

Lecture 9

Introduction to Image Processing

UTAS
Sultanate of Oman
September 2022

CSSY2201 : Introduction to Cryptography

1 Measuring Image Difference

What is an Image ?

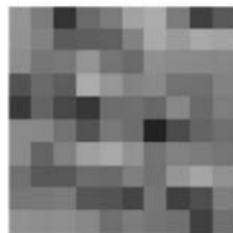
2-dimensional matrix of Intensity (gray or color) values

Set of Intensity values

$$I(u, v) \in \mathbb{P}$$

Image coordinates
are integers

$$u, v \in \mathbb{N}.$$



$$F(x, y)$$

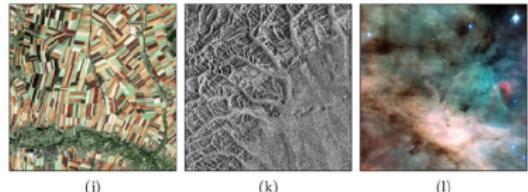
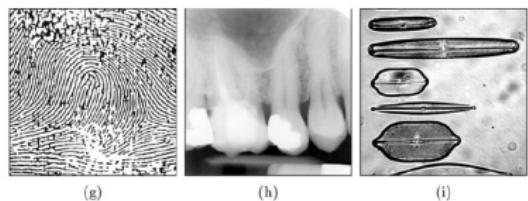
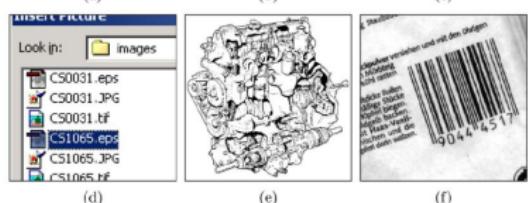
148	123	52	107	123	162	172	123	64	89	...
147	130	92	95	98	130	171	155	169	163	...
141	118	121	148	117	107	144	137	136	134	...
82	106	93	172	149	131	138	114	113	129	...
57	101	72	54	109	111	104	135	106	125	...
138	135	114	82	121	110	34	76	101	111	...
138	102	128	159	168	147	116	129	124	117	...
113	89	89	109	106	126	114	150	164	145	...
120	121	123	87	85	70	119	64	79	127	...
145	141	143	134	111	124	117	113	64	112	...
:	:	:	:	:	:	:	:	:	:	⋮

