



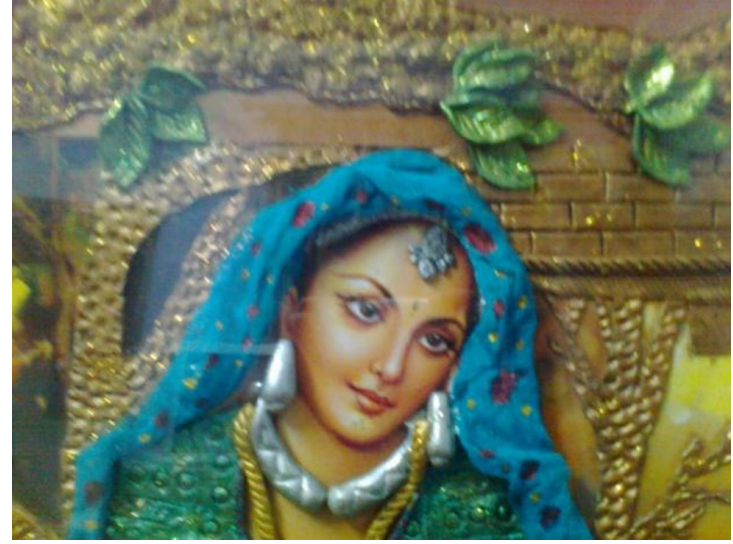
# Digital Image Processing

## Fundamentals

# What is a Digital Image?

- ❖ An image is non-textual information that can be displayed and printed.
- ❖ A **digital image** is a representation of a two-dimensional image as a finite set of digital values, called picture elements or pixels
- ❖ The smallest addressable image element is called PIXEL (picture element). The array is called a bitmap
- ❖ Pixel values typically represent gray levels, colors, heights, opacities and so on
- ❖ Images can be from real world or virtual
- ❖ Image can also be described as spatial arrays of values

## Example Images

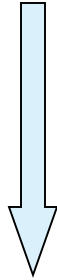


## More formally: Image is -

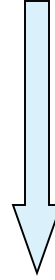
A two dimensional light intensity function

Analog Image :  $f(x \in \mathbb{R}, y \in \mathbb{R}) \longrightarrow v \in \mathbb{R} = i(x,y) * r(x,y)$

**Sampling**



**Quantization**



Digital Image :  $f(x \in \mathbb{Z}, y \in \mathbb{Z}) \longrightarrow v \in \mathbb{Z}$

## PROCESSING:

Analysis + Understanding

# Two Dimensional Representation of an Image

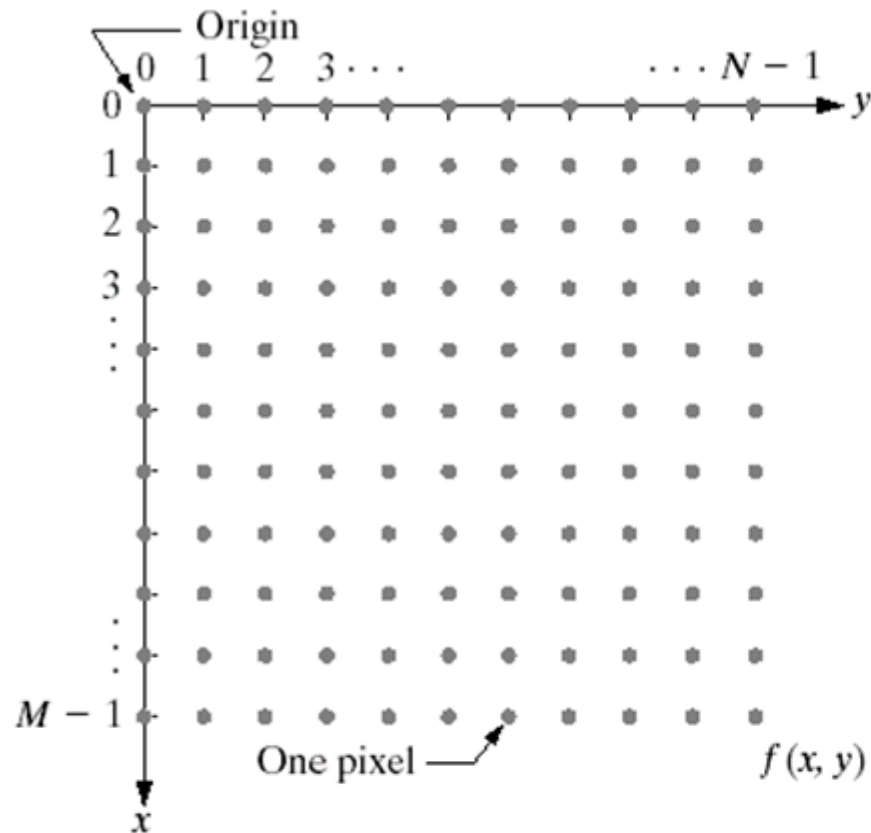


Fig. Coordinate conventions used in digital image processing text books to represent digital images

## Memory Requirement?

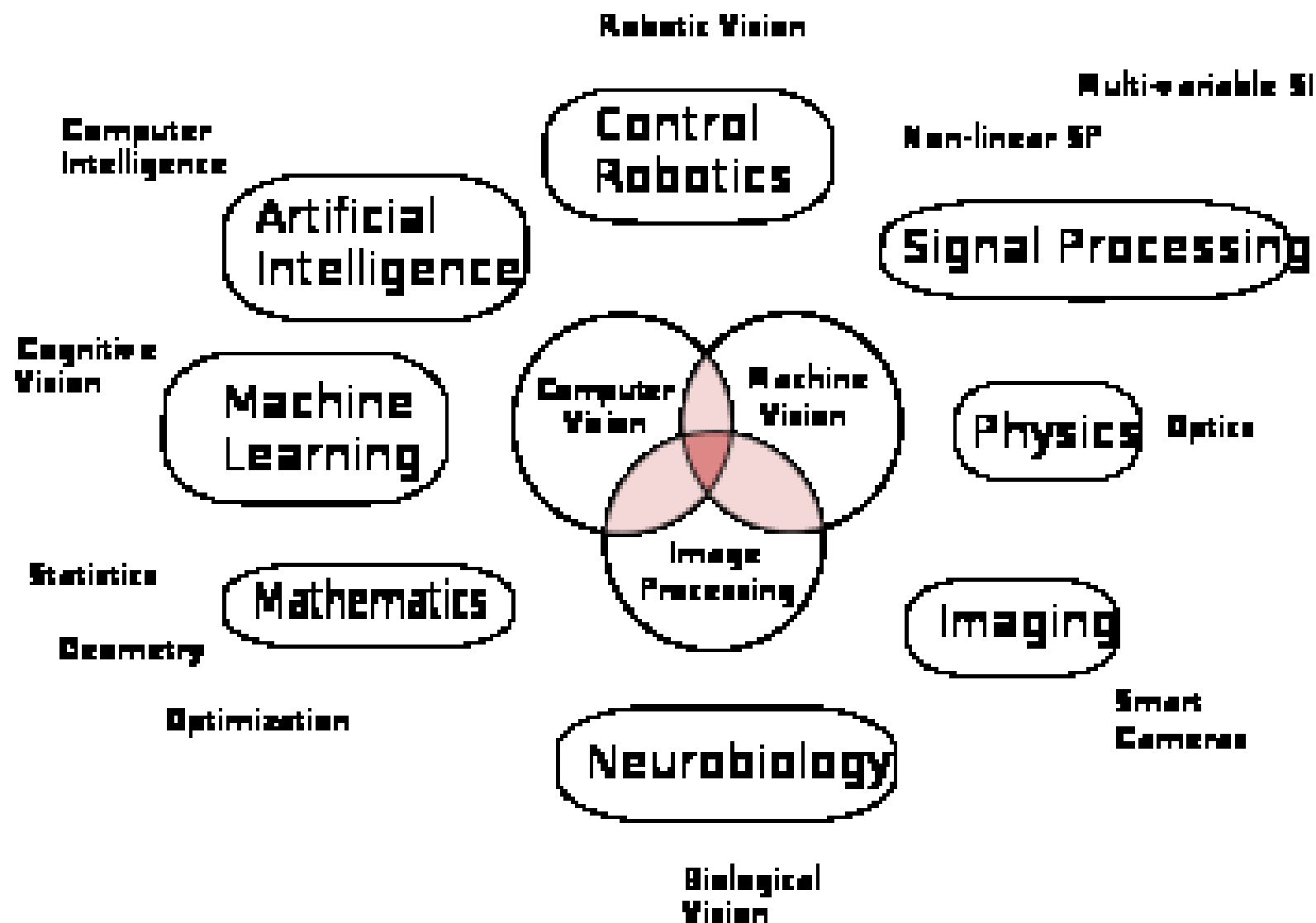
# Why digital image processing?

- ❖ Image is better than any other information form for human being to perceive.
- ❖ Humans are primarily visual creatures – above 90% of the information about the world (a picture is better than a thousand words)
- ❖ However, vision is not intuitive for machines
  - ❖ Projection of 3D world to 2D images => loss of information
  - ❖ Interpretation of dynamic scenes, such as a moving camera and moving objects
- ❖ To improve the visual quality of an image for human interpretation
- ❖ To analyze the contents of the image for autonomous machine perception

