



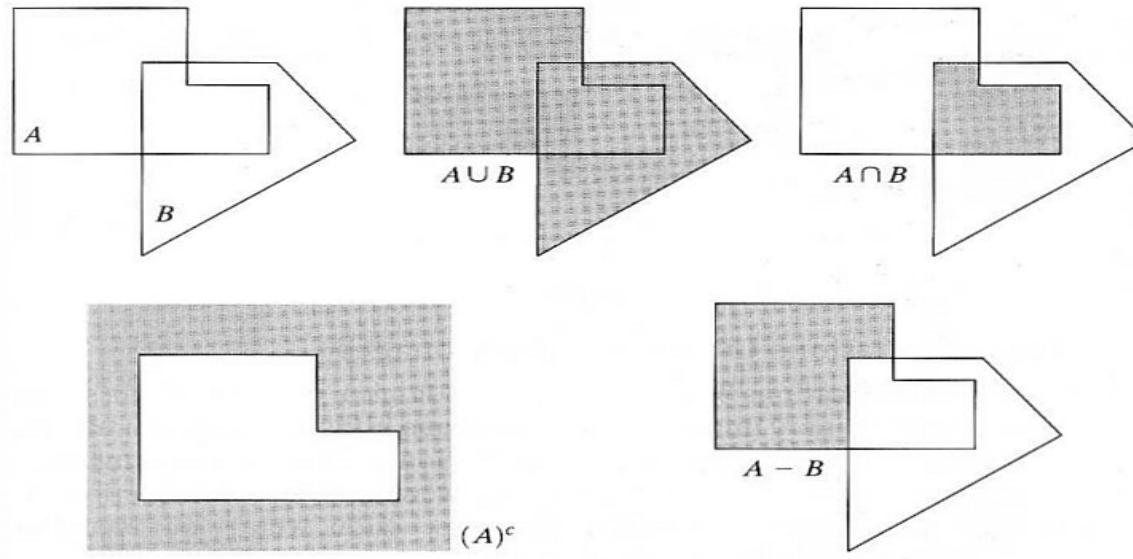
# EDGE DETECTION AND SEGMENTATION OF IMAGES, II

- Mathematical morphology
- Erosion
- Dilation
- Opening and closing
- Gray-scale morphology
- Erosion and dilation of gray-scale images
- Opening and closing of gray-scale images
- Morphologic smoothing
- Morphologic gradient
- Top-hat and bottom-hat transformations
- Boundary extraction
- Top-hat transformation and boundary extraction



# Mathematical morphology

- **Mathematical morphology** is a tool for extracting image components that are useful in the representation and description of region shape, such as boundaries, skeletons, and the convex hull
- **Morphologic techniques** for pre- or post-processing , such as morphologic filtering, thinning, and pruning
- The language of mathematical morphology is set theory





# Mathematical morphology

- In addition to the basic set definitions
- The reflection of a set  $B$  is defined as:

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

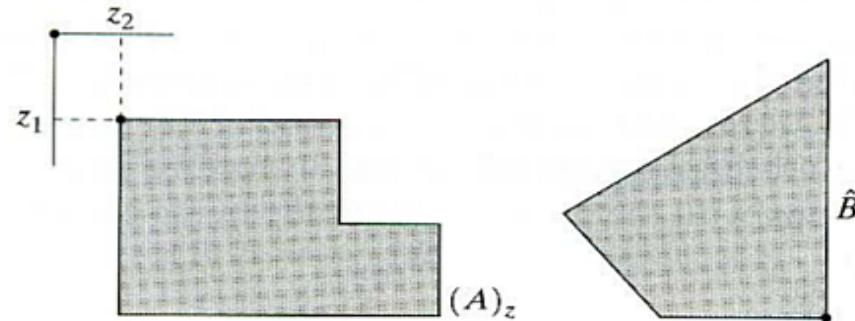
(coordinates  $(x, y)$  have been replaced by  $(-x, -y)$ )

- The translation of a set  $A$  by point  $z = (z_1, z_2)$  is defined as:

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

(coordinates  $(x, y)$  have been replaced by  $(x+z_1, y+z_2)$ )