$$I(u, v)$$

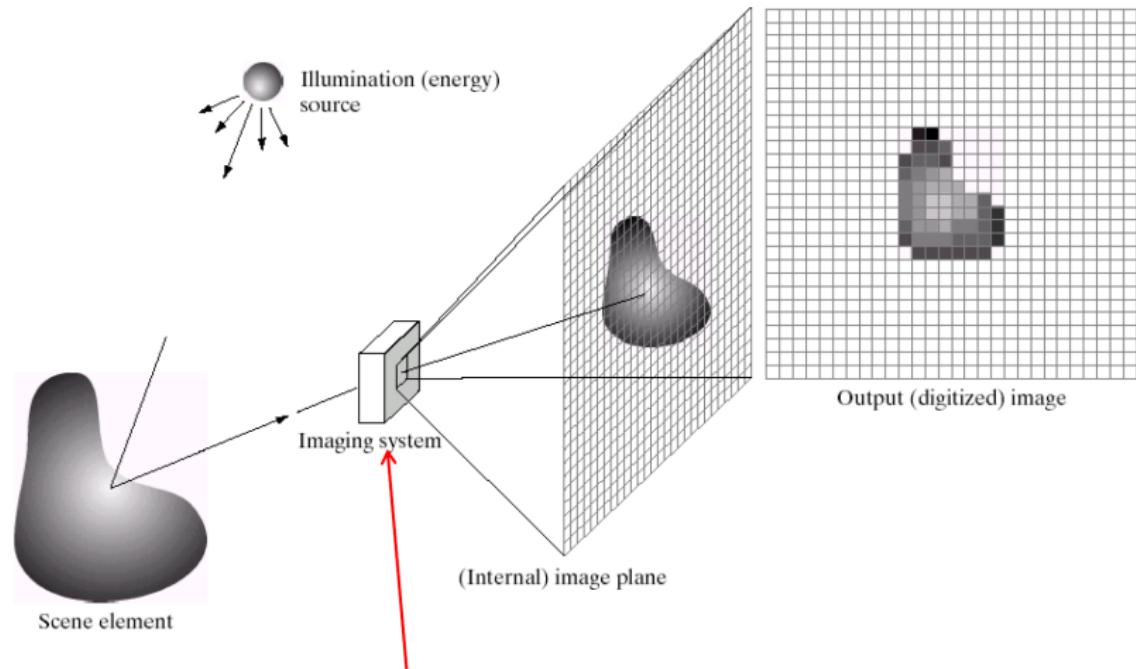


Example of Digital Images

- (a) Natural landscape
- (b) Synthetically generated scene
- (c) Poster graphic
- (d) Computer screenshot
- (e) Black and white illustration
- (f) Barcode
- (g) Fingerprint
- (h) Microscope slide
- (i) Radar image
- (j) Astronomical object



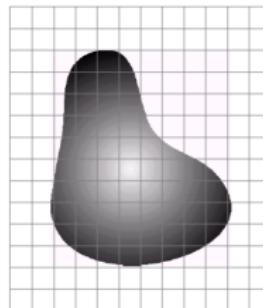
Imaging System



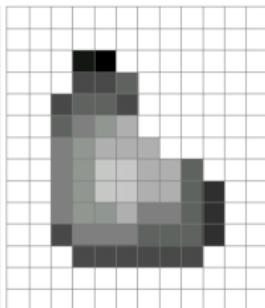
Example: a camera
Converts light to image

Digital Image ?

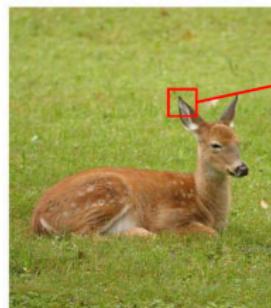
- Remember: *digitization* causes a digital image to become an *approximation* of a real scene



Real image



Digital Image
(an approximation)



Real image



Digital Image
(an approximation)

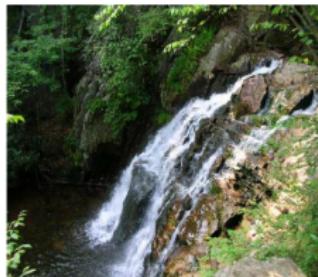
Digital Image

Common image formats include :

- 1 values per point/pixel (B&W or Grayscale)
- 3 values per point/pixel (Red, Green, and Blue)
- 4 values per point/pixel (Red, Green, Blue, + "Alpha" or Opacity)



Grayscale



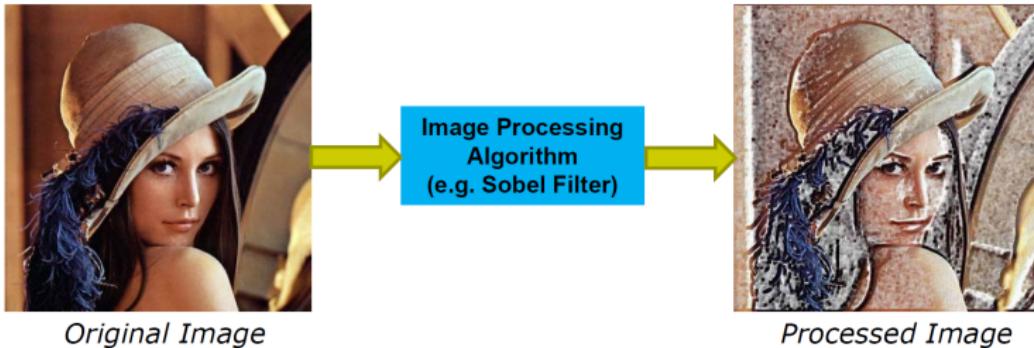
RGB



RGBA

What is image Processing ?