# What is Digital Image Processing?

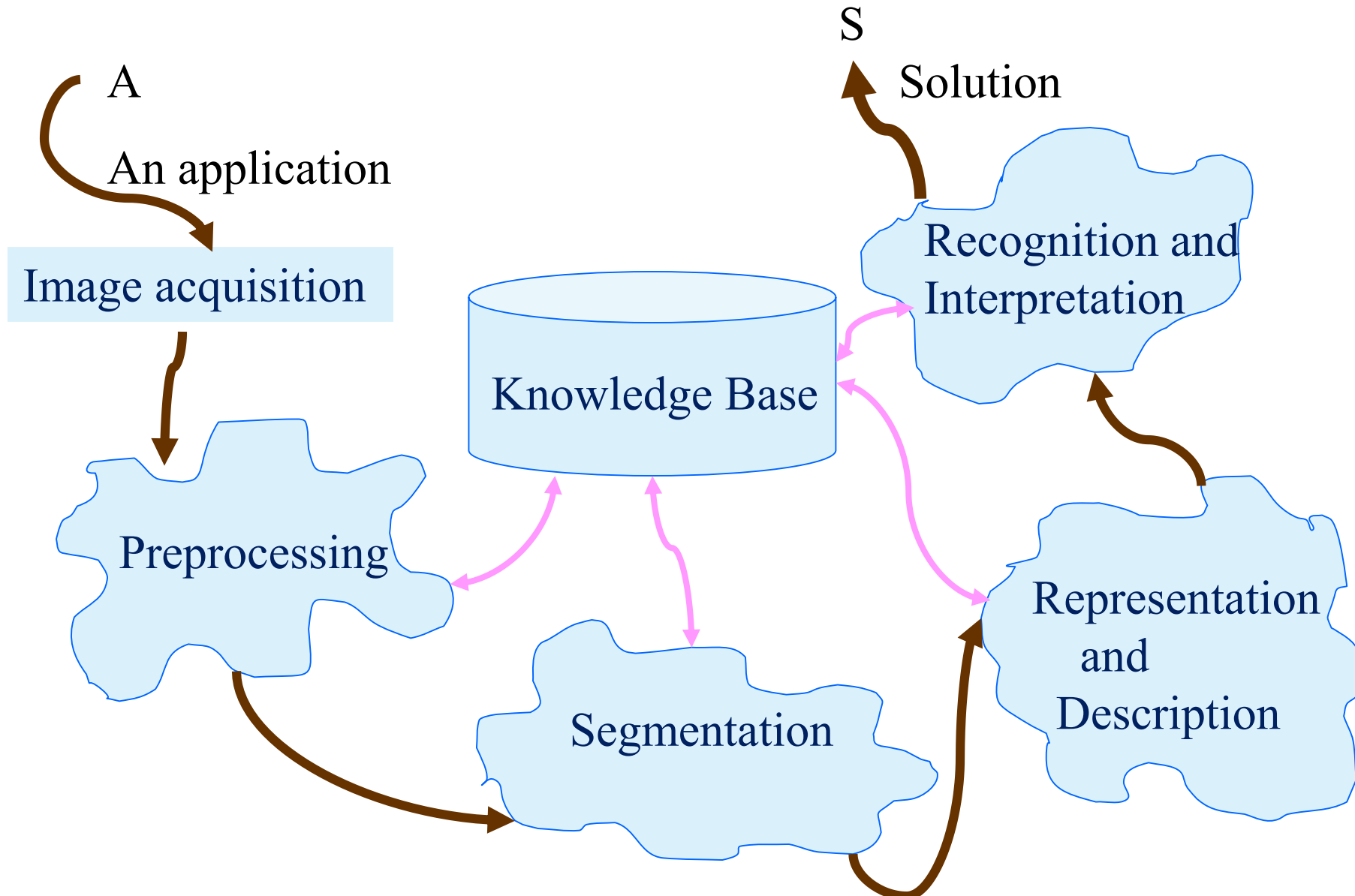
- ❖ Digital Image processing involves
  - ❖ Image understanding, Image analysis, and Computer vision which are aim to imitate the process of human vision electronically
- ❖ Digital Image Processing deals with image acquisition, pre-processing, segmentation, representation and description (feature extraction), and recognition and interpretation (image understanding) thereby enabling the scene analysis and understanding

# Fundamental Areas





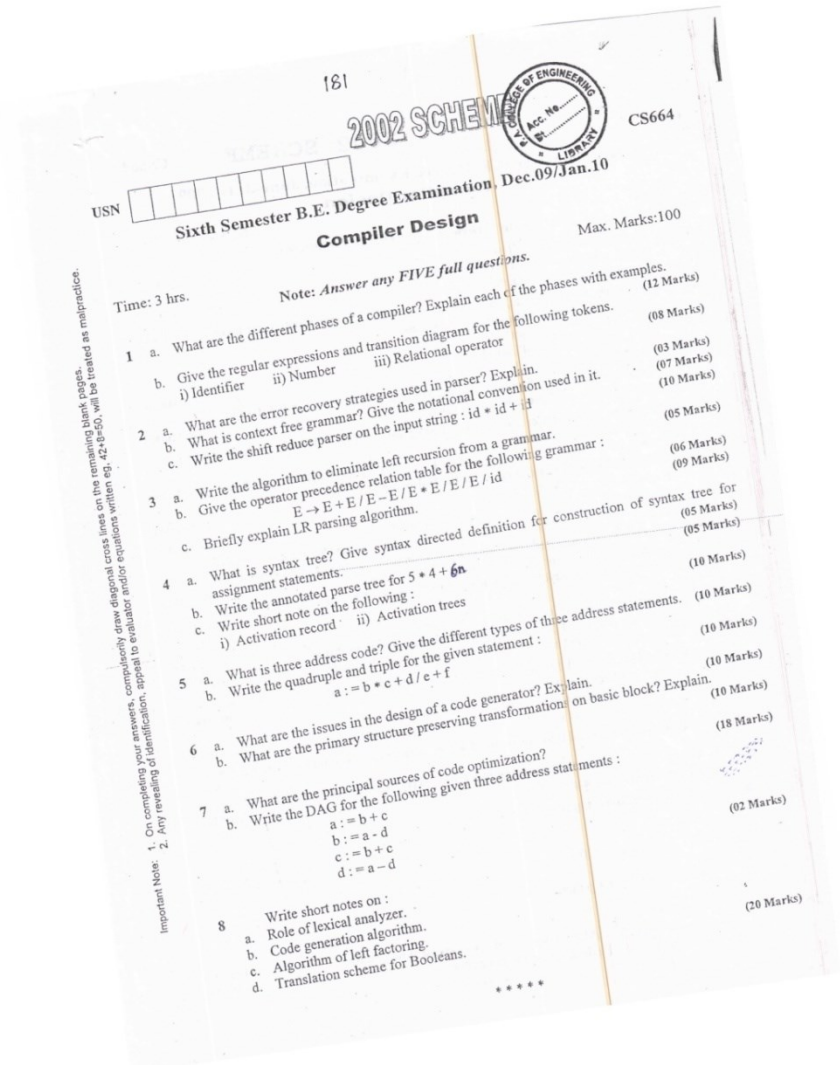
# Digital Image Processing - Steps



# Image Acquisition



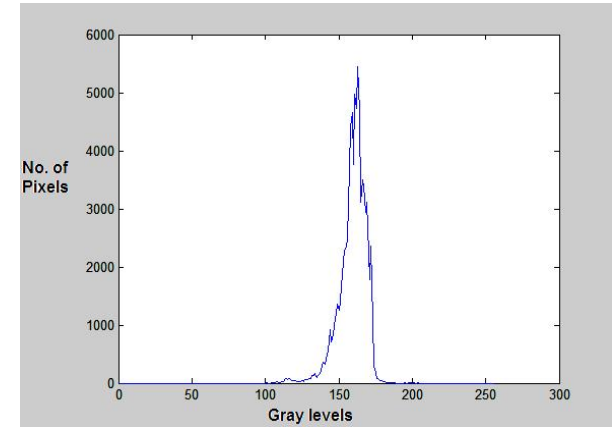
# Image Acquisition



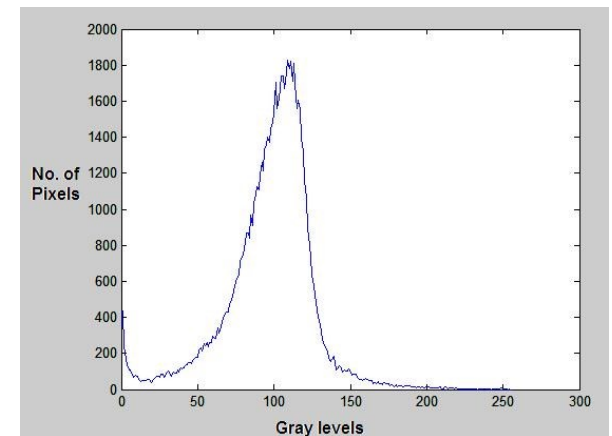
# Image Enhancement



**High Contrast Image**



**It's Histogram**



**Stretched Histogram**

# Image Enhancement



**Low quality images**

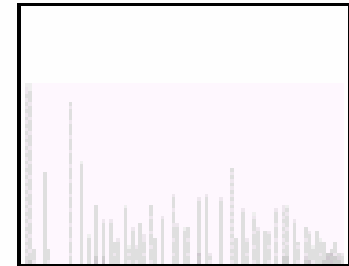
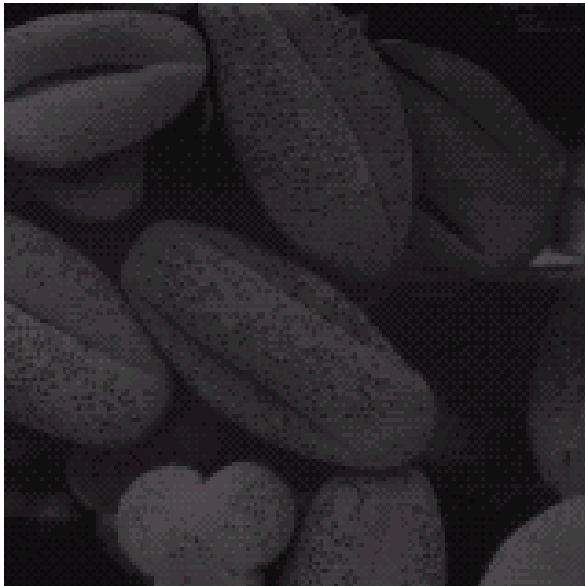
**Images after processing**

# Image Enhancement



Equalization

# Histogram Equalization



# Image Segmentation

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Self

Date 23-08-78

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रुपये  
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12

No 10283

Signature

One crore fifty lakhs only

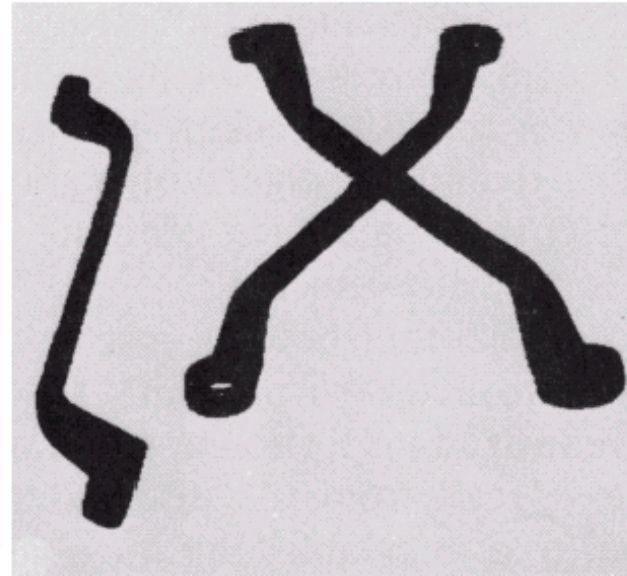
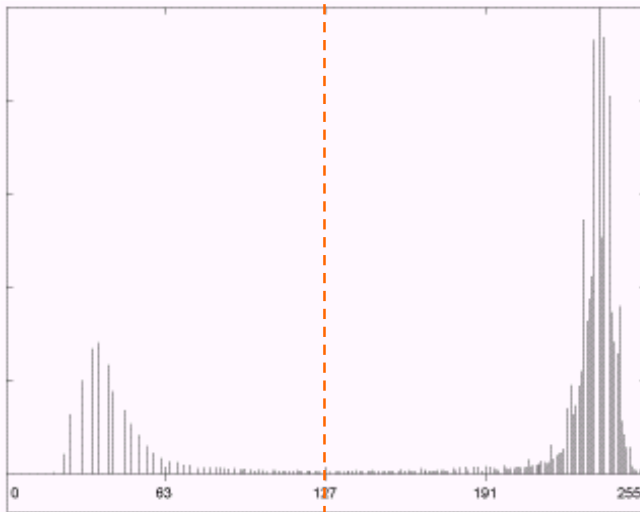
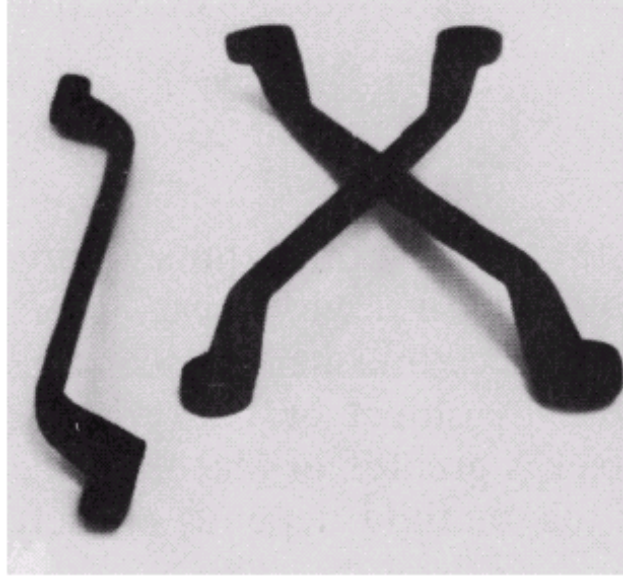
₹.Rs. 1,50,00,000

