



# MASURAREA PROPRIETĂȚI GEOMETRICE SIMPLE ALE OBIECTELOR DIN IMAGINI BINARE

*Simple geometrical properties of binary objects*

## Simple geometrical properties

Simplification: imagines with a single object



### Notations:

$$b(x, y) = \begin{cases} 1 & \text{pixel}_{obj} \\ 0 & \text{pixel}_{bck} \end{cases} \Rightarrow \text{value/label of the pixel at location } (x, y)$$

### Area

$$A = \iint_I b(x, y) dx dy$$

or in the discrete case:

$$A = \sum_{i=1}^n \sum_{j=1}^m b(i, j) \quad \text{where: } i = [1 \dots n] \text{ and } j = [1 \dots m]$$

## Center of mass (CM)

**Center of mass**:= the point in which the entire mass of the object can be concentrated without changing the first order moment on any axis:

1-st order moment on axis x:

$$\bar{x} \cdot \iint_I b(x, y) dx dy = \iint_I x b(x, y) dx dy \quad \text{or} \quad \bar{i} \cdot \sum_{i=1}^n \sum_{j=1}^m b(i, j) = \sum_{i=1}^n \sum_{j=1}^m i b(i, j)$$

1-st order moment on axis y:

$$\bar{y} \cdot \iint_I b(x, y) dx dy = \iint_I y b(x, y) dx dy \quad \text{or} \quad \bar{j} \cdot \sum_{i=1}^n \sum_{j=1}^m b(i, j) = \sum_{i=1}^n \sum_{j=1}^m j b(i, j)$$

where  $(\bar{x}, \bar{y})$  respectively  $(\bar{i}, \bar{j})$  are the coordinates of the center of mass

$$\bar{i} = \frac{\sum_{i=1}^n \sum_{j=1}^m i b(i, j)}{A}, \quad \bar{j} = \frac{\sum_{i=1}^n \sum_{j=1}^m j b(i, j)}{A}$$

## Example: labelling + center of mass computation

```
% Label the connected pixel components in the text.png image, compute  
% their centroids, and superimpose the centroid locations on the  
% image.
```

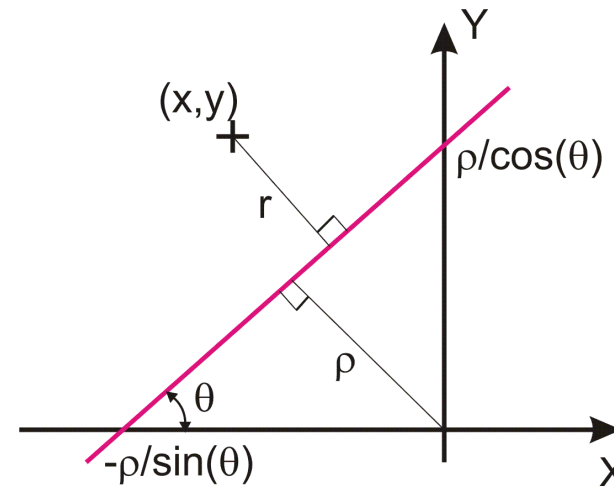
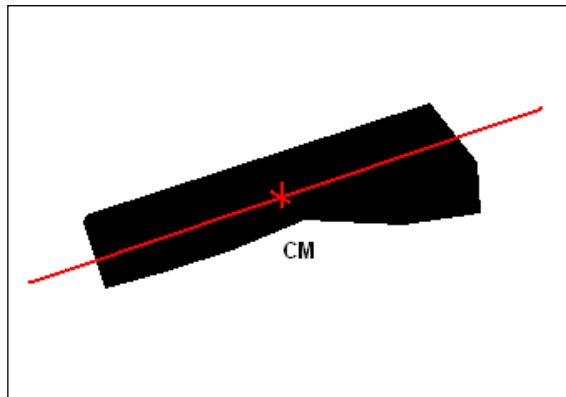
```
bw = imread('labeling.bmp');  
bw = ~bw;  
L = bwlabel(bw);  
s = regionprops(L, ' ');  
centroids = cat(1, s.Centroid);  
imshow(bw)  
hold on  
plot(centroids(:,1), centroids(:,2), 'm*')  
hold off
```

**ABCDEFGHIJ  
KLMNOPQRS  
TUVWZY**



## Orientation (*elongation axis*)

(minimum inertia axis / axis with the smallest 2-nd order moment)



**2-nd order moment:**

$$E = \iint_I r^2 b(x, y) dx dy \quad (1)$$

Where:

$r$  - is the distance between point  $(x, y)$  and the searched axis (minimum inertia axis).

The equation of the axis (polar coordinates):

$$x \sin \theta - y \cos \theta + \rho = 0 \quad (2)$$

**Solution:** compute the line with the with the smallest 2-nd order moment:  $E'(\rho, \theta)=0$

For a point  $(x,y)$  belonging to the object, its distance  $r$  to the line will be:

$$r^2 = (x \sin\theta - y \cos\theta + \rho)^2 \quad (3)$$

Replacing (3) in (1):

$$E = \iint_I (x \sin\theta - y \cos\theta + \rho)^2 b(x,y) dx dy \quad (4)$$

**The derivative of E by  $\rho$  equaled with 0:**

$$E'_\rho = \iint_I 2(x \sin\theta - y \cos\theta + \rho)b(x,y) dx dy = 2\sin\theta \iint_I xb(x,y) dx dy - 2\cos\theta \iint_I yb(x,y) dx dy + 2\rho \iint_I b(x,y) dx dy = 2A(\bar{x} \sin\theta - \bar{y} \cos\theta + \rho) = 0 \quad (5)$$

where:  $(\bar{x}, \bar{y})$  is the center of mass of the object.

**$\Rightarrow$  The minimum inertia axis passes through the center of mass (CM) of the object !**

Translate the origin of the coordinate system in the CM:

$$x' = x - \bar{x} \quad \text{si} \quad y' = y - \bar{y}$$

$\Rightarrow$

$$x \sin\theta - y \cos\theta + \rho = x' \sin\theta - y' \cos\theta \quad (6)$$



Replacing (6) in (4):

$$E = a \sin^2 \theta - b \sin \theta \cos \theta + c \cos^2 \theta$$

where a, b, c are the 2-nd order centered moments:

$$a = \iint_{I'} (x')^2 b(x, y) dx' dy'$$

$$b = \iint_{I'} (x' y') b(x, y) dx' dy'$$

$$c = \iint_{I'} (y')^2 b(x, y) dx' dy'$$

Rewriting E as:

$$E = \frac{1}{2} (a+c) - \frac{1}{2} (a-c) \cos 2\theta - \frac{1}{2} b \sin 2\theta \quad (7)$$

**The derivative of E by  $\theta$  equaled with 0:**

$$E'_\theta = (a-c) \sin 2\theta - b \cos 2\theta = 0$$

$$\tan 2\theta = \frac{b}{a-c}$$

The case  $b=0$  and  $a=c$  correspond to the horizontal and vertical lines and should be treated separately

$$\sin 2\theta = \pm \frac{b}{\sqrt{b^2 + (a-c)^2}} \quad \text{and} \quad \cos 2\theta = \pm \frac{a-c}{\sqrt{b^2 + (a-c)^2}}$$

the positive solution  $\Rightarrow$  E-minim | the negative solution  $\Rightarrow$  E-maxim

$$\text{Shapefactor } r = \frac{L_{E \max}}{L_{E \min}} \quad (0 - \text{linie, } 1 \text{ cerc})$$

```
BW = imread('ob2.bmp');  
I = double(BW);  
  
A = regionprops(I, 'area')  
P = regionprops(I, 'perimeter')  
Euler = regionprops(I, 'EulerNumber')  
teta = regionprops(I, 'orientation')  
LEmin = regionprops(I, 'MajorAxisLength')  
LEmax = regionprops(I, 'MinorAxisLength')  
Shape_factor = LEmax.MinorAxisLength / LEmin.MajorAxisLength  
Eccentricitaty = regionprops(I, 'Eccentricity')
```