- Algorithms that alter an input image to create new image
- Input is image, output is image



- Improves an image for human interpretation in ways including :
 - Image display and printing
 - Image editing
 - Image enhancement
 - Image compression

Example Operation : Noise Removal

Noisy Image

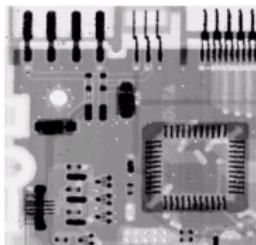
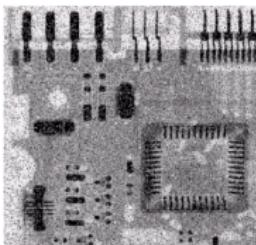
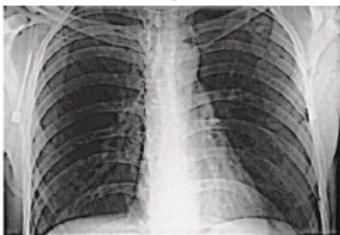


Denoised Image



Think of noise as white specks on a picture (random or non-random)

Example Operation : Noise Removal



Example : Contrast Adjustment



Low Contrast



Original Contrast

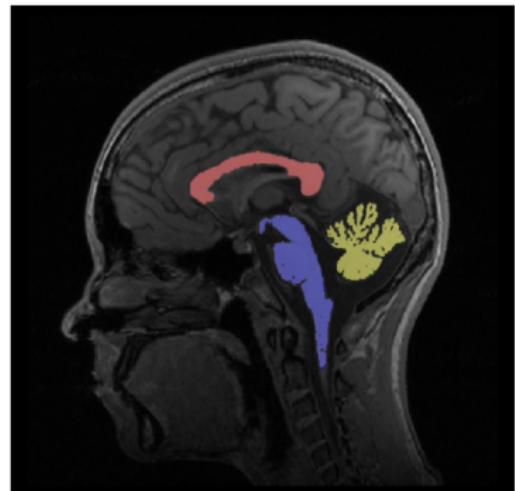
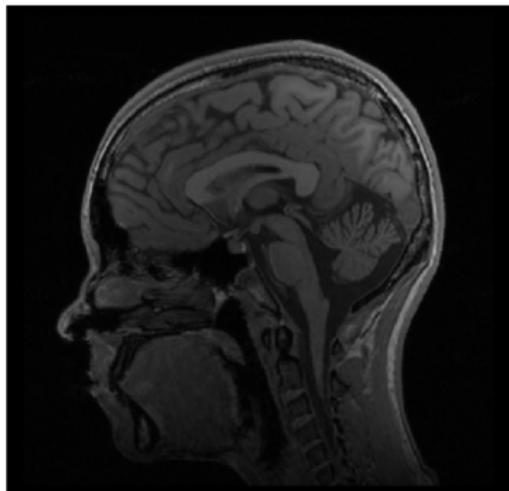


High Contrast

Example : Edge Detection



Example : Region Detection, Segmentation



Example : Image Compression



Original, 2.1MB



JPEG Compression, 308KB (15%)

Example : Image Inpainting

Damaged Image



Restored Image

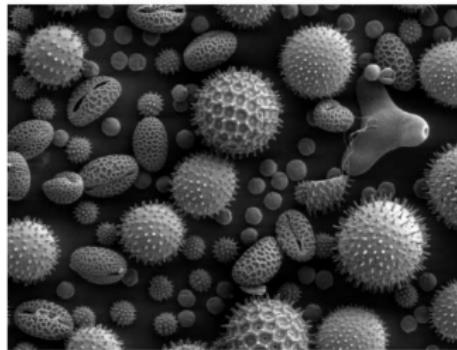


Credit: M. Bertalmio, G. Sapiro, V. Caselles, C. Ballester: *Image Inpainting*, SIGGRAPH 2000