No 355416

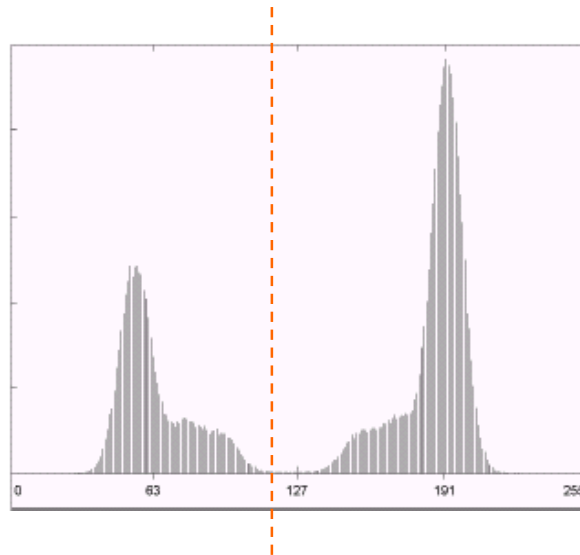


## Thresholding: Example 1

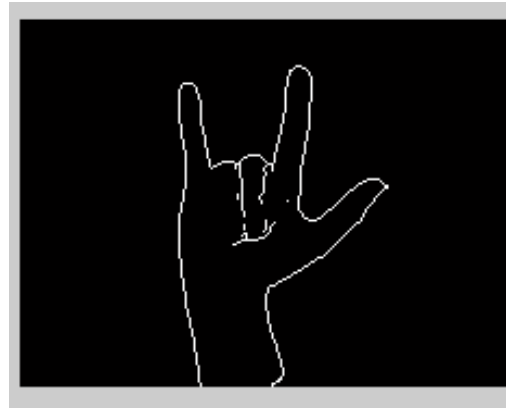
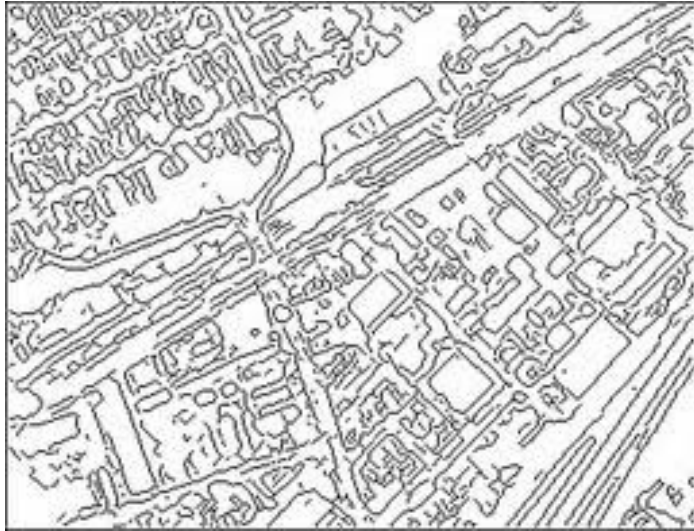
Images taken from Gonzalez & Woods, Digital Image Processing (2002)



## Thresholding: Example 2



# Edge Based Segmentation



# Feature Extraction

- Appearance based models/Global Approaches:
  - Principal Component Analysis
  - Linear discriminant analysis
  - Texture features
  - Shape based features
  - Discrete cosine transform
  - Wavelet transform and so on
- Descriptor based models/Local Approaches
  - Scale Invariant Feature Transform
  - Local Binary Pattern
  - Histogram of Gradients
  - Region Covariance Matrix and so on

## Applications...

- Agriculture
- Augmented reality
- Autonomous vehicles
- Biometrics
- Character recognition
- Forensics
- Industrial quality inspection
- Face recognition
- Gesture analysis
- Geo-science
- Image restoration
- Medical image analysis
- Pollution monitoring
- Process control
- Remote sensing
- Robotics
- Security and surveillance
- Transport



# Agriculture

- For Harvesting
- For Cleaning
- For quality inspection
- For disease identification and so on



# Banking

- Typical tasks include:
  - Document verification
  - Person authentication
  - Bankers Cheque analysis
- How these tasks can be achieved efficiently

# Cheque Validation

Date 23-08-78

Date 23-08-78

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*[Signature]*

*[Signature]*

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# Autonomous Vehicles

- In Highways



# Biometrics

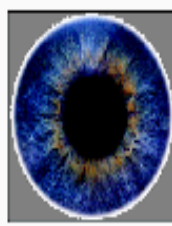
- Authentication of a person
  - Banking
  - Airport
  - Electronic Voting
  - Defense sectors
  - Secured transactions



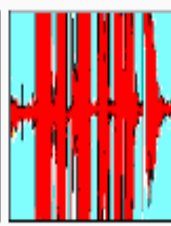
Fingerprint



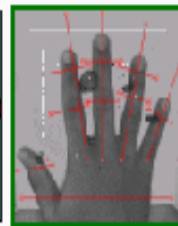
Face



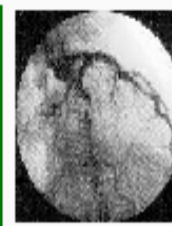
Iris



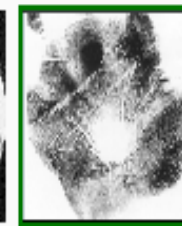
Voice



Hand Shape



Retina



Palmprint



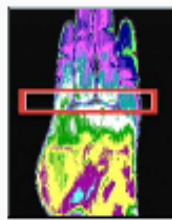
3D Face



Dental Radiograph



Gait



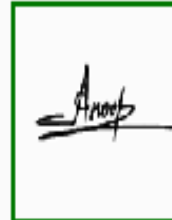
IR Hand



IR Face



Ear Shape



Signature

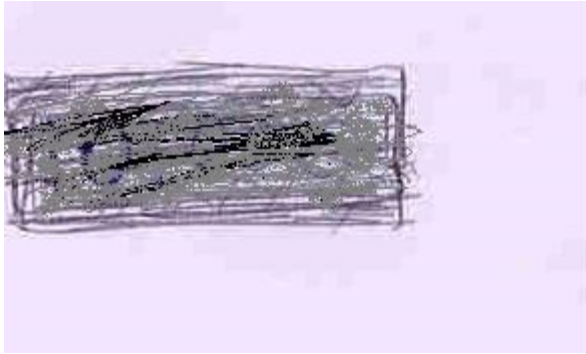


Keystroke



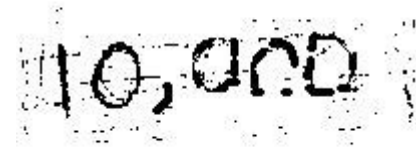
Multibiometrics

# Forensic Application



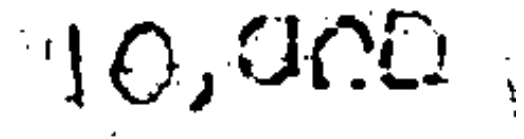
Obliterated Image

**Thresholding**  
→  
**operation**



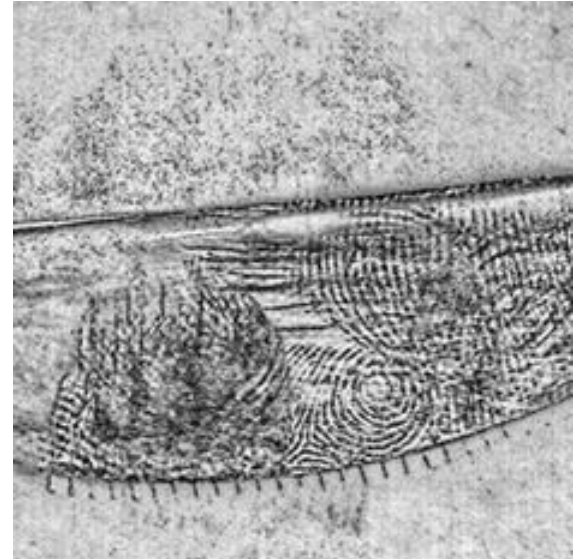
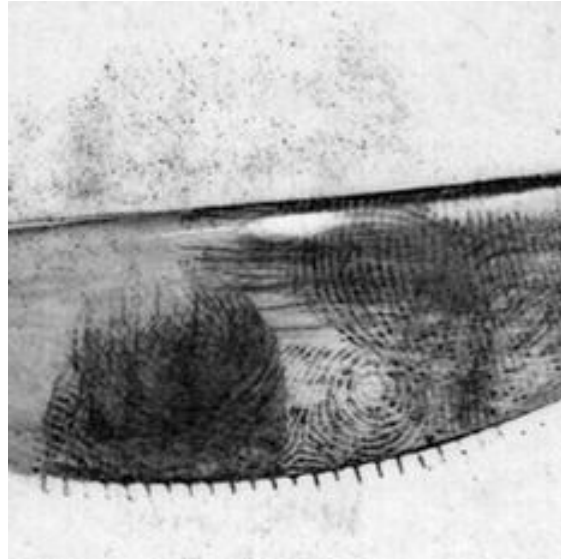
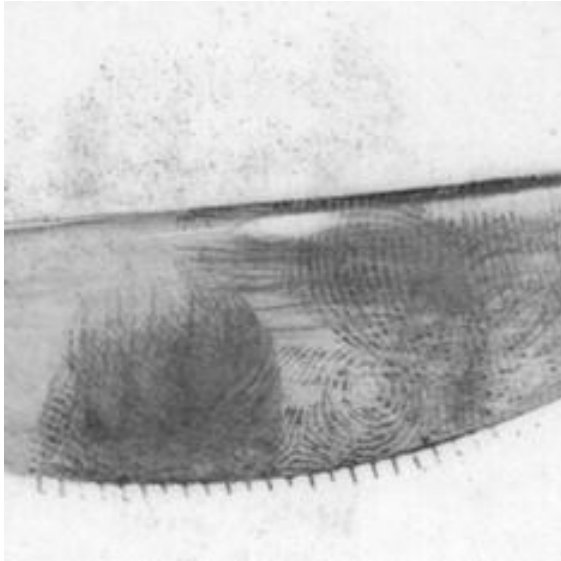
Deciphered Image