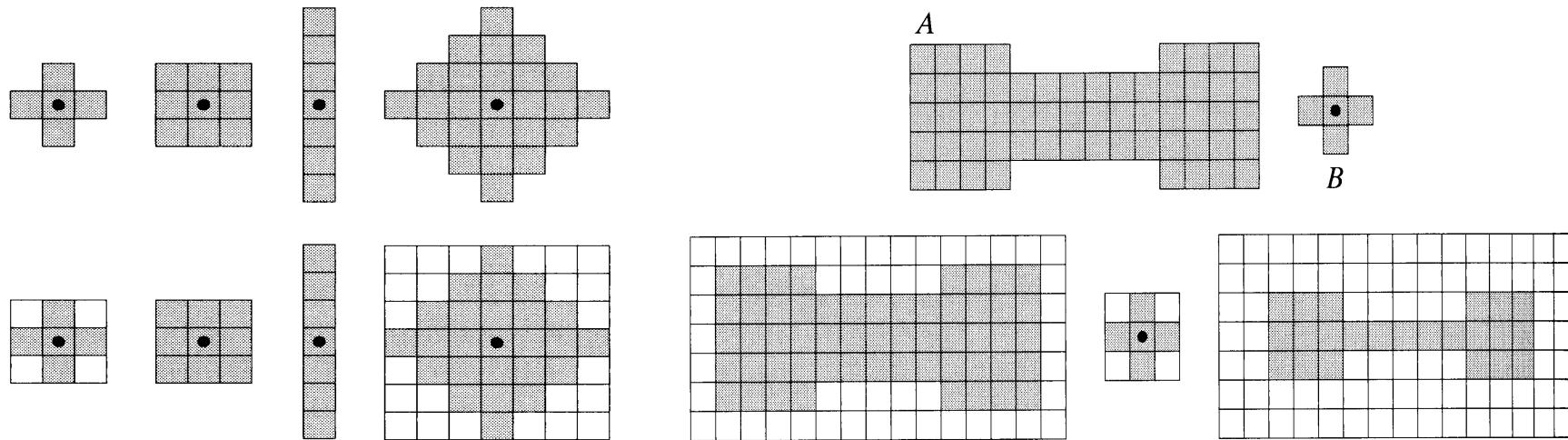
(Gonzales, Woods)





# Mathematical morphology

- **Structuring elements** are small sets or subimages used to probe an image under study for properties of interest
  - Structuring elements and structuring elements converted to rectangular arrays



(Gonzales, Woods)

# Erosion

- The **erosion** of  $A$  by  $B$  is the set of all points  $z$  such that  $B$ , translated by  $z$ , is contained in  $A$

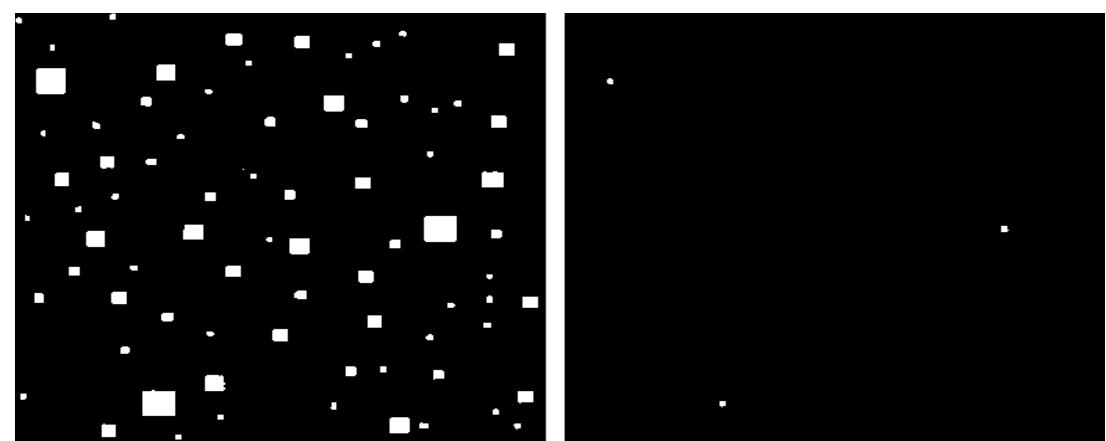
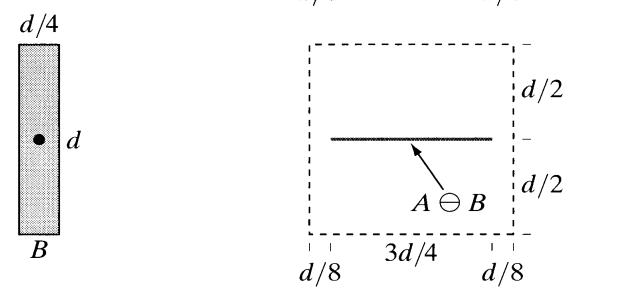
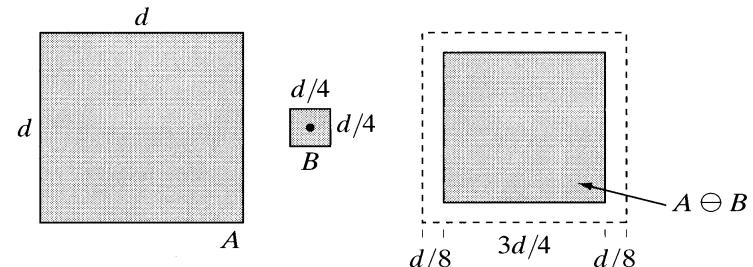
$$A \ominus B = \{z | (B)_z \subseteq A\}$$