Inpainting? Reconstruct corrupted/destroyed parts of an image

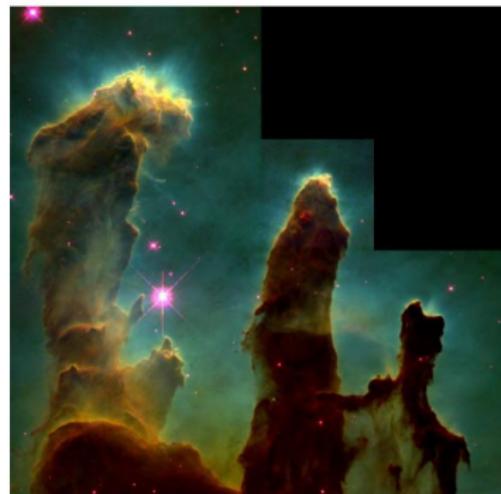
Applications of Image Processing

Biology



Credit: Dartmouth Electron Microscopy Facility

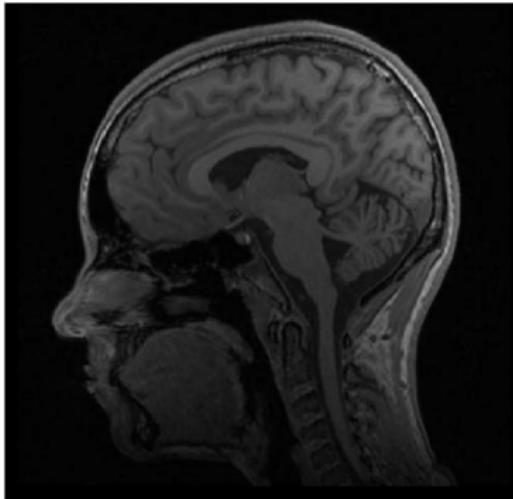
Astronomy



Credit: NASA, Jeff Hester, and Paul Scowen (Arizona State)
[More info here](#)

Applications of Image Processing

Medicine



Credit: Dr. Janet Lainhart, UofU Psychiatry

Security, Biometrics



Satellite Imagery



Credit: NASA

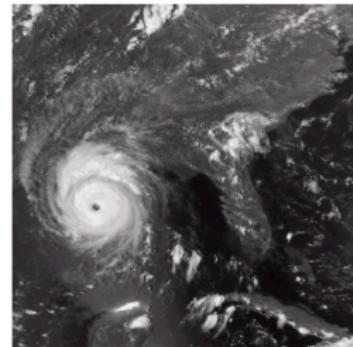
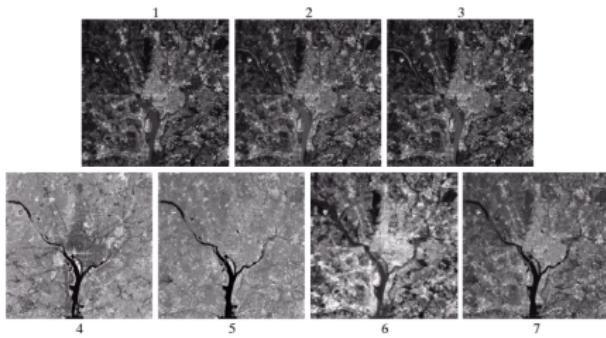
Personal Photos



Credit: Tom Fletcher

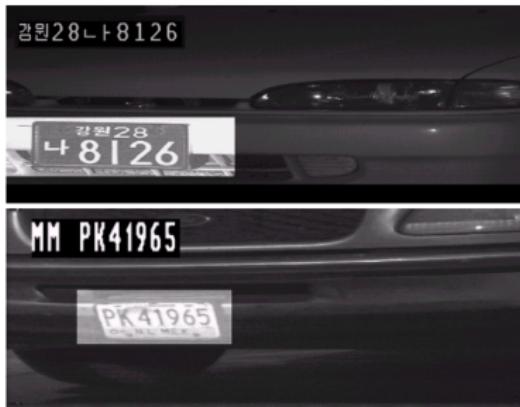
Applications of Image Processing : Geographic Information Systems (GIS)

- Terrain classification
- Meteorology (weather)



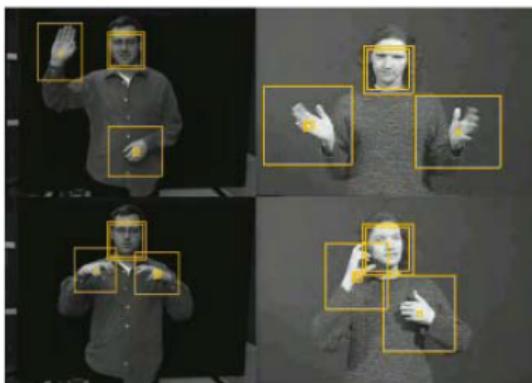
Applications of Image Processing : Law Enforcement

- Number plate recognition for speed cameras or automated toll systems
- Fingerprint recognition