**Median**      **Filtering**



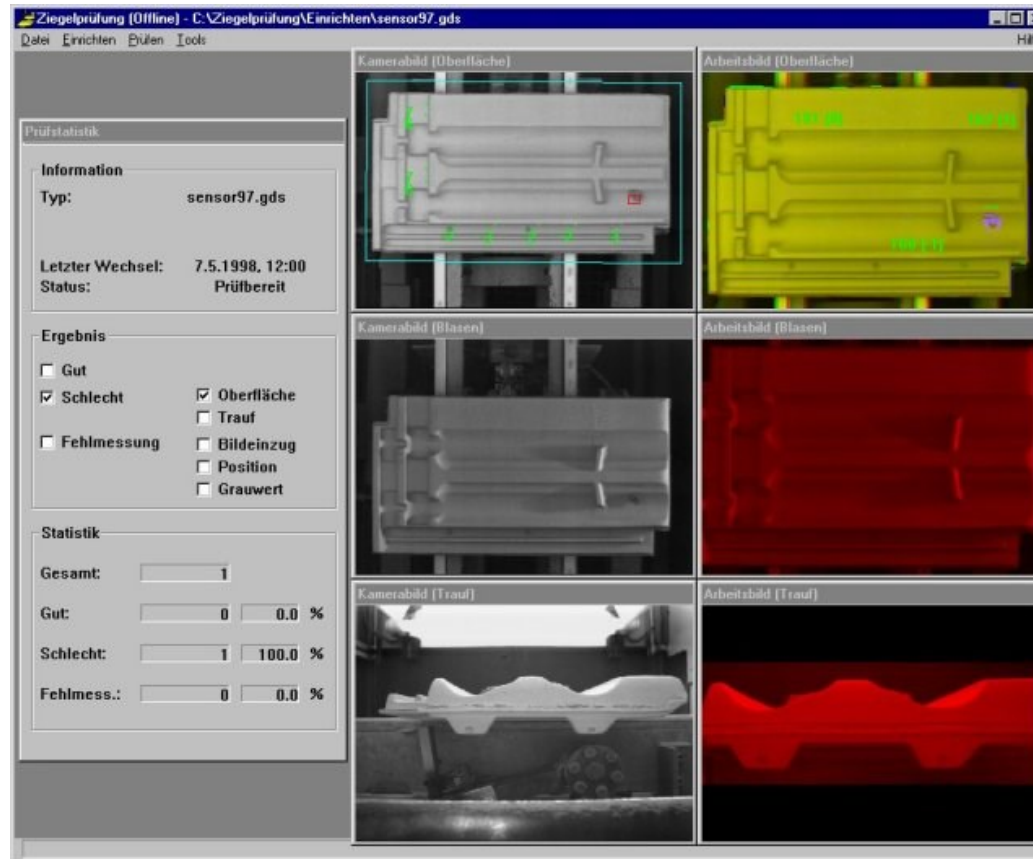
Enhanced Image

## Applications: Crime Investigation



Fingerprint Enhancement

# Industrial Quality Inspection



**Courtesy:** Thüringen research program "Image Processing, Pattern Recognition and Engineering Vision Systems" (Germany)

## Quality Assurance



# Remote Sensing

- **Remote sensing** is the acquisition of information about an object or phenomenon without making physical contact with the object.



# Remote Sensing for Rice Yield Estimation



**Planting**



**Heading**



**Ripening**



**Harvest**

**Rice main growth stages**

## Robotics: Services





# Security and Surveillance



Surveillance cameras such as these are installed by the millions in many countries, and are nowadays monitored by automated computer programs instead of humans.

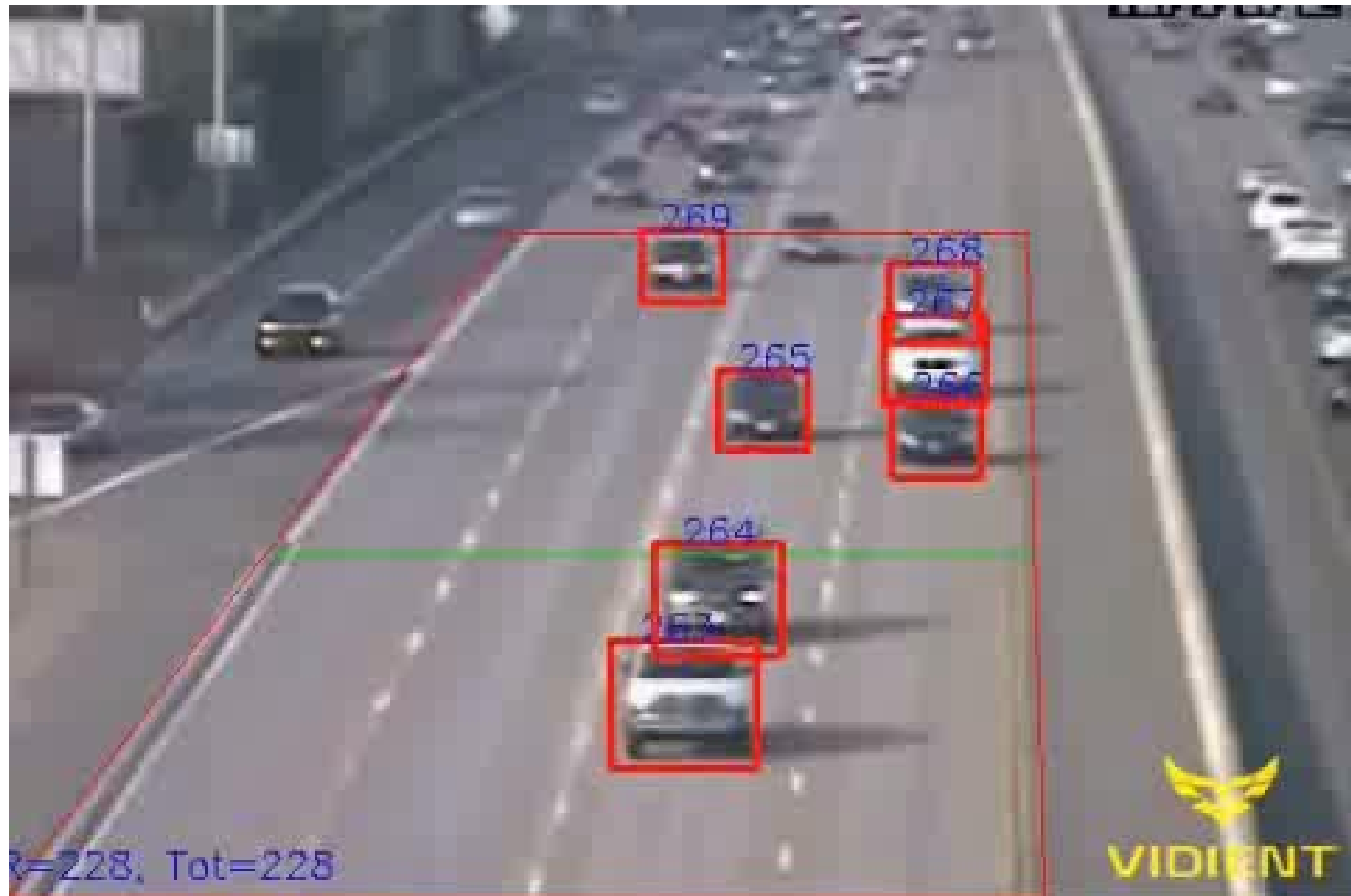


Micro Air Vehicle with attached surveillance camera



Fingerprints being scanned as part of the US-VISIT program

# Traffic Management

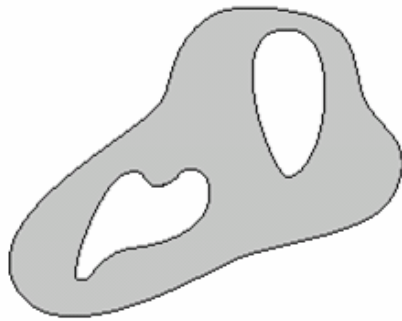




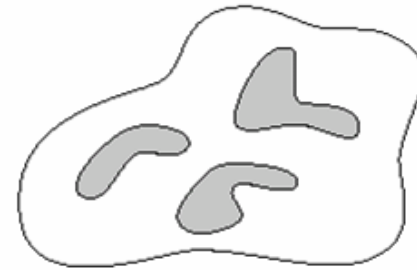
# **Image Topology**

# Introduction

- **Definition:** The study of properties of a figure that are unaffected by any deformation, as long as there is no tearing or joining of the figure.



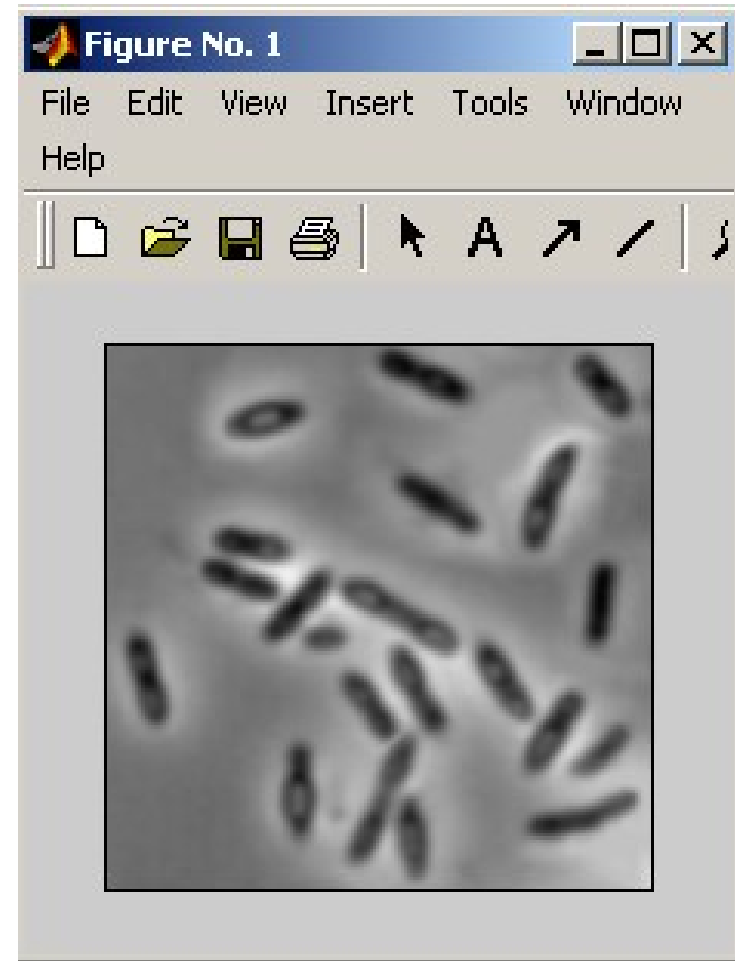
A region with  
2 holes



A region with 3  
connected  
components  
(objects)

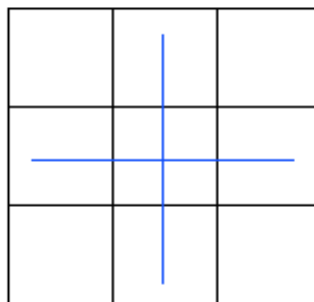
## Another example

- How many bacteria here?