Results:

```
A = Area: 14451  
P = Perimeter: 588.3991  
Euler = EulerNumber: -1  
teta = Orientation: 27.2073  
LEmin = MajorAxisLength: 223.2852  
LEmax = MinorAxisLength: 96.1508  
Shape_factor = 0.4306  
Eccentricitaty = Eccentricity: 0.9025
```





## PROJECTIONS

Projection of an object on a line with direction  $\theta$ :

$$p_{\theta}(t) = \int_L b(t \cdot \cos \theta - s \cdot \sin \theta, t \cdot \sin \theta + s \cdot \cos \theta) ds$$

**Vertical projection ( $\theta = 0$ )**

$$v(x) = \int_L b(x, y) dy$$

**Horizontal projection ( $\theta = \pi/2$ )**

$$h(y) = \int_L b(x, y) dx$$

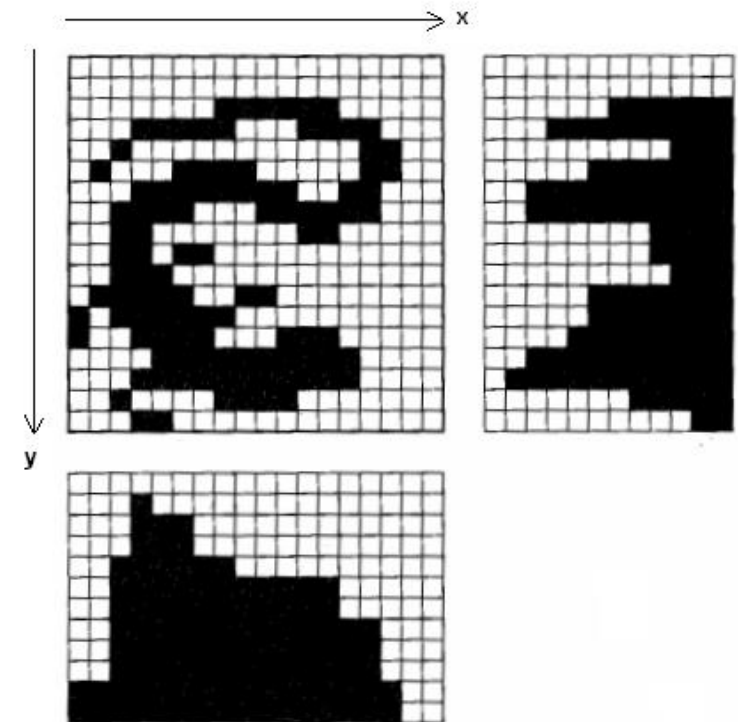
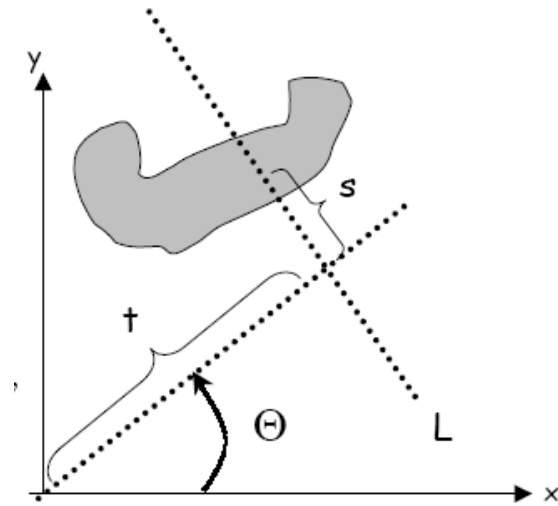
**Area**

$$A = \iint_I b(x, y) dx dy \quad ; \quad A = \int v(x) dx = \int h(y) dy$$

**Center of mass (CM)**

$$\bar{x} A = \iint_I x b(x, y) dx dy = \int x v(x) dx$$

$$\bar{y} A = \iint_I y b(x, y) dx dy = \int y h(y) dy$$



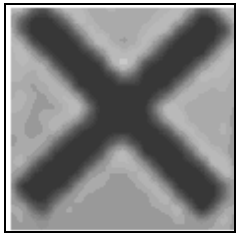
## Applications of the projections

**Problem 1: Segment / label each letter from the text**

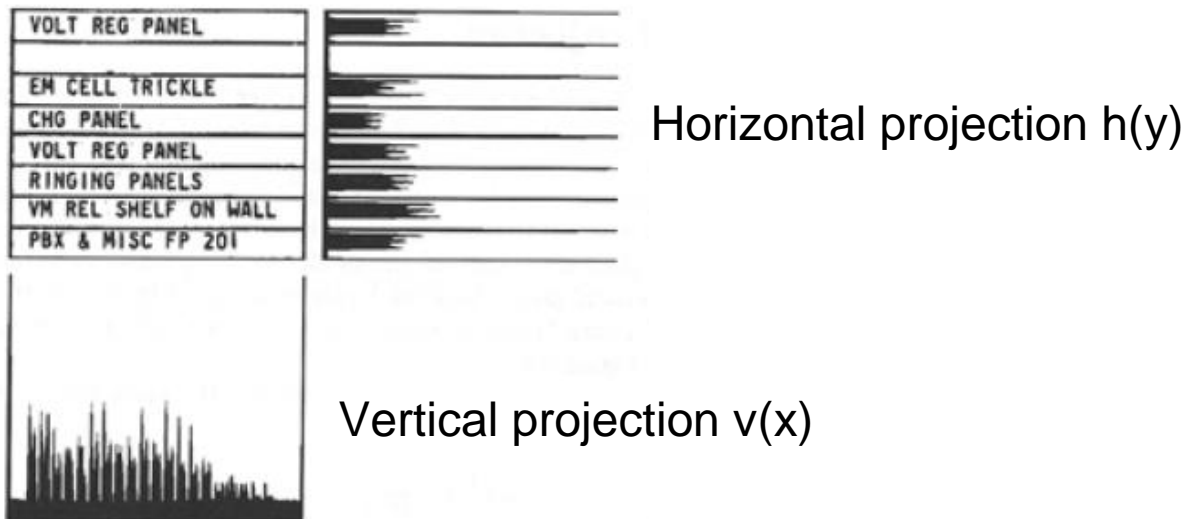
```
ABTH HGH  
AJJA  
ABSN ANS  
ALOPL
```

**Problem 2:**

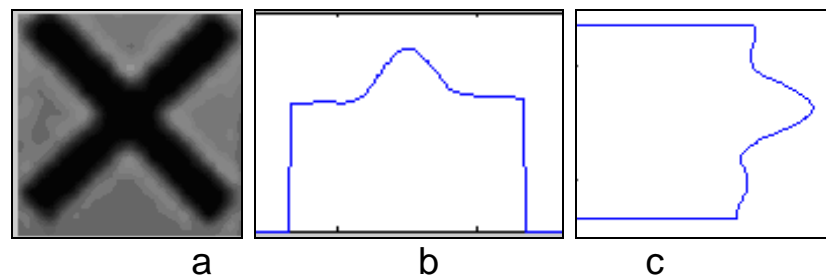
**Detect the center of the 'X' shape:**



First step in character recognition  $\Rightarrow$  detection of each character (lines and columns)



Pattern recognition / geometrical properties of shapes



- a. Rectangular region around an "X"-shape
- b. Sum of the intensities around columns;
- c. Sum of the intensities around rows





# OPERATII MORFOLOGICE

*Morphological operations*



## OPERATII MORFOLOGICE / *Morphological operations*

**Morphology** := [moprphos = shape] shape and structure of living organisms

**Mathematical morphology**  $\Rightarrow$  tools for modifying the shape / detection of components / representation and description of regions / of an object

**Set theory**  $\Rightarrow$  Language used in mathematical morphology

Let  $A$  a **set** in  $Z^2$ . If  $a = (a_1, a_2)$  is an element in  $A$ :

$$a \in A.$$

Similar, if  $a$  **is not** an element in  $A$ :

$$a \notin A.$$

Set vid zero elements:  $\emptyset$ .