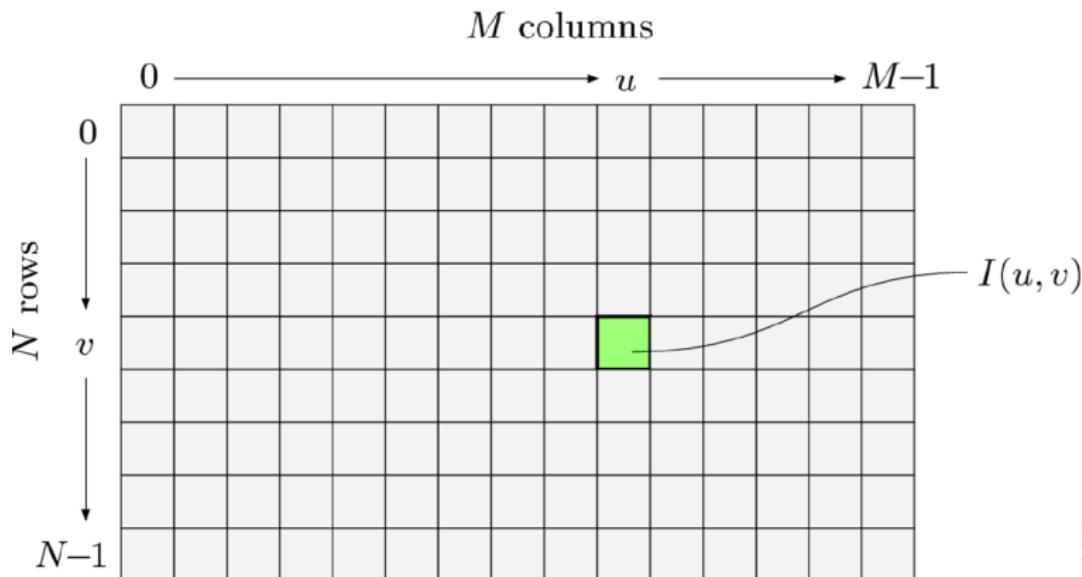
Applications of Image Processing : HCI

- Face recognition
- Gesture recognition



Representing Images

- Image data structure is 2D array of pixel values
- Pixel values are gray levels in range 0-255 or RGB colors
- Array values can be any data type (bit, byte, int, float, double, etc.)

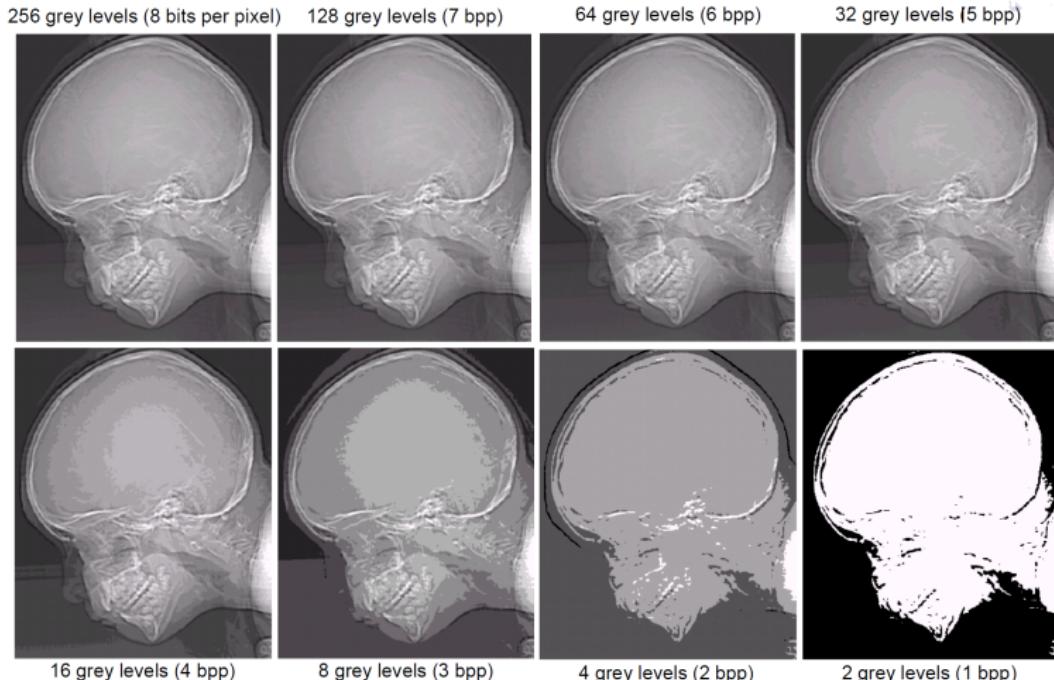


Intensity Level Resolution

- Intensity level resolution : number of intensity levels used to represent the image
 - The more intensity levels used, the finer the level of detail discernable in an image
 - Intensity level resolution usually given in terms of number of bits used to store each intensity level

Number of Bits	Number of Intensity Levels	Examples
1	2	0, 1
2	4	00, 01, 10, 11
4	16	0000, 0101, 1111
8	256	00110011, 01010101
16	65,536	1010101010101010

Intensity Level Resolution



Resolution : How Much Is Enough ?