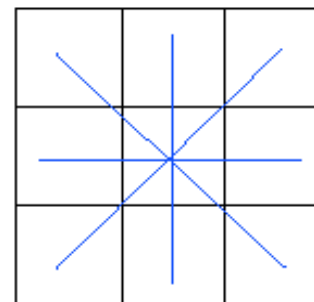


## Neighbors and Adjacency

- We have interests in classifying pixels into different categories
- Neighbourhoods



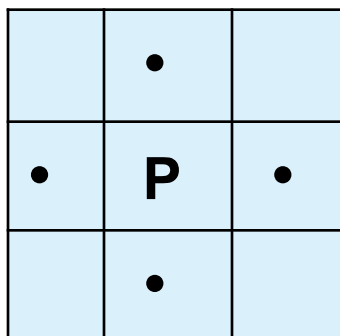
4-neighbour



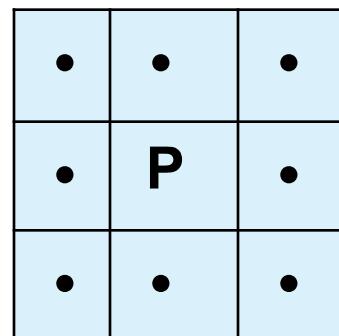
8-neighbour

- Two pixels **P** and **Q** are **4-adjacent** if they are 4-neighbours of one another, and **8-adjacent** if they are 8-neighbours of one another.

4-adjacent



8-adjacent



## Pixels' Relationships

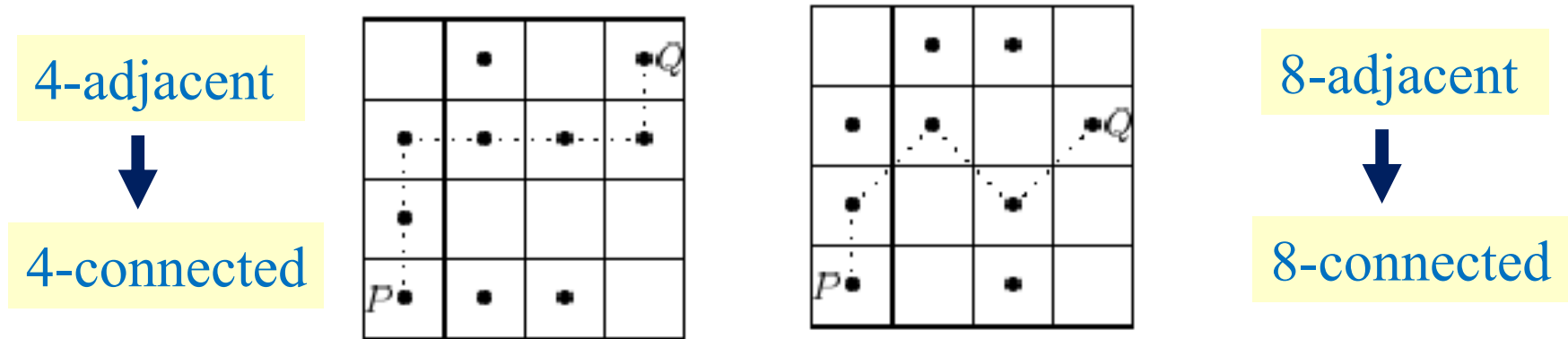
|            |             |            |
|------------|-------------|------------|
| $x-1, y-1$ | $x, y-1$    | $x+1, y-1$ |
| $x-1, y$   | $p_i(x, y)$ | $x+1, y$   |
| $x-1, y+1$ | $x, y+1$    | $x+1, y+1$ |

### Neighbors of pixel $p_i$

1. Four Neighbors :  $N_4(p_i) = \{(x, y-1), (x+1, y), (x, y+1), (x-1, y)\}$
2. Diagonal Neighbors :  $N_D(p_i) = \{(x+1, y-1), (x+1, y+1), (x-1, y+1), (x-1, y-1)\}$
3. Eight Neighbors :  $N_8(p_i) = N_4(p_i) \cup N_D(p_i)$

# Paths

- Suppose that **P** and **Q** are any two pixels (not necessarily adjacent), and suppose **P** and **Q** can be joined by a sequence of pixels as shown:



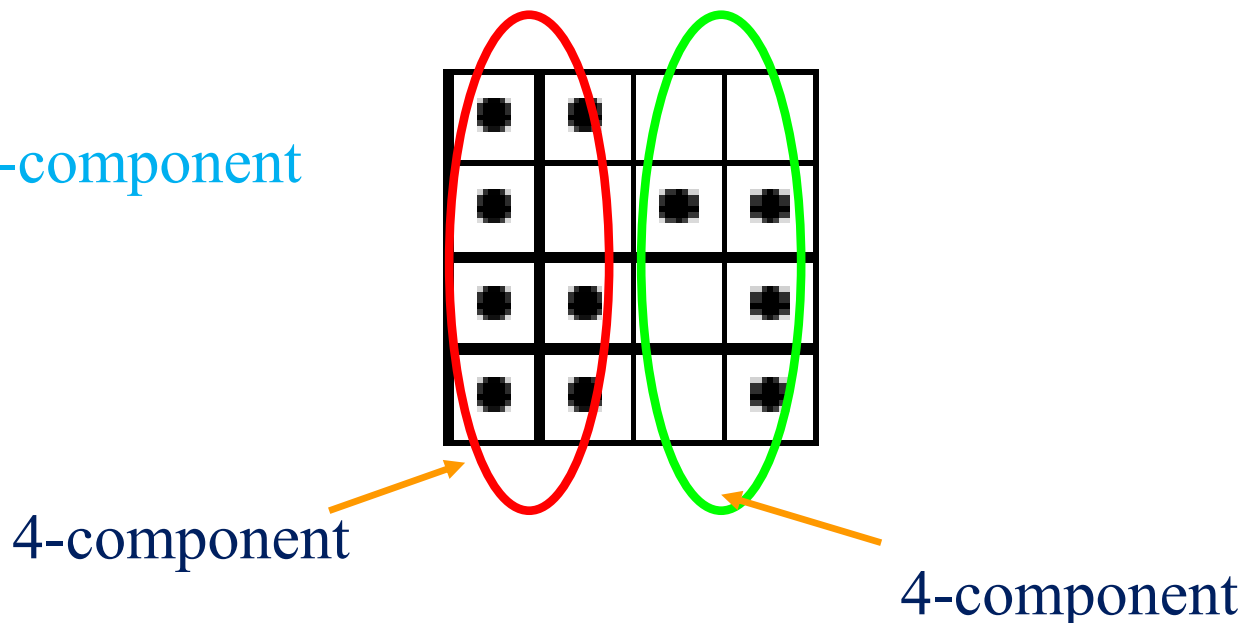
- If the path contains only 4-adjacent pixels, then **P**, **Q** are 4-connected.
- If the path contains 8-adjacent pixels, then **P** and **Q** are 8-connected



## Components

- A set of pixels all of which are 4-connected to each other is called a **4-component**; if all the pixels are 8-connected the set is an **8-component**.

One 8-component



# Pixel Connectivity

**4-Connectivity** : Pixels  $p$  and  $q$  are four connected if

1.  $p$  and  $q$  bear values in  $V$
2.  $p \in N_4(q)$

**D-Connectivity** : Pixels  $p$  and  $q$  are diagonally connected if

1.  $p$  and  $q$  bear values in  $V$
2.  $p \in N_D(q)$

**8-Connectivity** : Pixels  $p$  and  $q$  are eight connected if

1.  $p$  and  $q$  bear values in  $V$
2.  $p \in N_8(q)$

**m-connectivity:** Pixels  $p$  and  $q$  are mixed connected if

1.  $p$  and  $q$  bear values in  $V$
2.  $p \in N_4(q)$  or ( $p \in N_D(q)$  and  $N_4(p) \cap N_4(q) = \emptyset$ )

|   |   |   |
|---|---|---|
| 0 | 1 | 1 |
| 0 | 1 | 0 |
| 0 | 0 | 1 |

|   |   |   |
|---|---|---|
| 0 | 1 | 1 |
| 0 | 1 | 0 |
| 0 | 0 | 1 |

|   |   |   |
|---|---|---|
| 0 | 1 | 1 |
| 0 | 1 | 0 |
| 0 | 0 | 1 |

## Formal Definition of a Path

- A 4-path from **P** to **Q** is a sequence of pixels

$$P = p_0, p_1, p_2, \dots, p_n = Q$$

such that for each  $i=0,1,\dots, n-1$ , pixel  $p_i$  is 4-adjacent to pixel  $p_{i+1}$ .

- An 8-path is where the pixels in the sequence connecting **P** and **Q** are 8-adjacent

## Properties of Connectivity – Equivalence Relations

- A relation  $x \sim y$  between two objects  $x$  and  $y$  is an **equivalence relation** if the relation is
  - Reflexive:  $x \sim x$  for all  $x$ ,
  - Symmetric:  $x \sim y \iff y \sim x$  for all  $x$  and  $y$ ,
  - Transitive: if  $x \sim y$  and  $y \sim z$  then  $x \sim z$  for all  $x$ ,  $y$  and  $z$ .
- Examples for equivalence relation?
- Examples that are not equivalence relation?

# Equivalence Relations

## ■ Some examples:

- Numeric equality
- Set cardinality
- Connectedness

## ■ Examples of some relations which are not equivalence:

- Personal relations
- Subset relation

- The importance of the equivalence relation concept is that it allows us a very neat way of dealing with issues of connectedness.
- **Equivalence class**: the set of all objects equivalent to each other.

# Connected Component Labelling

- Define the components of a binary image as being the **equivalence classes of the connectedness equivalence relation**.
- Finding all equivalence classes of connected pixels in a binary image is called **connected component labelling**.
- The result of connected component labelling is another image in which everything in one connected region is labelled "1" (for example), everything in another connected region is labelled "2", etc.
- Labelling all the 4-components of a binary image, starting at the top left and working across and down.
- "Scan" the image row by row moving across from left to right.
- Assign labels to pixels in the image; these labels will be the numbers of the components of the image.
- A pixel in the image will be called a **foreground pixel** (fp); a pixel not in the image will be called a **background pixel** (bp).