Notation:  $\{ \dots \}$

Elements of the considered sets: pixels  $b(x,y)$  of binary images

## Operatuions on sets

### 1. Inclusion

$$A \subseteq B$$

### 2. Union

$$C = A \cup B$$

### 3. Intersection

$$D = A \cap B$$

### 4. Disjunctive sets (mutual exclusive)

$$A \cap B = \emptyset.$$

### 5. Complement

$$A^C = \{w \mid w \notin A\}$$

### 6. Difference

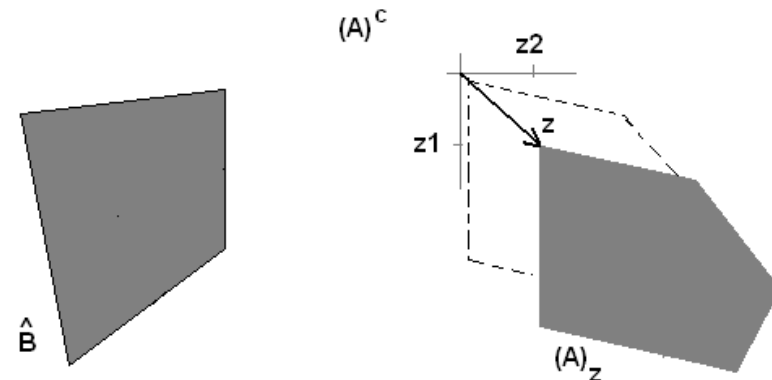
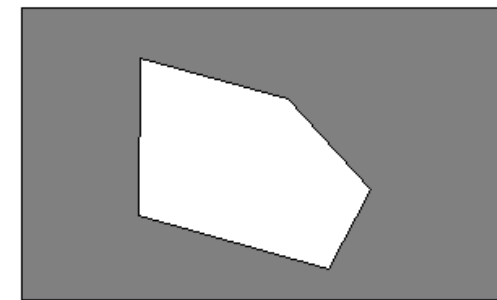
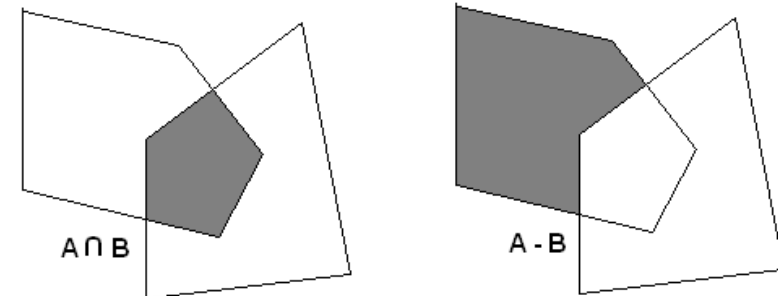
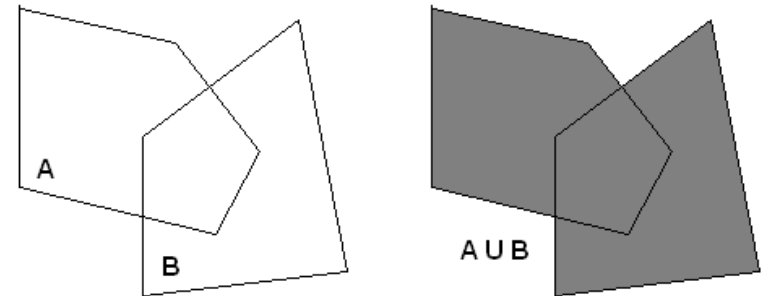
$$A - B = \{w \mid w \in A, w \notin B\} = A \cap B^C$$

### 7. Reflection (horizontal + vertical flip)

$$\hat{B} = \{w \mid w = -b, \text{ for } b \in B\}$$

### 8. Translation (of set A by $z = (z_1, z_2)$ )

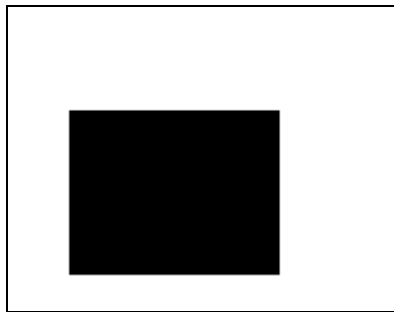
$$(A)_z = \{c \mid c = a + z, \text{ for } a \in A\}$$



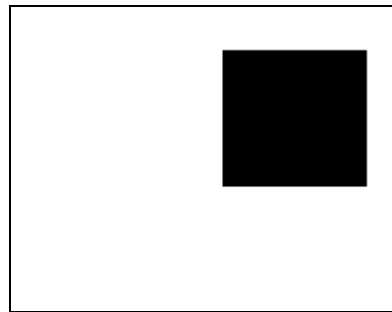
## Logical and arithmetical operations applied on sets (binary images)

- **Unary:** image **op** scalar\_operand
- **Binary:** image1 **op** image2
- Applied on pixel level !!!

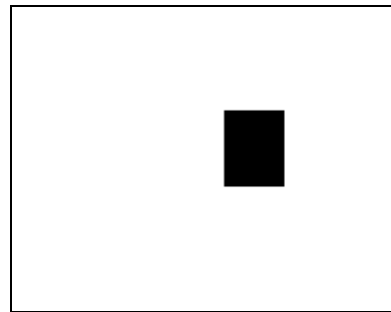
Logical operations: AND, OR, and NOT (COMPLEMENT) + combinations



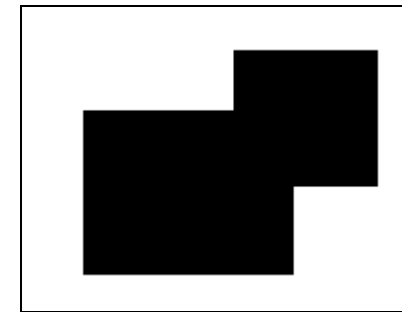
**A**



**B**



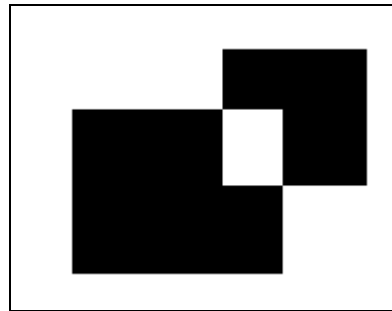
**A and B**



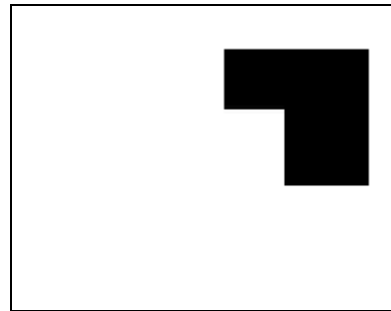
**A or B**



**not (A) = A<sup>c</sup>**



**A xor B**



**not(A) and B = B-A**



## DILATION AND EROSION

The primitives of the morphological operations !