- **Example:** Picture on right okay for counting number of cars, but not for reading the number plate

Image File Formats

- Hundreds of image file formats. Examples
 - Tagged Image File Format (TIFF)
 - Graphics Interchange Format (GIF)
 - Portable Network Graphics (PNG)
 - PEG, BMP, Portable Bitmap Format (PBM), etc
- Image pixel values can be
 - Grayscale : 0 - 255 range
 - Binary : 0 or 1
 - Color : RGB colors in 0-255 range (or other color model)
 - Application specific (e.g. floating point values in astronomy)

How many Bits Per Image Element?

Grayscale (Intensity Images):

Chan.	Bits/Pix.	Range	Use
1	1	0...1	Binary image: document, illustration, fax
1	8	0...255	Universal: photo, scan, print
1	12	0...4095	High quality: photo, scan, print
1	14	0...16383	Professional: photo, scan, print
1	16	0...65535	Highest quality: medicine, astronomy

Color Images:

Chan.	Bits/Pix.	Range	Use
3	24	[0...255] ³	RGB, universal: photo, scan, print
3	36	[0...4095] ³	RGB, high quality: photo, scan, print
3	42	[0...16383] ³	RGB, professional: photo, scan, print
4	32	[0...255] ⁴	CMYK, digital prepress

Special Images:

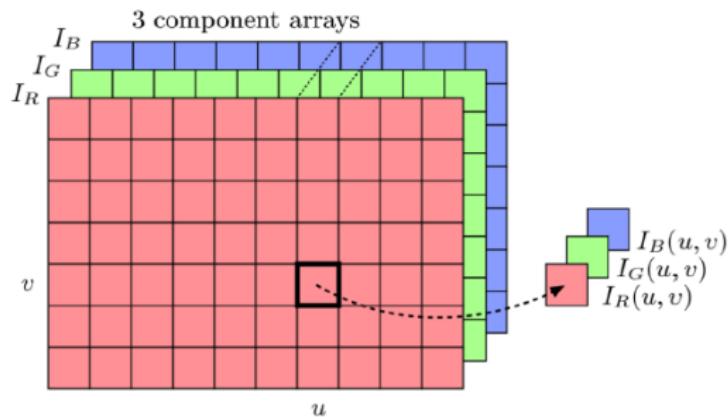
Chan.	Bits/Pix.	Range	Use
1	16	-32768...32767	Whole numbers pos./neg., increased range
1	32	$\pm 3.4 \cdot 10^{38}$	Floating point: medicine, astronomy
1	64	$\pm 1.8 \cdot 10^{308}$	Floating point: internal processing

Organization of Color Images

- True color : Uses all colors in color space
 - used in applications that contain many colors with subtle differences
 - E.g. digital photography or photorealistic rendering
- Indexed color : Uses only some colors
 - Which subset of colors to use ? Depends on application

True Color

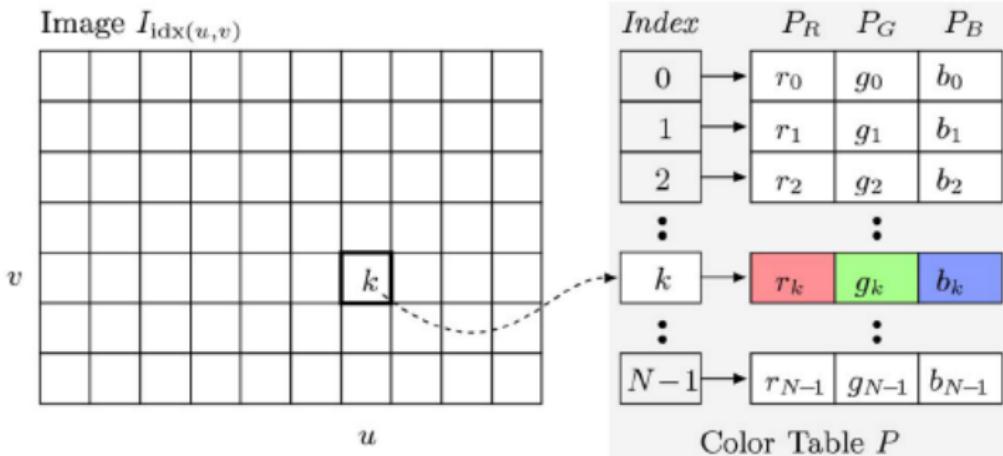
- Colors in 3 separate arrays of similar length
- Retrieve same location (u, v) in each R, G and B array