$$A \ominus B = \{z | (B)_z \cap A^c = \emptyset\}$$

Squares of size 1, 3, 5, 7, 9, and 15 pixels

After erosion of a square structuring element of size of 13 pixels

(Gonzales, Woods)

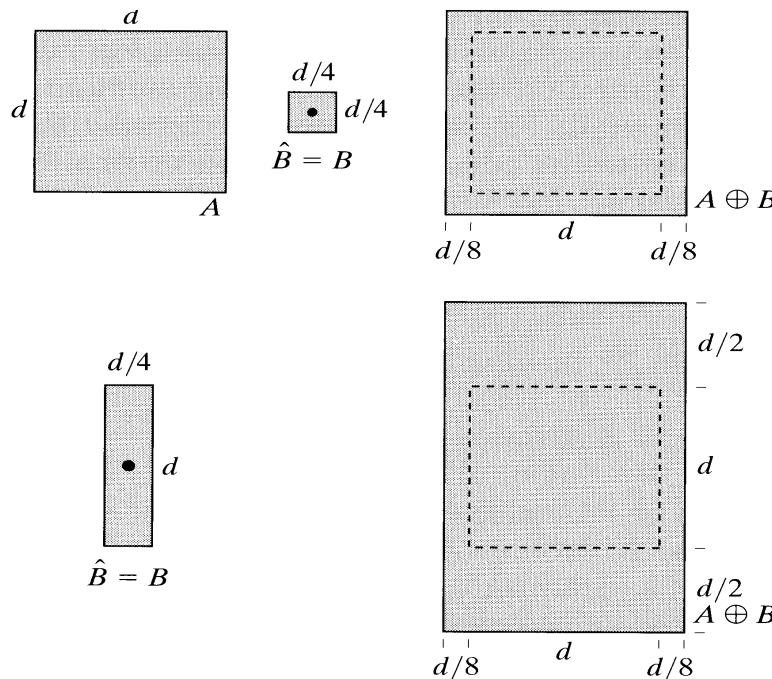


# Dilation

- The **dilation** of  $A$  by  $B$  then is the set of all displacements,  $z$ , such that  $B^z$  and  $A$  overlap by at least one element

$$A \oplus B = \{z | (\hat{B})_z \cap A \neq \emptyset\}$$

$$A \oplus B = \{z | [(\hat{B})_z \cap A] \subseteq A\}$$



Historically, certain computer programs were written using only two digits rather than four to define the applicable year. Accordingly, the company's software may recognize a date using "00" as 1900 rather than the year 2000.



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0	1	0
1	1	1
0	1	0

(Gonzales, Woods)