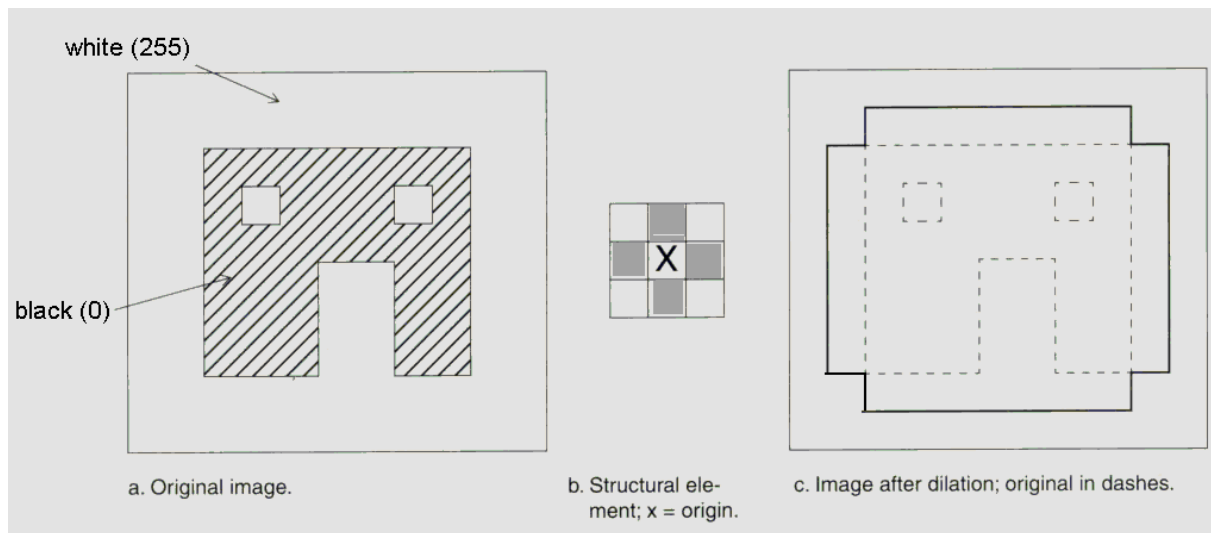
$A, B \subset \mathbb{Z}^2$

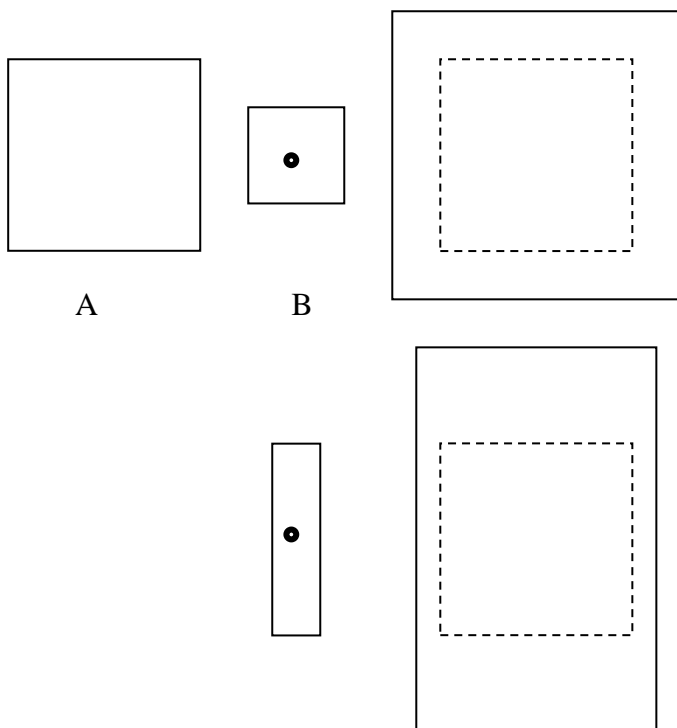
### DILATION

Dilation of  $A$  by  $B$

$$A \oplus B = \{z / (\hat{B})_z \cap A \neq \emptyset\} \quad \text{or} \quad A \oplus B = \{z / [(\hat{B})_z \cap A] \subseteq A\}$$

$B$  – structuring element

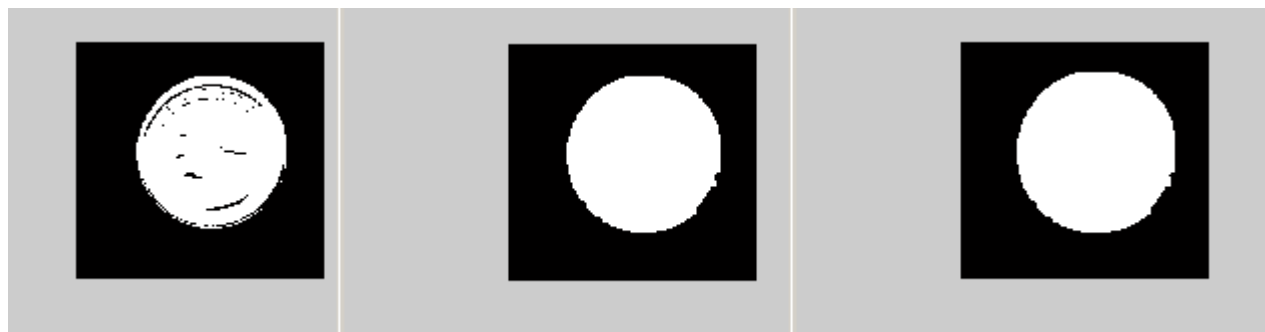




## Practical algorithm (dilation)

Apply the structuring element by systematically scanning the source image:

1. If the origin of the structuring element B is applied over a background pixel ('0')  $\Rightarrow$  do nothing
2. If the origin of the structuring element is applied over a foreground/object pixel ('1')  $\Rightarrow$  perform a logic 'OR' between the pixels of the structuring element and the overlapped image pixels.



Applications: *holes filling* ....

```
SE = strel('square',3)
BW = imread('ob1.bmp');
figure; imshow(BW);

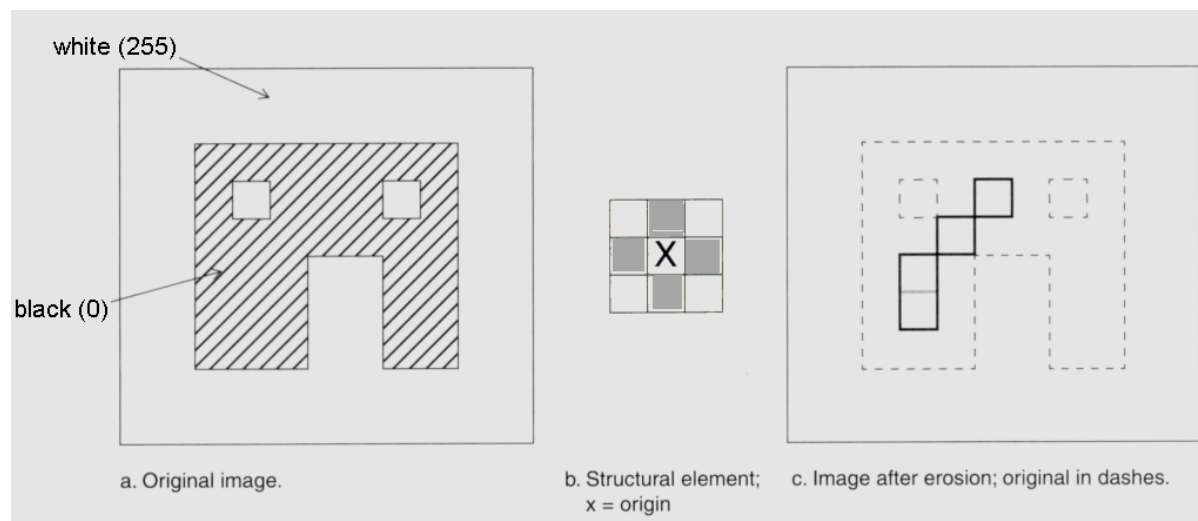
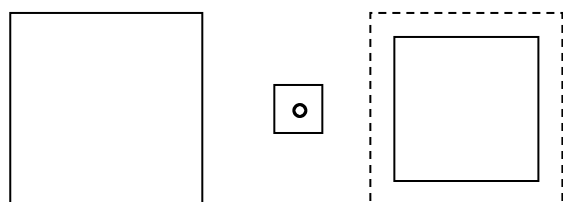
BW1 = imdilate(BW,SE);
figure; imshow(BW1);

BW2 = imdilate(BW1,SE);
figure; imshow(BW2);
```

## Erosion

Erosion of  $A$  by  $B$

$$A \ominus B = \{z | (\hat{B})_z \subseteq A\}$$



### Practical algorithm (erosion)

Apply the structuring by systematically scanning the source image:

1. If the origin of the structuring element  $B$  is applied over a background pixel ('0')  $\Rightarrow$  do nothing
2. If the origin of the structuring element is applied over a foreground/object pixel ('1') AND any of the '1' pixels of the structuring element  $B$  overlaps a background pixel ('0') in the source image  $A$  (extends outside  $A$ )  $\Rightarrow$  change the pixel in the destination image into background pixel ('0').