## Connected Component Labelling: Algorithm

- Check the state of  $p$ . If it is a bp, move on to the next scanning position. If it is fp, check the state of  $u$  and  $l$ . If they are both bp, assign  $p$  a new label.
- If only one of  $u$  and  $l$  are fp, assign the label to  $p$
- If both  $u$  and  $l$  are fp, but different labels, assign either label to  $p$ , and make the 2 labels equivalent.
- At the end of the scan, all foreground pixels have been labelled, but some labels may be equivalent. Then sort the labels into equivalence classes, and assign a different label to each class.
- Do a second pass through the image, replacing the label on each foreground pixel with the label assigned to its equivalence class in the previous step

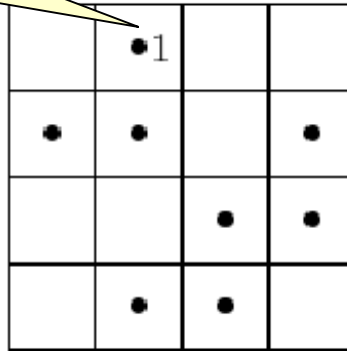
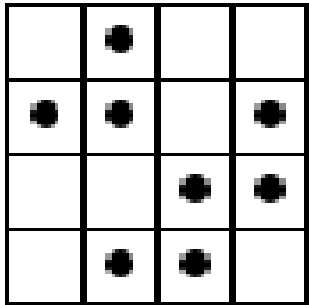
|     |     |  |
|-----|-----|--|
|     | $u$ |  |
| $l$ | $p$ |  |
|     |     |  |



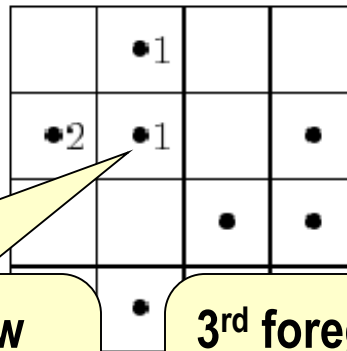
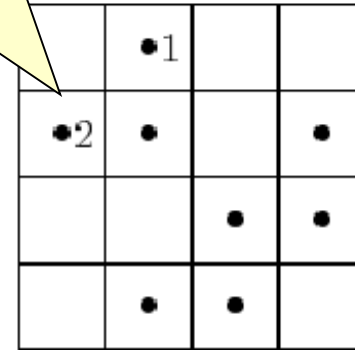
## Example 1

The first foreground pixel  
Upper neighbor : non-existent  
Left neighbor : background

**Step 1.**

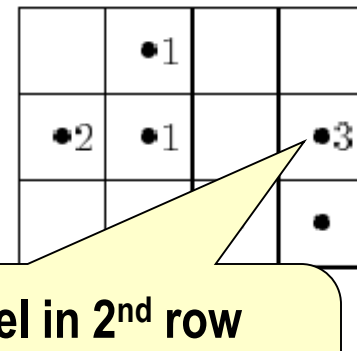


First foreground pixel in 2<sup>nd</sup> row  
Upper neighbor : background  
Left neighbor : non-existent

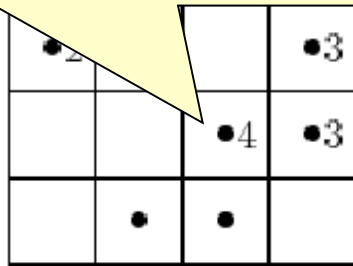


2<sup>nd</sup> foreground pixel in 2<sup>nd</sup> row  
Upper neighbor : foreground  
Left neighbor : foreground

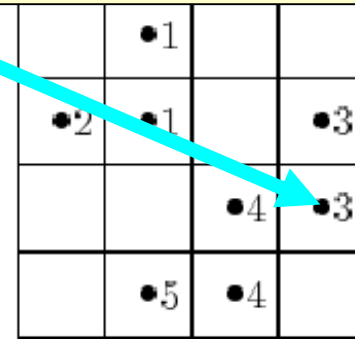
3<sup>rd</sup> foreground pixel in 2<sup>nd</sup> row  
Upper neighbor : background  
Left neighbor : background



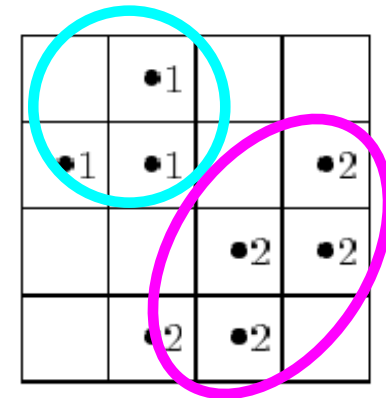
1<sup>st</sup> foreground pixel in 3<sup>rd</sup> row:  
 Upper neighbor : background  
 Left neighbor : background



1<sup>st</sup> foreground pixel in 3<sup>rd</sup> row:  
 Upper neighbor : foreground ( label 3)  
 Left neighbor : foreground (label 4)



**Step 2.** We have the following equivalent classes of labels: {1,2} and {3, 4,5}



**Step 3.** Assign label 1 to the first class, and label 2 to the second class

## Example 2

### Original Binary image

|   |   |   |   |  |   |   |   |
|---|---|---|---|--|---|---|---|
|   |   |   |   |  |   |   |   |
|   |   | 1 | 1 |  |   |   |   |
| 1 | 1 | 1 | 1 |  | 1 | 1 | 1 |
|   |   |   |   |  |   |   |   |

### Pass 1:

|   |   |   |   |  |   |   |   |
|---|---|---|---|--|---|---|---|
|   |   |   |   |  |   |   |   |
|   |   | 1 | 1 |  |   |   |   |
| 2 | 2 | 2 | 2 |  | 3 | 3 | 3 |
|   |   |   |   |  |   |   |   |

### Pass 2:

|   |   |   |   |  |   |   |   |
|---|---|---|---|--|---|---|---|
|   |   |   |   |  |   |   |   |
|   |   | 1 | 1 |  |   |   |   |
| 1 | 1 | 1 | 1 |  | 2 | 2 | 2 |
|   |   |   |   |  |   |   |   |

| Equivalence<br>Class number | Original mark |
|-----------------------------|---------------|
| 1                           | 1,2           |
| 2                           | 3             |

## Example 3

Original Binary image

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Pass 1:

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Pass 2:

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| Equivalence<br>Class number | Original mark |
|-----------------------------|---------------|
| 1                           | 1,2,3,4       |

## Distances and Metrics

- A distance function  $d(x,y)$  is called a **metric** if it satisfies the following:

$$d(x,y) = d(y,x) \text{ (symmetry)}$$

$$d(x,y) \geq 0 \text{ and } d(x,y) = 0 \text{ iff } x = y \text{ (positivity)}$$

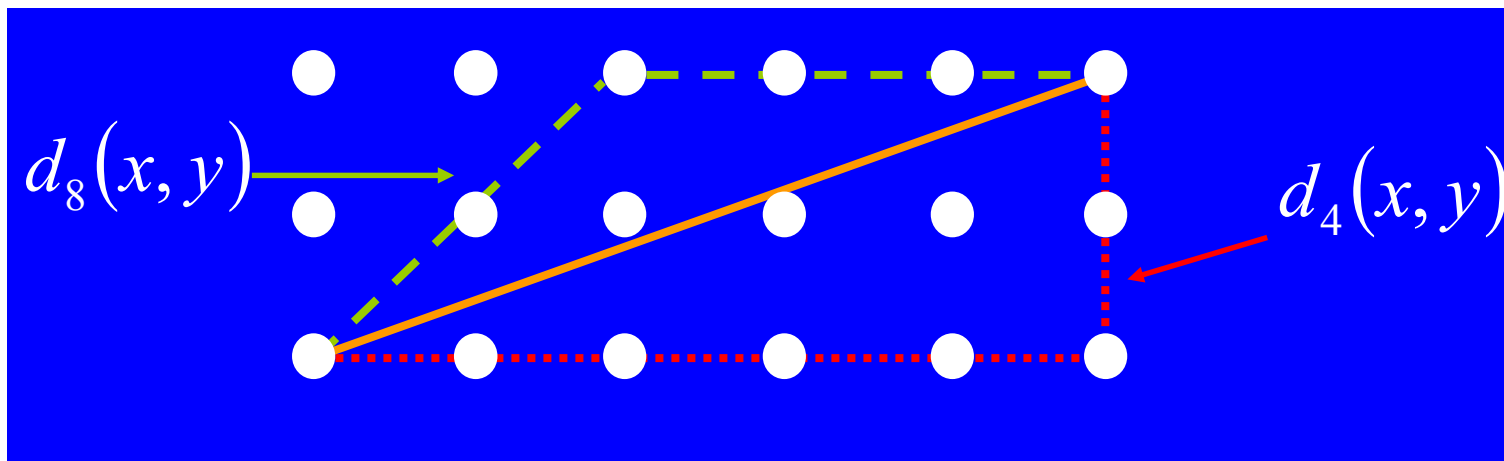
$$d(x,y) + d(y,z) \leq d(x,z) \text{ (the triangle inequality)}$$

- A standard distance metric is **Euclidean distance** (a straight line between 2 points)

$$d(x,y) = \sqrt{(x_1 - y_1)^2 + (x_2 - y_2)^2}$$

where  $x = (x_1, x_2)$  and  $y = (y_1, y_2)$

## Distance Metrics for Grid



- The Euclidean distance is  $\sqrt{5^2 + 2^2} \approx 5.39$

- For 4-path and 8-path?

$$d_4(x, y) = |x_1 - y_1| + |x_2 - y_2| \text{ (taxicab metric)}$$

$$d_8(x, y) = \max \{|x_1 - y_1|, |x_2 - y_2|\}$$



# **Color Models**

# Color Image Processing

- Color and electromagnetic spectrum
- Primary colors
- Chromaticity diagram
- Color models
  - RGB model
  - CMY model
  - HSI model
- We need to know about the following
  - What does it mean when we say an object is in certain color?
  - Why the primary colors of human vision are red, green, and blue?
  - Is it true that different portions of red, green, and blue can produce all the visible color?
  - What kind of color model is the most suitable one to describe the human vision?