# Opening and closing

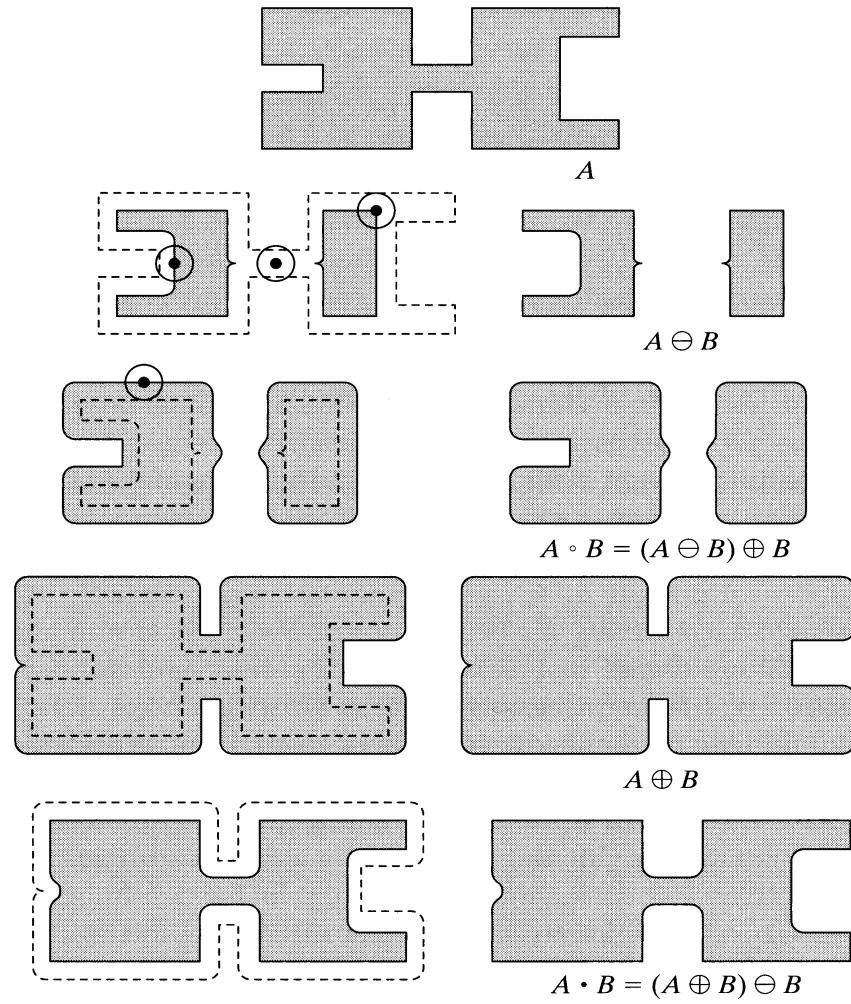
- The **opening** generally smooths the contour of an object, breaks **narrow isthmuses**, and eliminates **thin protrusions**

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

- The **closing** also tends to smooth sections of contours but, as opposite to opening, it generally fuses **narrow breaks** and **long gulfs**, eliminate **small holes**, and fills **gaps** in the contour

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

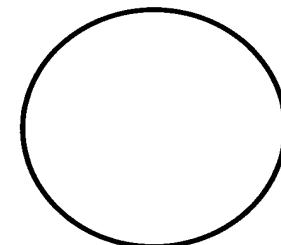
(Gonzales, Woods)



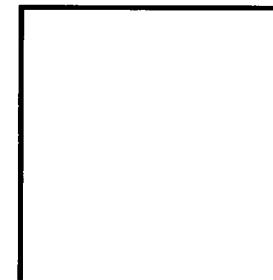


# Gray-scale morphology

- The basic operations of erosion, dilation, opening, and closing can be used to process gray-scale images
- Structuring elements in gray-scale morphology belong to one of two categories: *nonflat* and *flat*
- They are used as “probes” to examine a given image for specific properties
- Flat structuring element (SE)



Flat SE



Intensity profile

(Gonzales, Woods)

Biomedical signal and image processing



# Erosion and dilation of gray-scale images

- The **erosion** of an image  $f$  by a **flat** structuring element  $b$  at any location  $(x,y)$  is defined as the **minimum** value of the image in the region coincident with  $b$  when the origin of  $b$  is at  $(x,y)$

$$[f \ominus b](x, y) = \min_{(s, t) \in b} \{f(x + s, y + t)\}$$

- To find the erosion of  $f$  by  $b$ , similar to spatial **correlation**, we place the origin of the structuring element to every pixel location in the image
- The **dilation** of an image  $f$  by a **flat** structuring element  $b$  at any location  $(x,y)$  is defined as the **maximum** value of the image in the window outlined by  $b^\wedge$  ( $b^\wedge = b(-x, -y)$ ) when the origin of  $b^\wedge$  is at  $(x,y)$

$$[f \oplus b](x, y) = \max_{(s, t) \in b} \{f(x - s, y - t)\}$$

- To find the dilation of  $f$  by  $b$ , similar to spatial **convolution**, we place the origin of the structuring element to every pixel location in the image



# Opening and closing of gray-scale images

- The **opening** of an image  $f$  by structuring element  $b$  at any location  $(x,y)$  is:

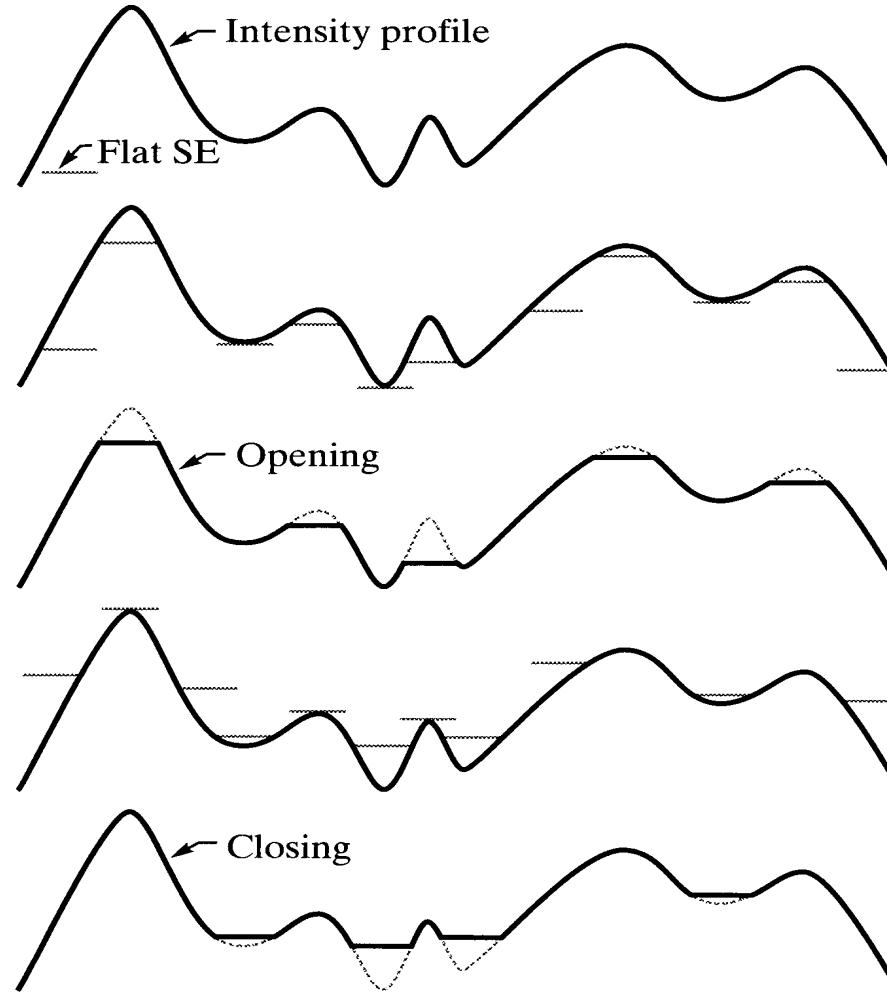
$$f \circ b = (f \ominus b) \oplus b$$

- Opening is simply the erosion of  $f$  by  $b$ , followed by a dilation of the result with  $b$
- The **closing** of  $f$  by structuring element  $b$  at any location  $(x,y)$  is

$$f \bullet b = (f \oplus b) \ominus b$$

- Closing is simply the dilation of  $f$  by  $b$ , followed by an erosion of the result with  $b$