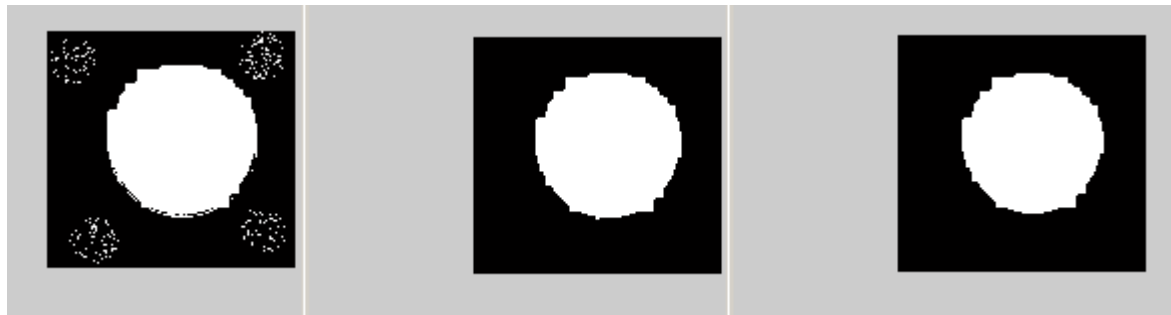
**Application:** Eliminate small objects (noise) ...

```
SE = strel('square',3)

BW = imread('ob11.bmp');
figure; imshow(BW);

BW1 = imerode(BW,SE);
figure; imshow(BW1);

BW2 = imerode(BW1,SE);
figure; imshow(BW2);
```



## OPENING and CLOSING

### Opening

$$A \circ B = (A \ominus B) \oplus B$$

**Applications:** *contour smoothing*, eliminate small objects (noise), ...

```
SE = strel('square',3)
BW = imread('ob11.bmp');
figure; imshow(BW);

BW1 = imerode(BW,SE);
figure; imshow(BW1);

BW2 = imdilate(BW1,SE);
figure; imshow(BW2);
```



## CLOSING

$$A \bullet B = (A \oplus B) \ominus B$$

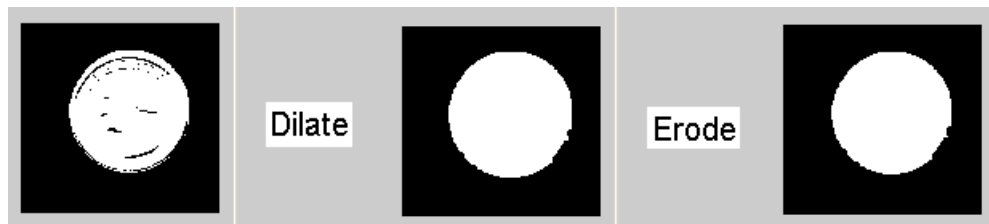
**Applications:** contour smoothing, holes filling, ...

```
SE = strel('square',3)
```

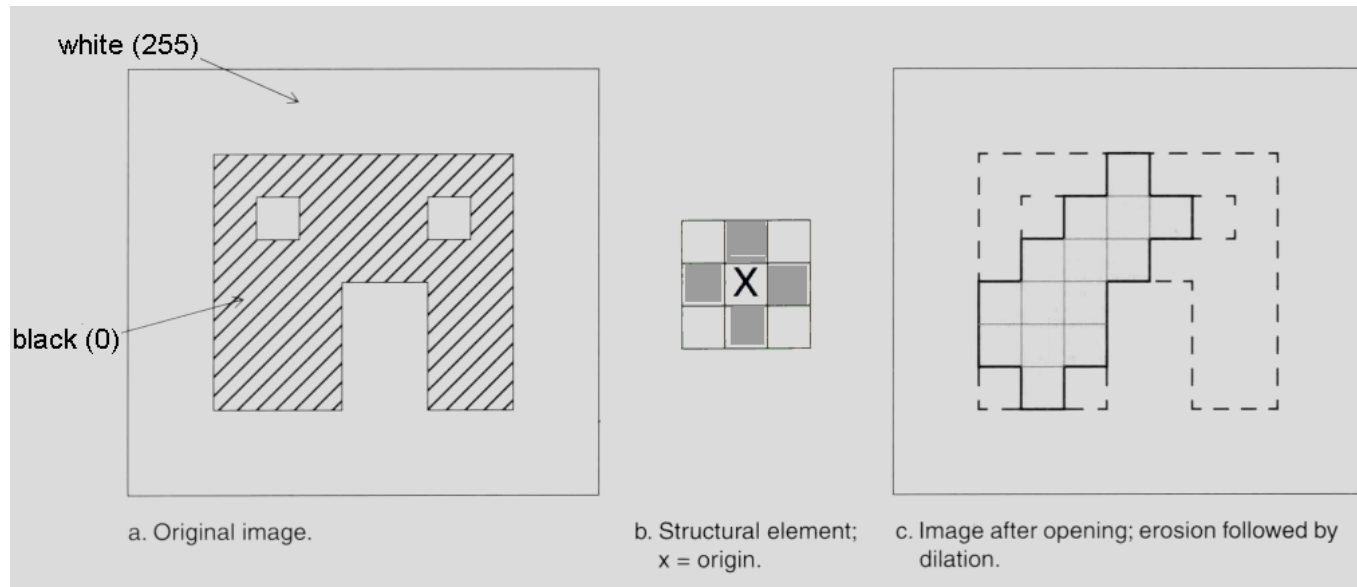
```
BW = imread('ob1.bmp');  
figure; imshow(BW);
```

```
BW1 = imdilate(BW,SE);  
figure; imshow(BW1);
```