$$\begin{pmatrix} R \\ G \\ B \end{pmatrix} \leftarrow \begin{pmatrix} I_R(u, v) \\ I_G(u, v) \\ I_B(u, v) \end{pmatrix}$$

Indexed Images

- Permit only limited number of distinct colors ($N = 2$ to 256)
- Used in illustrations or graphics containing large regions with same color
- Instead of intensity values, image contains indices into color table or palette
- Palette saved as part of image
- Converting from true color to indexed color requires quantization

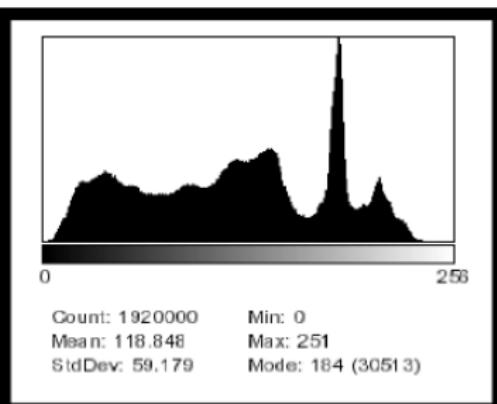


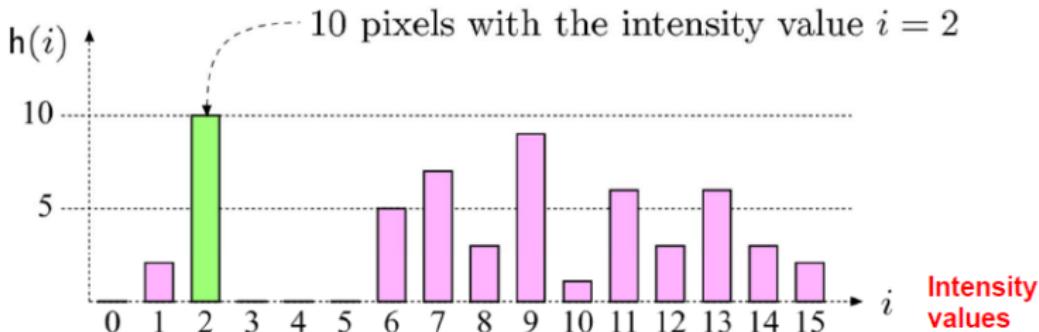
color images

- RGB full-color images (24-bit "RGB color"),
 - packed order
 - Supports TIFF, BMP, JPEG, PNG and RAW file formats
- Indexed images ("8-bit color")
 - Up to 256 colors max (8 bits)
 - Supports GIF, PNG, BMP and TIFF (uncompressed) file formats

Histograms

- Histograms plots how many times (frequency) each intensity value in image occurs
- Example :
 - Image (left) has 256 distinct gray levels (8 bits)
 - Histogram (right) shows frequency (how many times) each gray level occurs

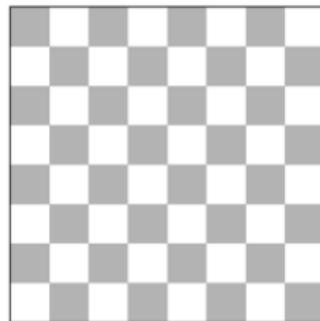
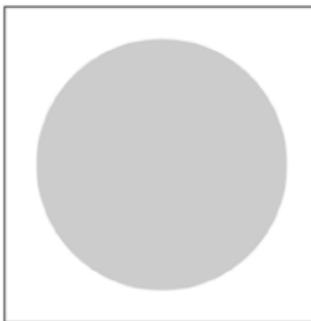




$h(i)$	0	2	10	0	0	0	5	7	3	9	1	6	3	6	3	2
i	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15

- E.g. $K = 16$, 10 pixels have intensity value = 2
- Histograms : only statistical information
- No indication of location of pixels

- Different images can have same histogram
- 3 images below have same histogram



- Half of pixels are gray, half are white
 - Same histogram = same statistics
 - Distribution of intensities could be different
- Can we reconstruct image from histogram ? No !