# Opening and closing of gray-scale images



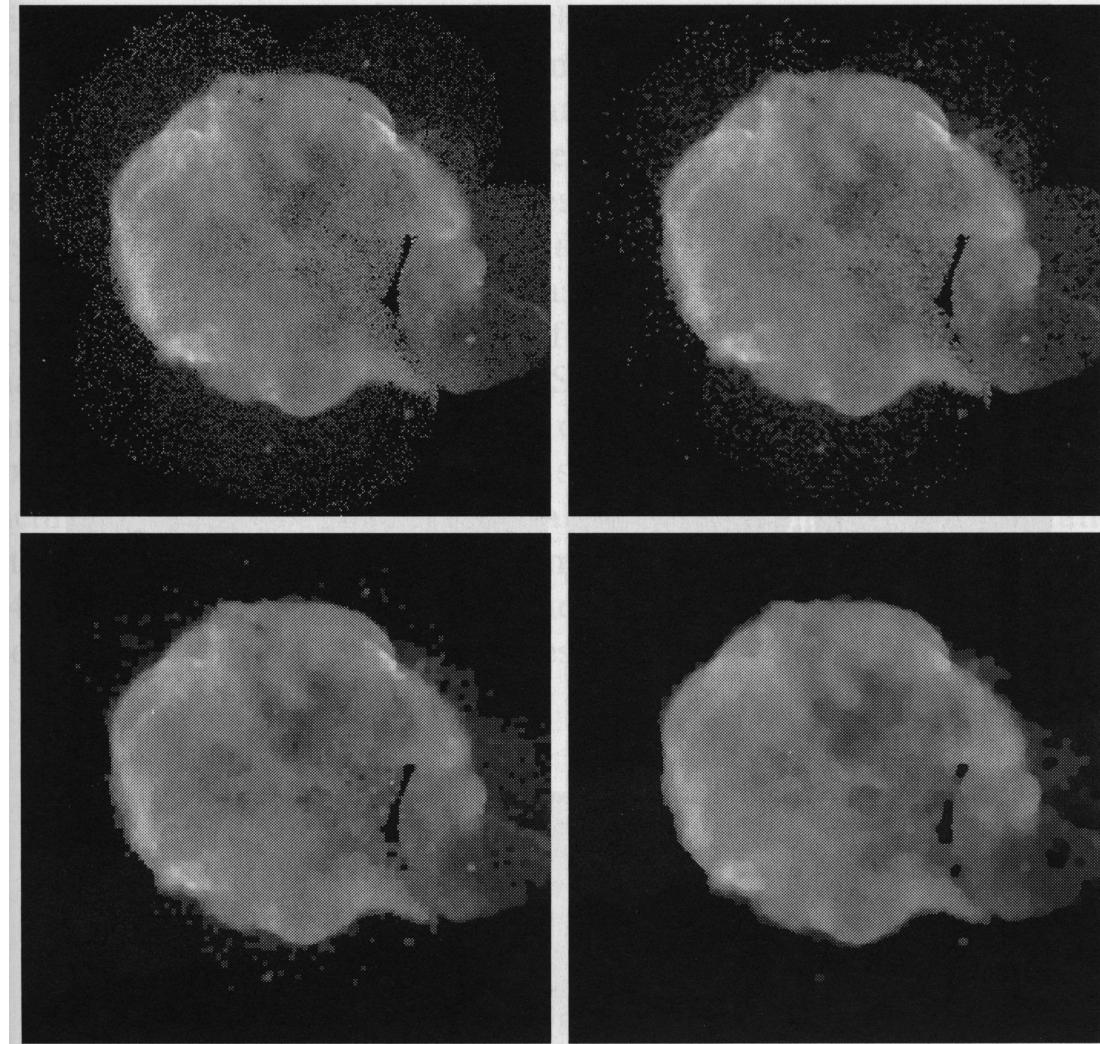
(Gonzales, Woods)

# Morphologic smoothing

- Morphologic smoothing is performed by opening the original image with a structuring element (disk of given radii (1, 3, 5)) and then closing the opening with a structuring element of the same size



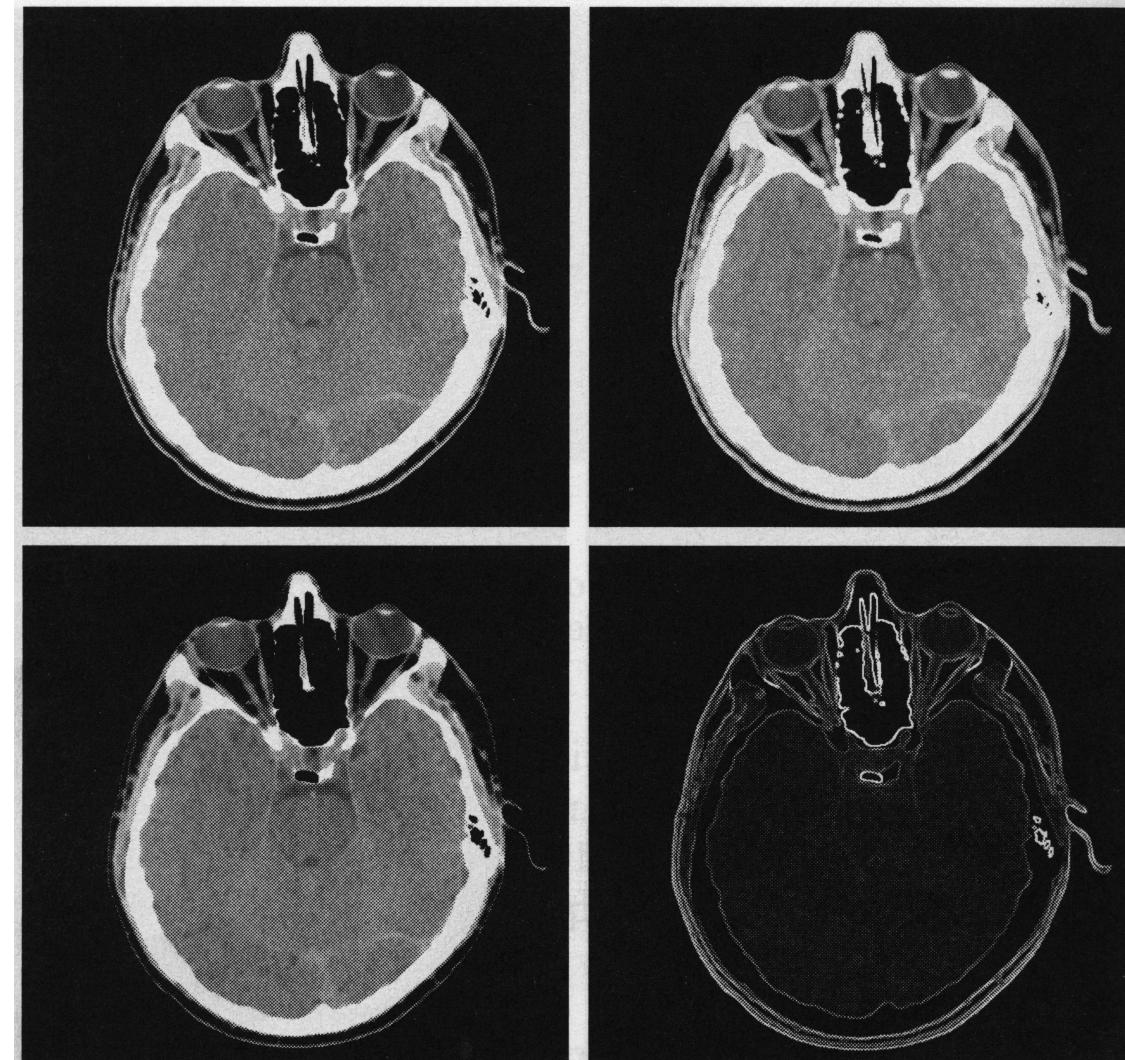
- Morphologic smoothing is performed by alternating sequential filtering in which the opening-closing sequence starts with original image, but subsequent steps perform the opening and closing on the results of the previous step