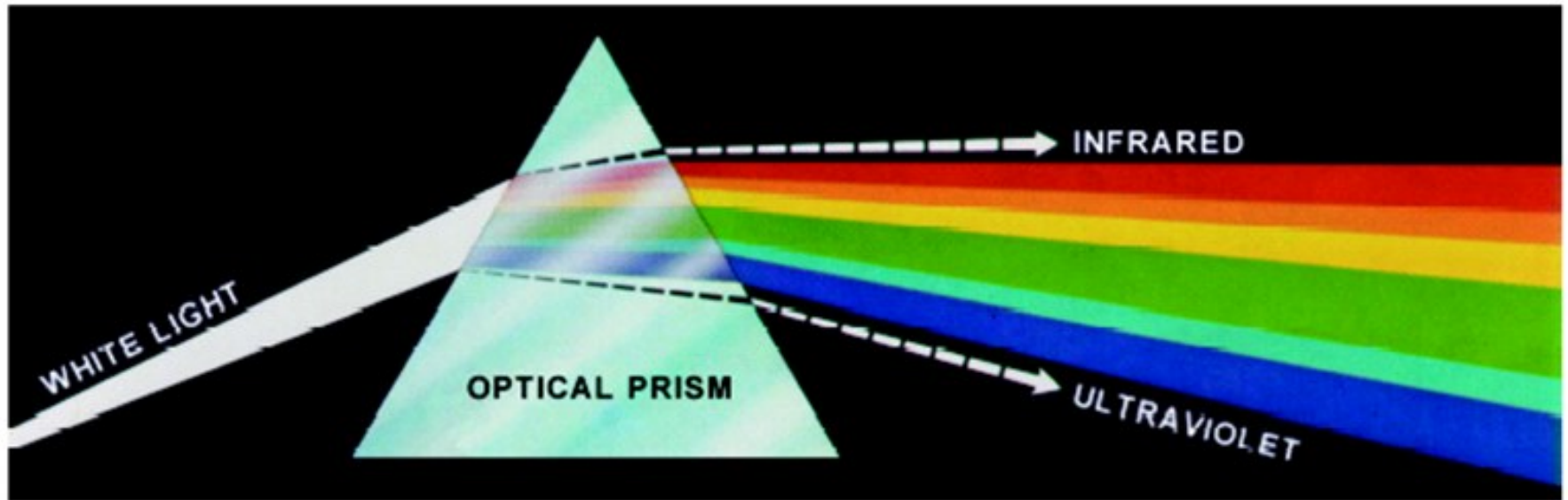


# Color models

- RGB model
  - Color monitor, color video cameras
- CMY model
  - Color printer
- HSI model
  - Color image manipulation
- XYZ (CIE standard, Y directly measures the luminance)
- YUV (used in PAL color TV)
- YIQ (used in NTSC color TV)
- YCbCr (used in digital color TV standard BT.601)

## Color spectrum

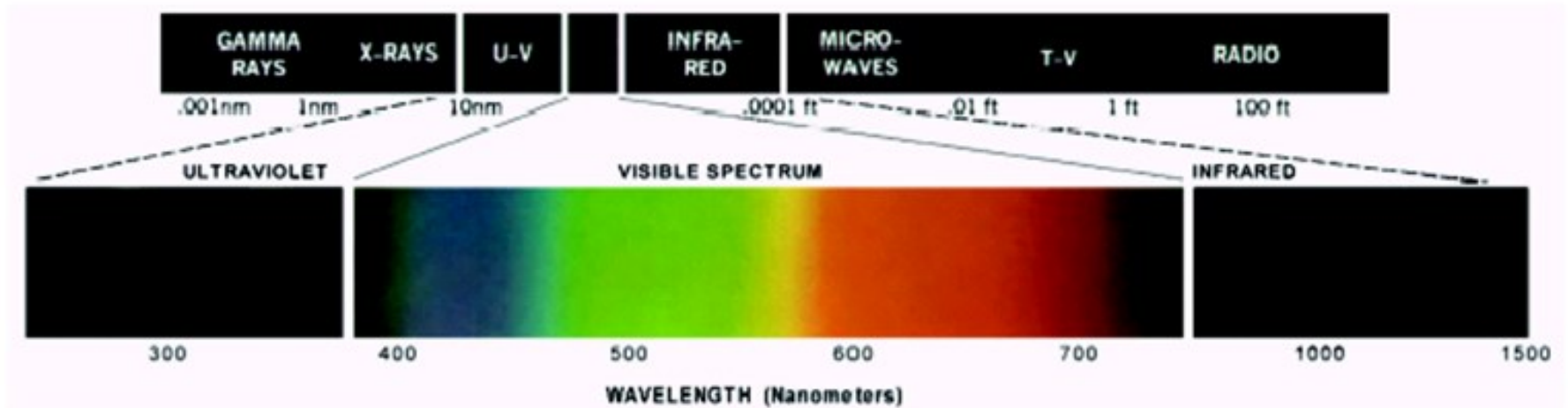
- When passing through a prism, a beam of sunlight is decomposed into a spectrum of colors : violet, blue, green, yellow, orange, red



**FIGURE.** Color spectrum seen by passing white light through a prism. (Courtesy of the General Electric Co., Lamp Business Division.)

# Electromagnetic spectrum

- Ultraviolet – visible light – infrared
- The longer the wavelength (meter), the lower the frequency (Hz), the lower the energy (electron volts)



**FIGURE** Wavelengths comprising the visible range of the electromagnetic spectrum. (Courtesy of the General Electric Co., Lamp Business Division.)

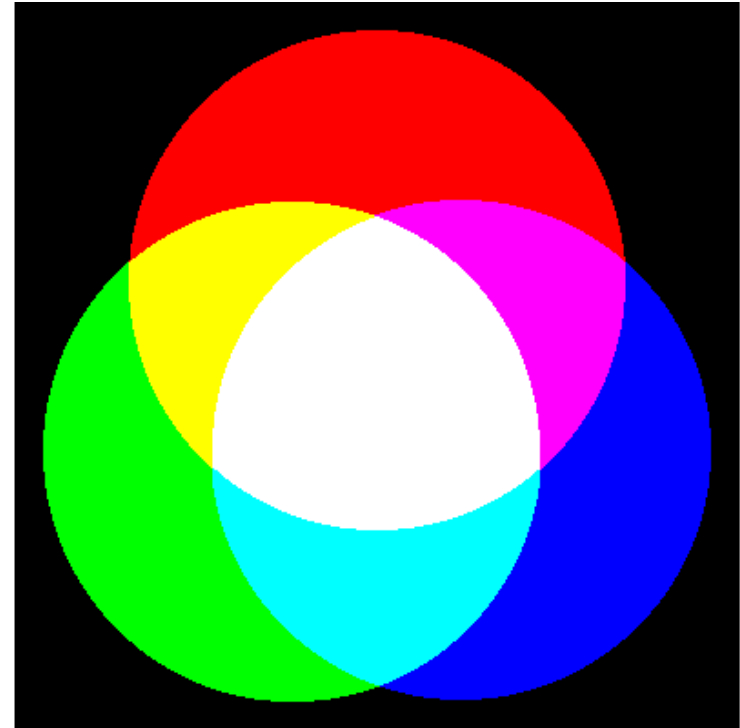
# Primary colors of human vision

- For this reason, red, green, and blue are referred to as the primary colors of human vision. CIE (the international Commission on Illumination) standard designated three specific wavelength to these three colors in 1931.
  - Red : 700 nm
  - Green : 546.1 nm
  - Blue : 435.8 nm

# RGB Color model



Source: [www.mitsubishi.com](http://www.mitsubishi.com)

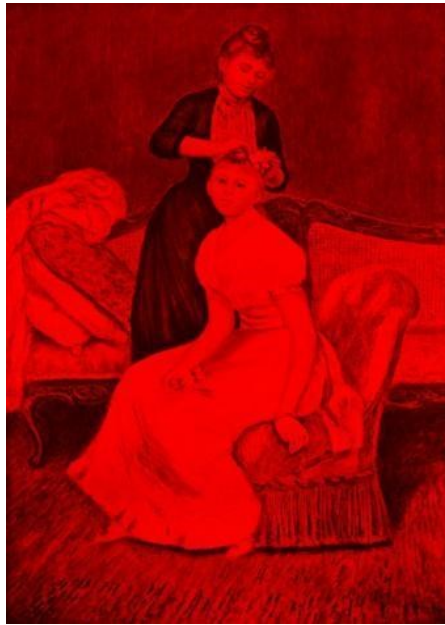


Active displays, such as computer monitors and television sets, emit combinations of red, green and blue light. This is an **additive** color model

# RGB Example



Original



Red Band



Green Band



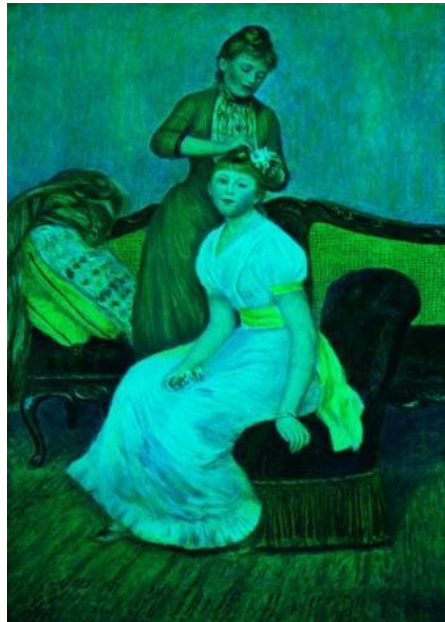
Blue Band



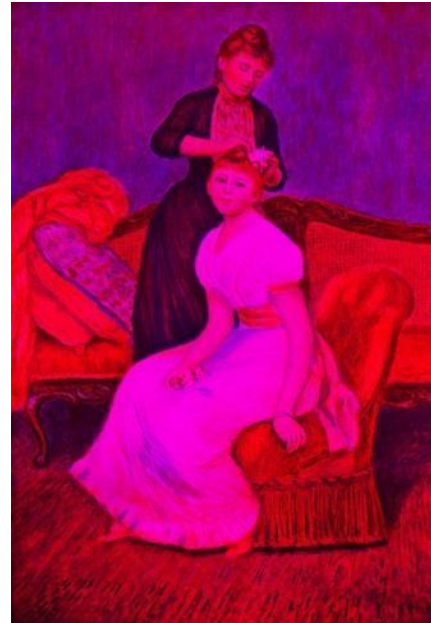
## RGB Example



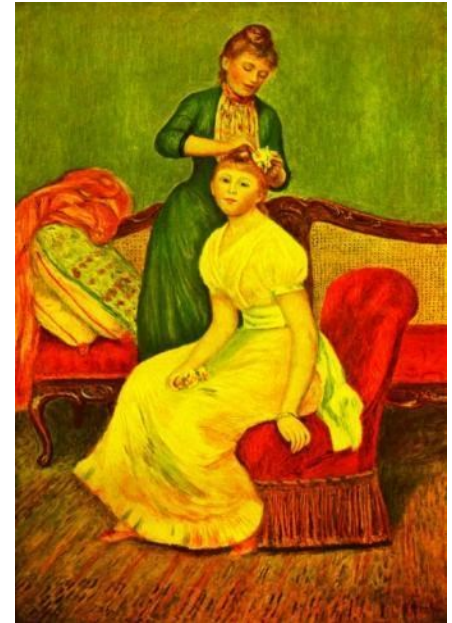
Original



No Red



No Green



No Blue

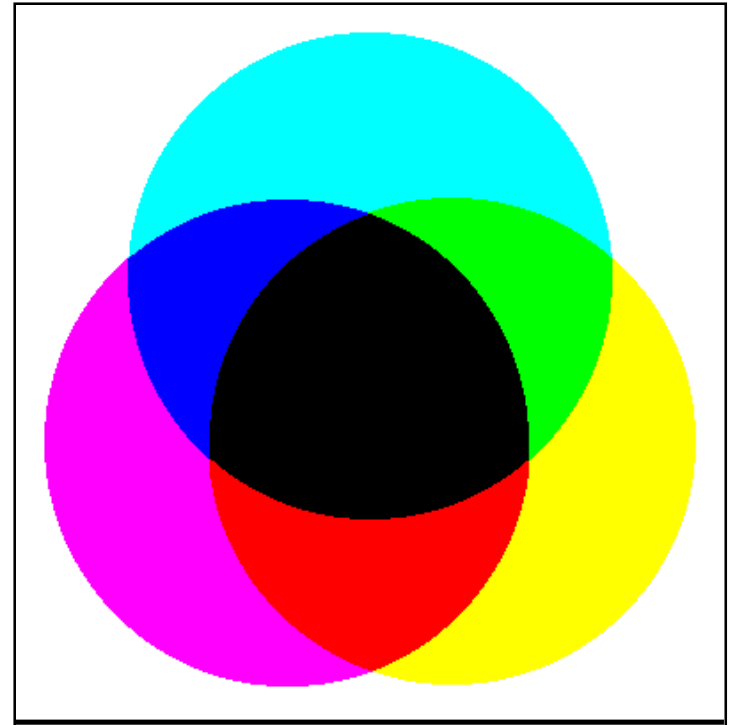
### Some Remarks:

- ❖ No single color may be called red, green, or blue.
- ❖ R, G, B are only specified by standard.
- ❖ The primary colors can not produce all the visible colors.