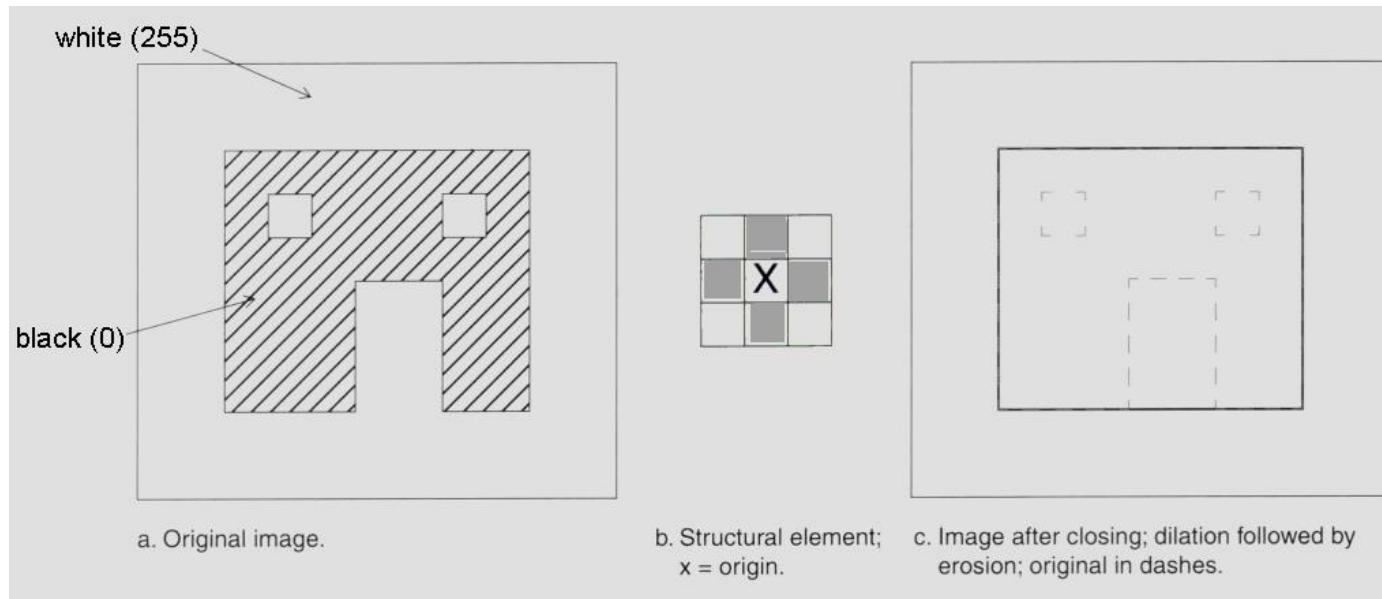
```
BW2 = imerode(BW1,SE);  
figure; imshow(BW2);
```



## Opening:



## Closing





## Properties of the morphological operators

$$1. A \oplus B = B \oplus A$$

$$2. (A \ominus B)^c = A^c \oplus B$$

$$3. A \circ B \subseteq A$$

$$4. C \subseteq D \Rightarrow C \circ B \subseteq D \circ B$$

$$5. (A \circ B) \circ B = A \circ B \quad (\text{IDEMPOTENCY})$$

$$6. A \subseteq A \bullet B$$

$$7. C \subseteq D \Rightarrow C \bullet B \subseteq D \bullet B$$

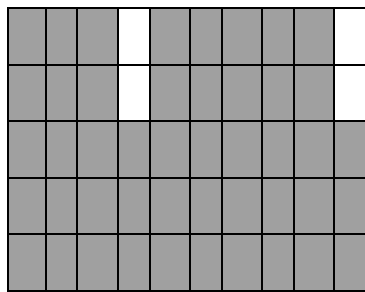
$$8. (A \bullet B) \bullet B = A \bullet B \quad (\text{IDEMPOTENCY})$$



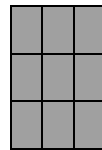
## Applications of the basic morphological operators

### Contour extraction

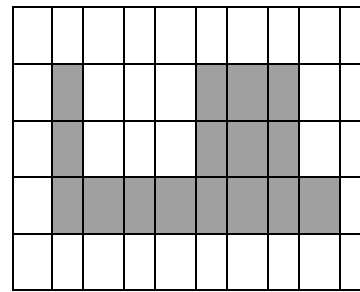
$$\beta^i(A) = A - (A \ominus B) \text{ (interior contour)}$$



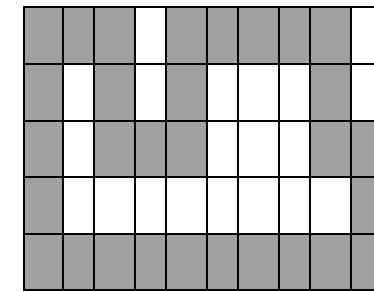
A



B



$A \ominus B$



$\beta^i(A)$

$$\beta^e(A) = (A \oplus B) - A \text{ (exterior contour)}$$

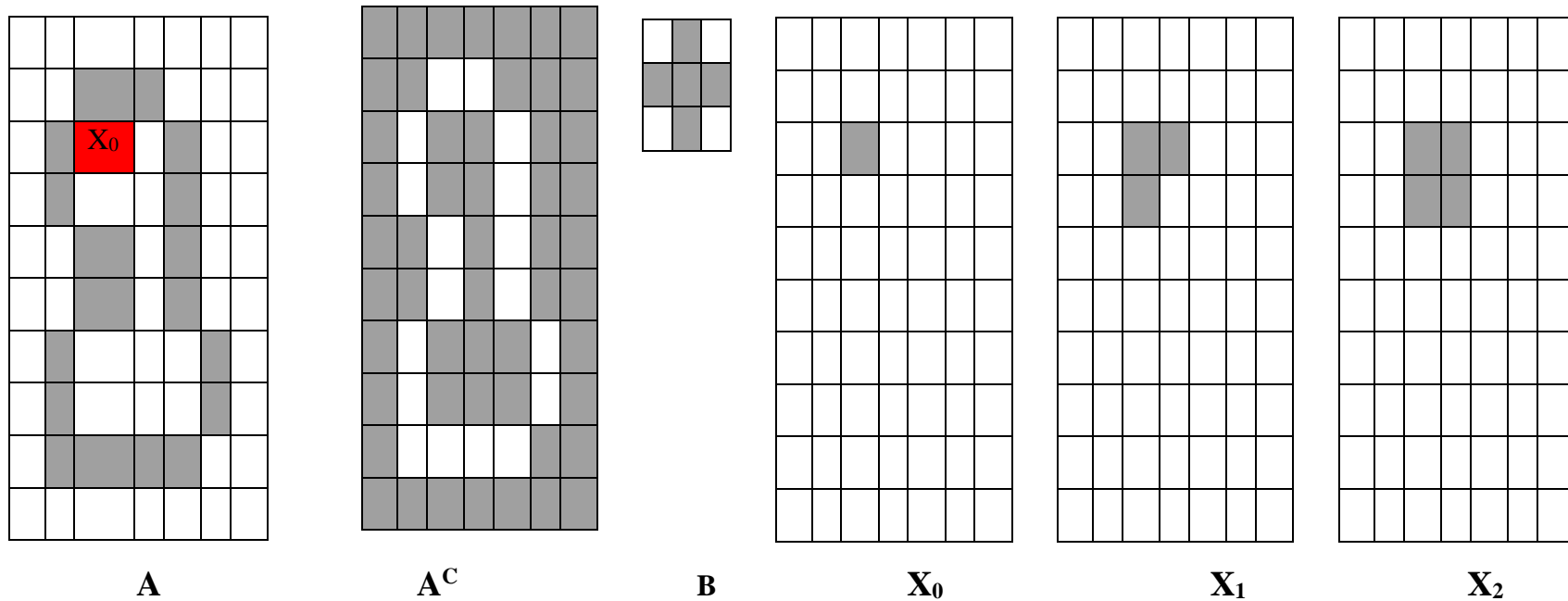
## Region filling

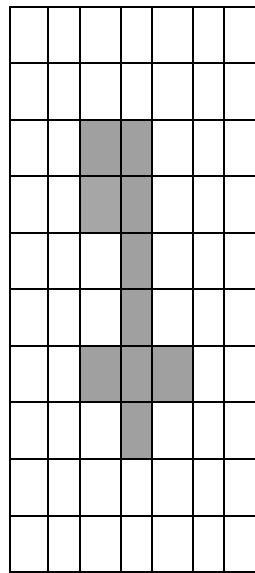
Let  $p$  a point in the interior of the contour of  $A$

1.  $X_0 = p$ , ( $p = '1'$ )
2.  $X_k = (X_{k-1} \oplus B) \cap A^c$   $k=1,2,3$ ,
3. If  $X_k = X_{k-1} \Rightarrow$  stop. Otherwise repeat 2.