- So, a histogram for a grayscale image with intensity values in range

$$I(u, v) \in [0, K - 1]$$

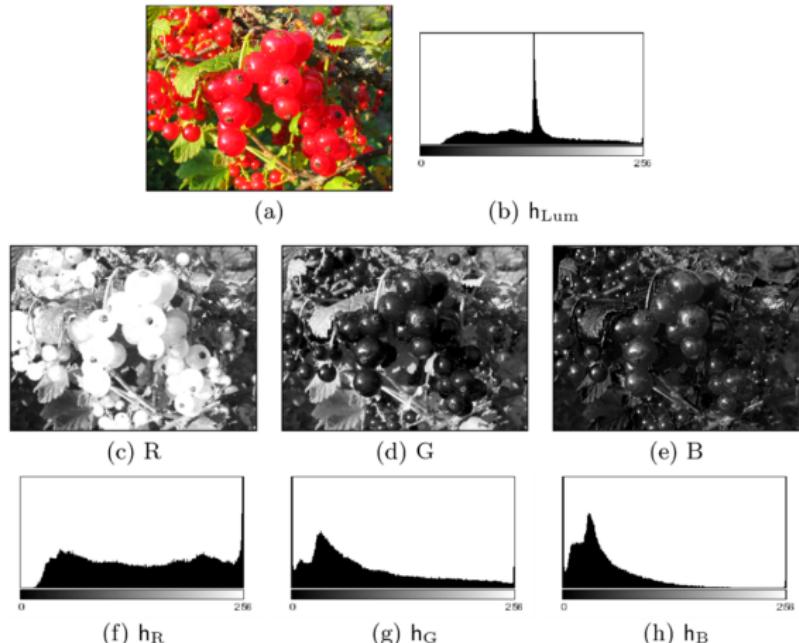
would contain exactly K entries

- E.g. 8-bit grayscale image, $K = 2^8 = 256$
- Each histogram entry is defined as :
 $h(i) = \text{number of pixels with intensity } i$
- E.g : $h(255) = \text{number of pixels with intensity 255}$
- formal definition : $h(i) = \text{card}\{(u, v) | I(u, v) = i\}$

Color Image Histograms

Two types :

- 1 Intensity histogram :
 - Convert color image to gray scale
 - Display histogram of gray scale
- 2 Individual Color Channel Histograms : 3 histograms (R,G,B)



PSNR and MSE

- Peak Signal to Noise Ratio (PSNR) is an engineering formulation determined through mean square error (MSE). It is generally utilized for image quality evaluation as follows :

$$PSNR = 10 \log_{10} \frac{d^2}{MSE}$$

where

$$MSE = \frac{1}{M \times N} \sum_{i=1}^M \sum_{j=1}^N (X(i,j) - Y(i,j))^2$$

- d stands for the maximal intensity value that can be taken. for example in a gray scale image $d = 255$.
- M and N are the height and width of the images.
- To use PSNR and MSE, the two compared images should be with the same dimensions.
- values of PSNR between 30 dB and 40 dB (decibels) indicate that images are very similar.



NPCR

Number of Pixels Change Rate (NPCR) :

$$NPCR = \frac{\sum_{i=1}^M \sum_{j=1}^N D(i,j)}{M \times N} \times 100\%$$

M and N are the height and width of the images

$$D(i,j) = \begin{cases} 0 & \text{if } S(i,j) = S'(i,j) \\ 1 & \text{if } S(i,j) \neq S'(i,j) \end{cases}$$

$S(i,j)$ and $S'(i,j)$ are the values of pixels.

for two random images : $NPCR = 99.609375\%$

Unified Average Changing Intensity (UACI) :

$$UACI = \frac{1}{M \times N} \left(\sum_{i=1}^M \sum_{j=1}^N \frac{|S(i,j) - S'(i,j)|}{2^B - 1} \right) \times 100\%$$

M and N are the height and width of the images.

$S(i,j)$ and $S'(i,j)$ are the values of pixels.

and B is the intensity level (E.g for a gray scale image $B = 8$).

For two random images : $UACI = 33.46354\%$