# CMY Color model



Source:  
[www.hp.com](http://www.hp.com)

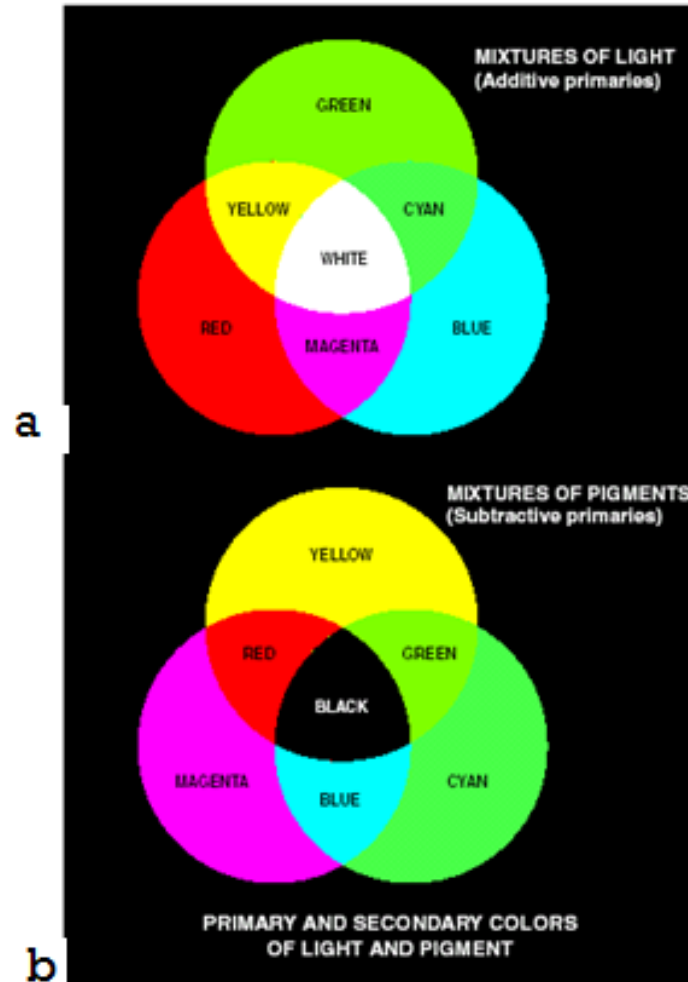


Passive displays, such as color inkjet printers, **absorb** light instead of emitting it. Combinations of **cyan**, **magenta** and **yellow** inks are used. This is a **subtractive** color model.



## Secondary colors

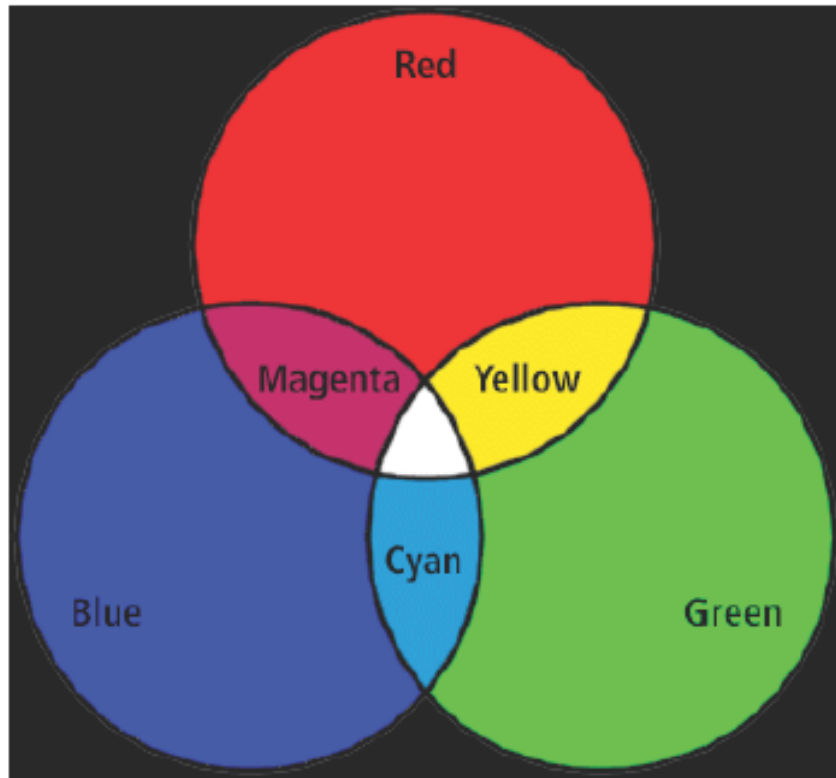
- Magenta (R+B)
- Cyan (G+B)
- Yellow (R+G)



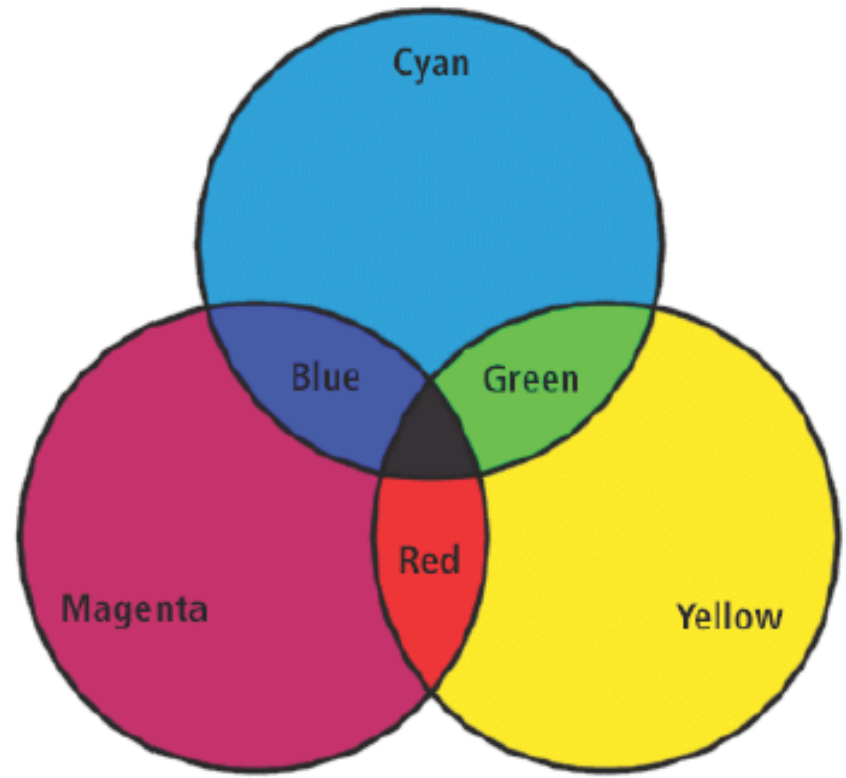
a  
b

**FIGURE .** Primary and secondary colors of light and pigments. (Courtesy of the General Electric Co., Lamp Business Division.)

## RGB vs CMY



Magenta = Red + Blue  
Cyan = Blue + Green  
Yellow = Green + Red



Magenta = White - Green  
Cyan = White - Red  
Yellow = White - Blue

## CMY model

- Color printer and copier
- Deposit colored pigment on paper
- Relationship with RGB model: 
$$\begin{bmatrix} C \\ M \\ Y \end{bmatrix} = 1 - \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

## HSI model

- The intensity component (I) is decoupled from the color components (H and S), so it is ideal for image processing algorithm development.
- H and S are closely related to the way human visual system perceives colors.

## Converting From RGB To HSI

Given a colour as R, G, and B its H, S, and I values are calculated as follows:

$$H = \begin{cases} \theta & \text{if } B \leq G \\ 360 - \theta & \text{if } B > G \end{cases} \quad \theta = \cos^{-1} \left\{ \frac{\frac{1}{2} [(R - G) + (R - B)]}{\left[ (R - G)^2 + (R - B)(G - B) \right]^{\frac{1}{2}}} \right\}$$

$$S = 1 - \frac{3}{(R + G + B)} [\min(R, G, B)]$$

$$I = \frac{1}{3} (R + G + B)$$

## Converting From HSI To RGB

Given a colour as H, S, and I it's R, G, and B values are calculated as follows:

- RG sector ( $0 \leq H < 120^\circ$ )

$$R = I \left[ 1 + \frac{S \cos H}{\cos(60 - H)} \right] \quad G = 3I - (R + B) \quad B = I(1 - S)$$

- GB sector ( $120^\circ \leq H < 240^\circ$ )

$$R = I(1 - S) \quad G = I \left[ 1 + \frac{S \cos(H - 120)}{\cos(H - 60)} \right] \quad B = 3I - (R + G)$$

## Model conversion between RGB and YCbCr

$$\begin{bmatrix} Y \\ Cb \\ Cr \end{bmatrix} = \begin{bmatrix} 0.257 & 0.504 & 0.098 \\ -0.148 & -0.291 & 0.439 \\ 0.439 & -0.368 & -0.071 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix} + \begin{bmatrix} 16 \\ 128 \\ 128 \end{bmatrix}$$

$$\begin{bmatrix} R \\ G \\ B \end{bmatrix} = \begin{bmatrix} 1.164 & 0.000 & 1.598 \\ 1.164 & -0.329 & -0.813 \\ 1.164 & 2.017 & 0.000 \end{bmatrix} \begin{bmatrix} Y - 16 \\ Cb - 128 \\ Cr - 128 \end{bmatrix}$$

$$Y \in [16, 235], Cb, Cr \in [16 - 240]$$

# QUESTIONS

THANK YOU