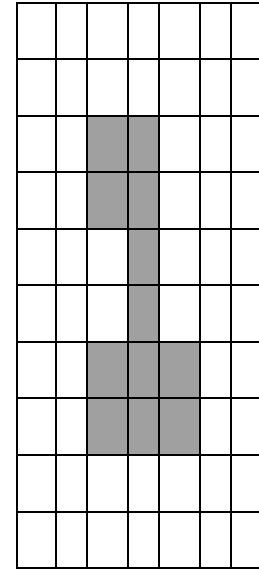
Final filled object:  $A \cup X_k$

Algorithm tracing:

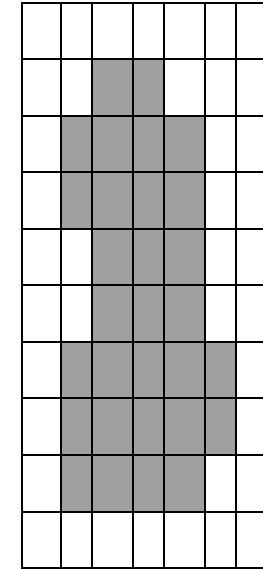




$X_6$

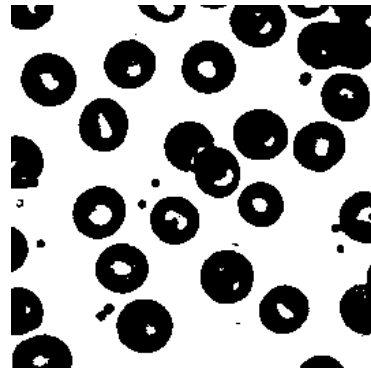
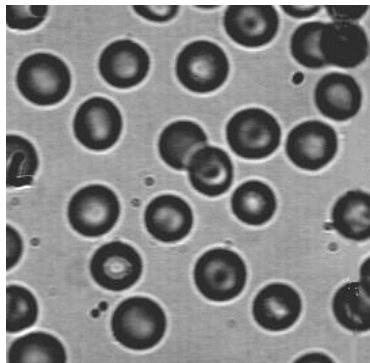


$X_7$



$X_7 \cup A$

Typical situation for usage:



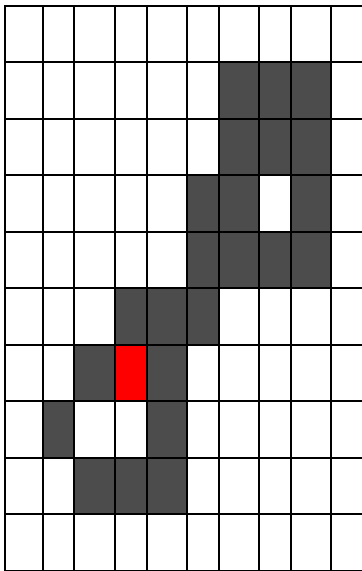
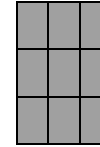
## Labeling (not efficient for large images / objects)

$A = \{ Y_1, Y_2, \dots, Y_n \}$ ,  $Y_i$  – connected components,  $Y_i \subseteq A$

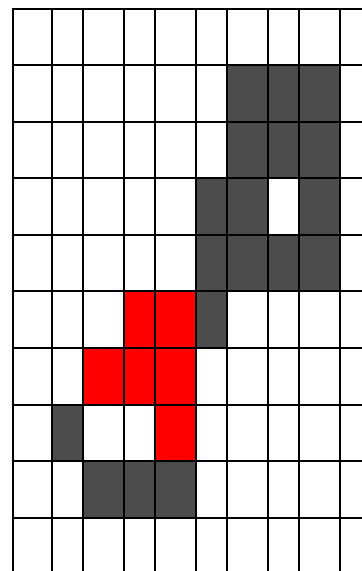
1.  $p \in Y$ .  $X_0 = p$

2.  $X_k = (X_{k-1} \oplus B) \cap A$   $k=1,2,3,\dots$

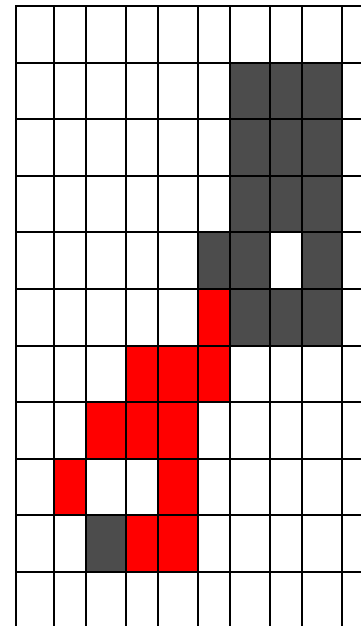
3. Dc.  $X_k = X_{k-1} \Rightarrow$  stop ( $Y_i = X_k$ ). Otherwise repeat 2.



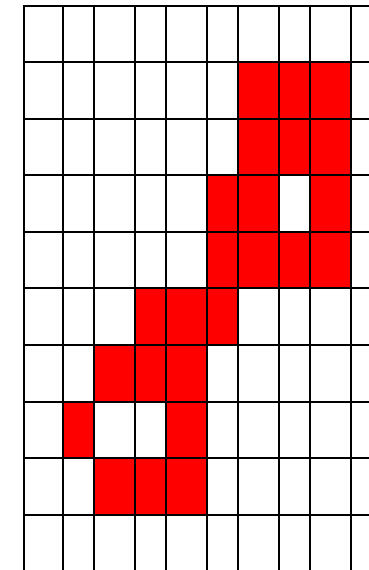
$Y, p$



$X_1$



$X_2$



$X_3 = Y$

## HIT-AND-MISS transform

Used to select pixels with specific geometrical properties: corners, isolated points, contour points, template matching, thinning, thickening etc.

The hit & miss transform of a set  $A$  by structuring elements  $(J,K)$ :

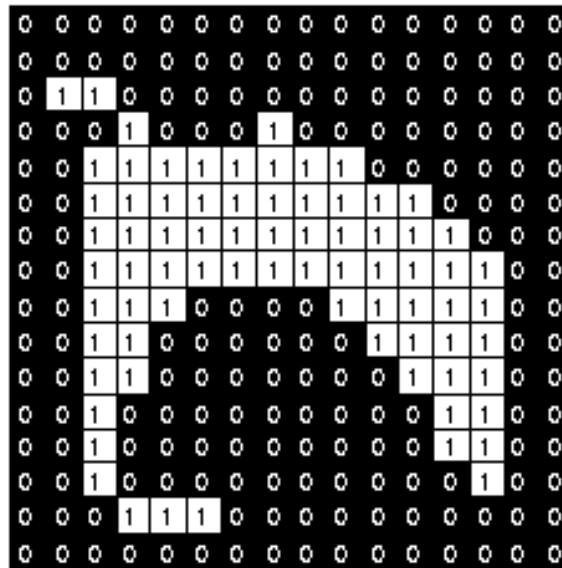
$$A \otimes (J,K) = (A \ominus J) \cap (A^c \ominus K)$$

