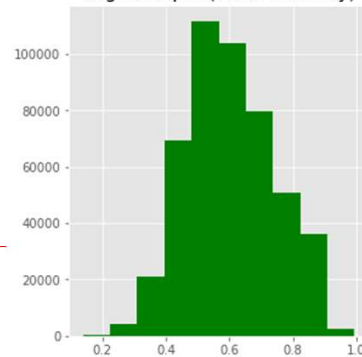
after histogram equalization



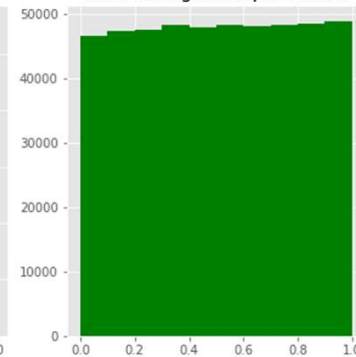
after adaptive histogram equalization



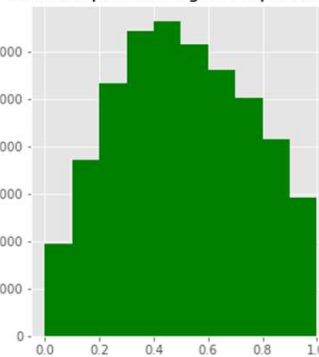
original input (earth from sky)



after histogram equalization



after adaptive histogram equalization





# Histogram Matching

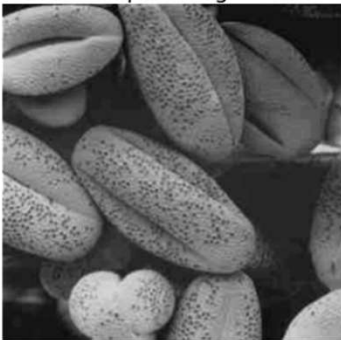
---

- Given the original (input) image and its corresponding histogram, we seek to effect a transformation on the input intensity values such that the transformed (output) image has a desired histogram.
  - Sometimes the desired histogram profile is taken from another (“reference”) image, or other use case constraints e.g. biometric application where there is a known uneven illumination that must be compensated for
-



# Histogram matching

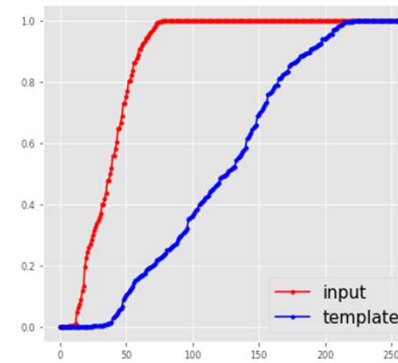
Input image



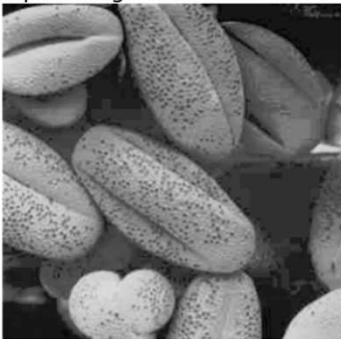
Template image



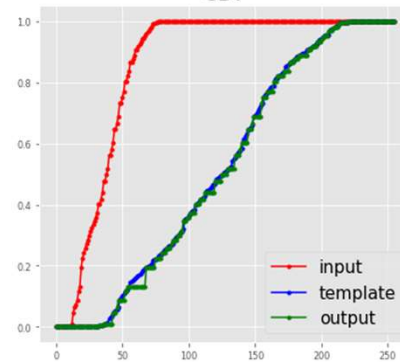
CDF



Output image with Hist. Matching



CDF







# Handling Colour Images

---

- We need to focus on the intensity (brightness) of the image, not its colour
  - Transform an RGB image to an alternative colour space where we can isolate the intensity
  - Transform from RGB to (e.g.) HSV space
  - Perform histogram equalisation on the V dimension of the HSV image
  - Transform back to the RGB colour space
  - This topic will be covered in more detail during the Colour Image Processing section of this module
-



NUI Galway  
OÉ Gaillimh

---

# Questions?

---