0	0	0
	1	
1	1	1

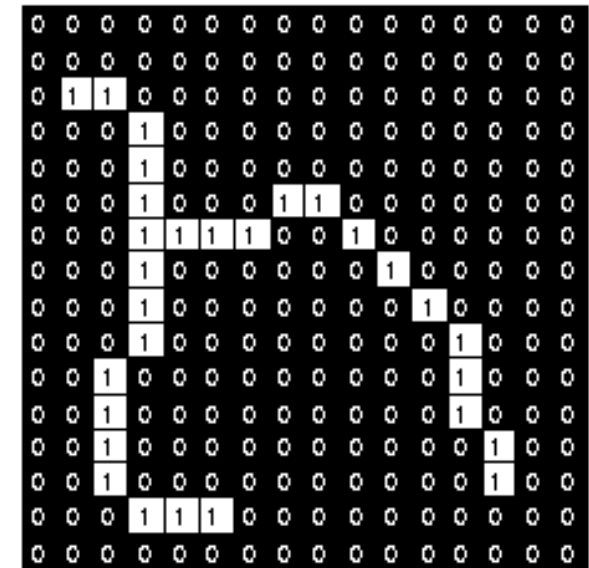
**J**

	0	0
1	1	0
	1	

**K**

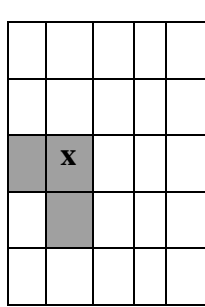


**A**

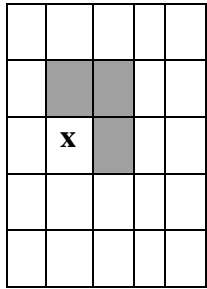


**$A \otimes (J,K)$**

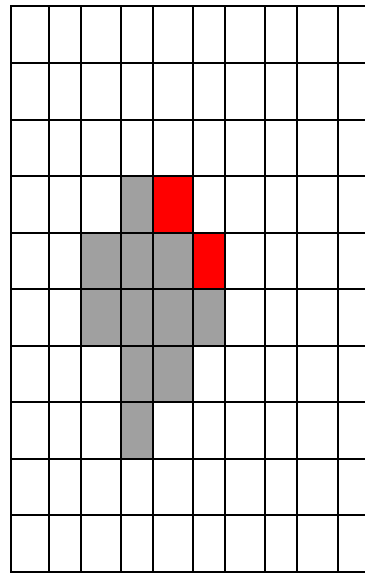
## Ex.2: Corners detection (NE)



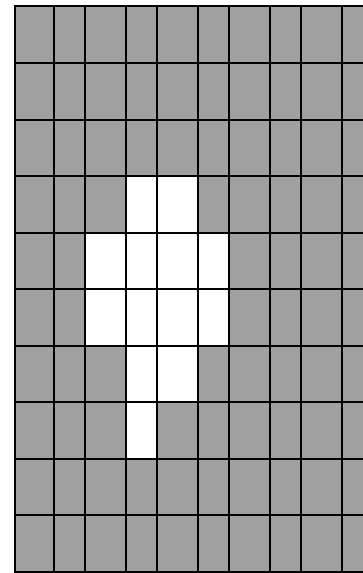
**J**



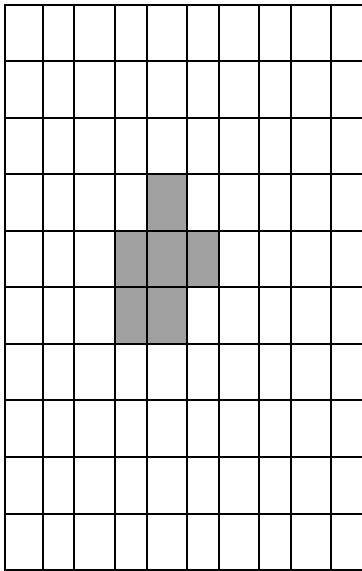
**K**



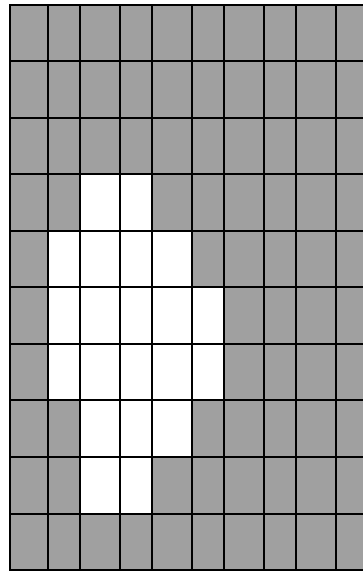
**A**



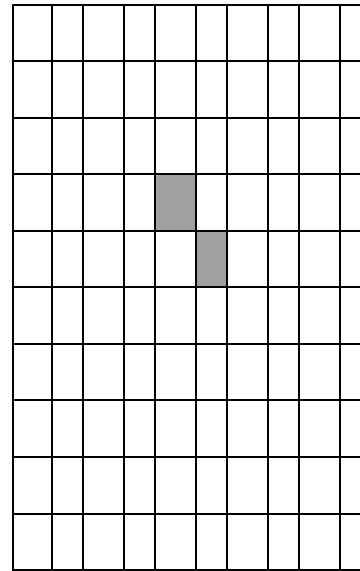
**A<sup>C</sup>**



$(A \ominus J)(A^c \ominus K)$



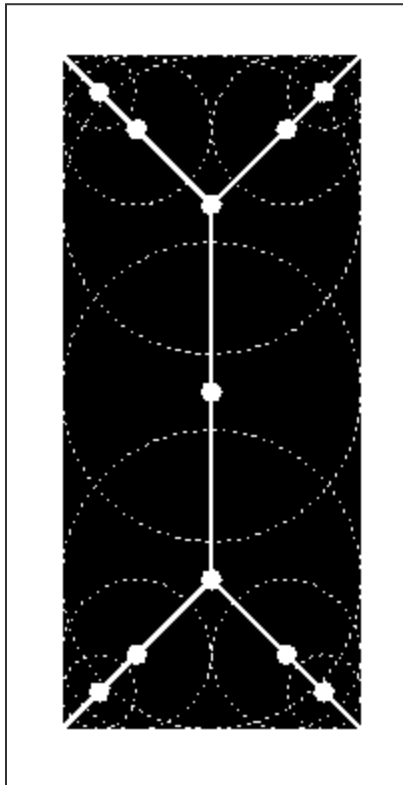
$A \otimes (J, K) = (A \ominus J) \cap (A^c \ominus K)$



### Application (Matlab)

```
BW2 = bwhitmiss(BW1, SE1, SE2)
```

## SKELETON EXTRACTION



The Skeleton of set A:

$$S(A) = \bigcup_{k=0}^K S_k(A)$$

$$S_k(A) = (A \ominus kB) - (A \ominus kB) \circ B$$

$$A \ominus kB = (\dots(A \ominus B) \ominus B) \dots \ominus B$$

$$K = \max\{k \mid (A \ominus kB) \neq \Phi\}$$

Reconstruction of set A (K – should be known):

$$A = \bigcup_{k=0}^K (S_k(A) \oplus kB)$$

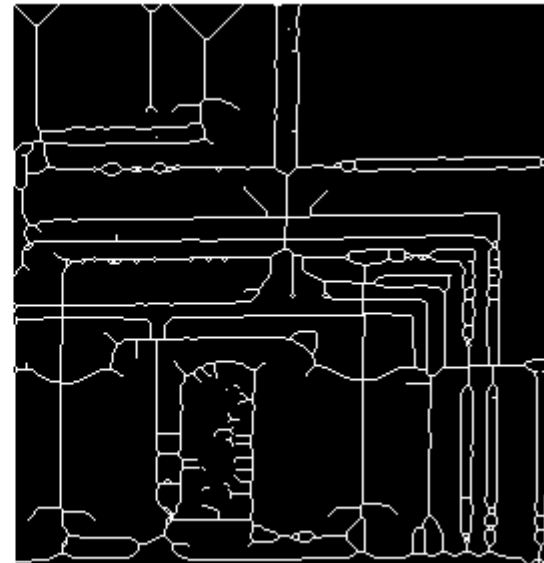


## Example:

```
BW1 = imread('circbw.tif');  
BW2 = bwmorph(BW1, 'skel', Inf);  
imshow(BW1)  
figure, imshow(BW2)
```



Original Image



Skeletonization of Image



## References:

- [1] Robert M. Haralick, Linda G. Shapiro, *Computer and Robot Vision*, Addison-Wesley Publishing Company, 1993
- [2] Rafael C. Gonzalez, *Digital Image Processing*, Prentice-Hall, 2002