(Gonzales, Woods)

# Morphologic gradient

- **Objective:** to extract **the edges** of the outer contour of the brain (the gray region), **the contour of the spinal region** (directly behind the nose, toward the front of the brain), and **the outer contour of the head**
- **Objective:** to generate the thinnest, continuous contours possible, while eliminating edge details related to the gray content in the eyes and brain areas



(Gonzales, Woods)

# Morphologic gradient

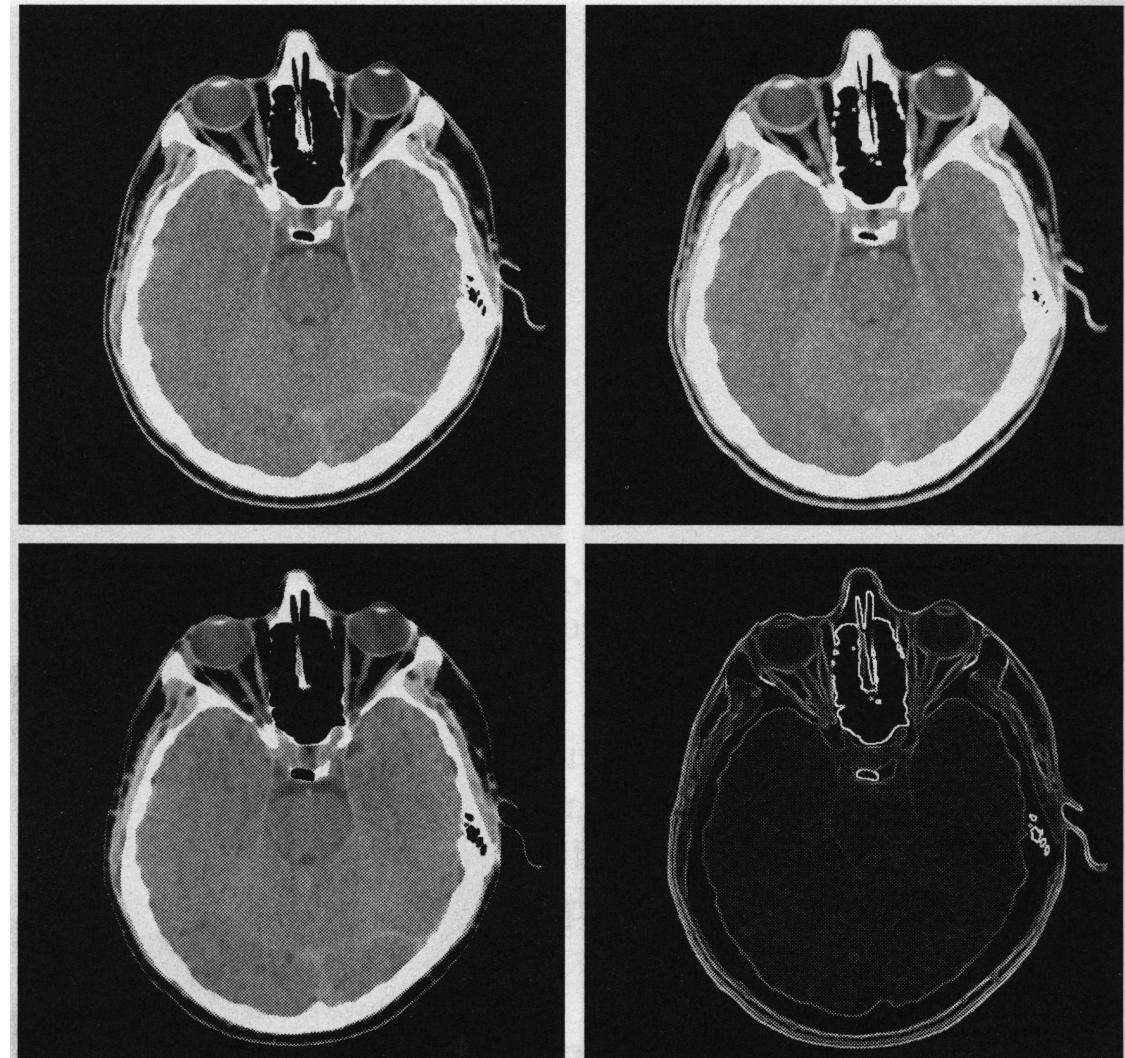
- Morphologic gradient of an image can be obtained by subtraction of dilation of the image and erosion of the image:

$$g = (f \oplus b) - (f \ominus b)$$

- (a) (b)
- (c) (d)

- (a) 512 x 512 image of a head CT scan
- (b) Dilation
- (c) Erosion
- (d) Morphologic gradient computed as the difference between (b) and (c)

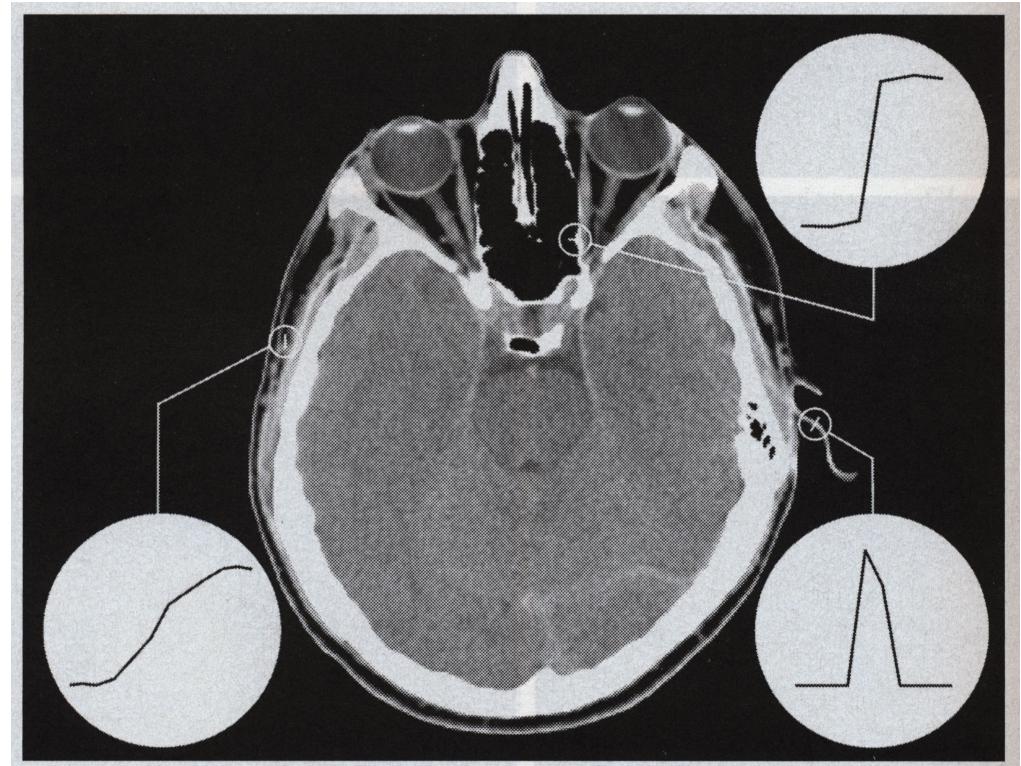
(Gonzales, Woods)



# Morphologic gradient

- **Exercises 3**

- Detecting contours of human organs in CT images using gray-scale morphologic algorithms



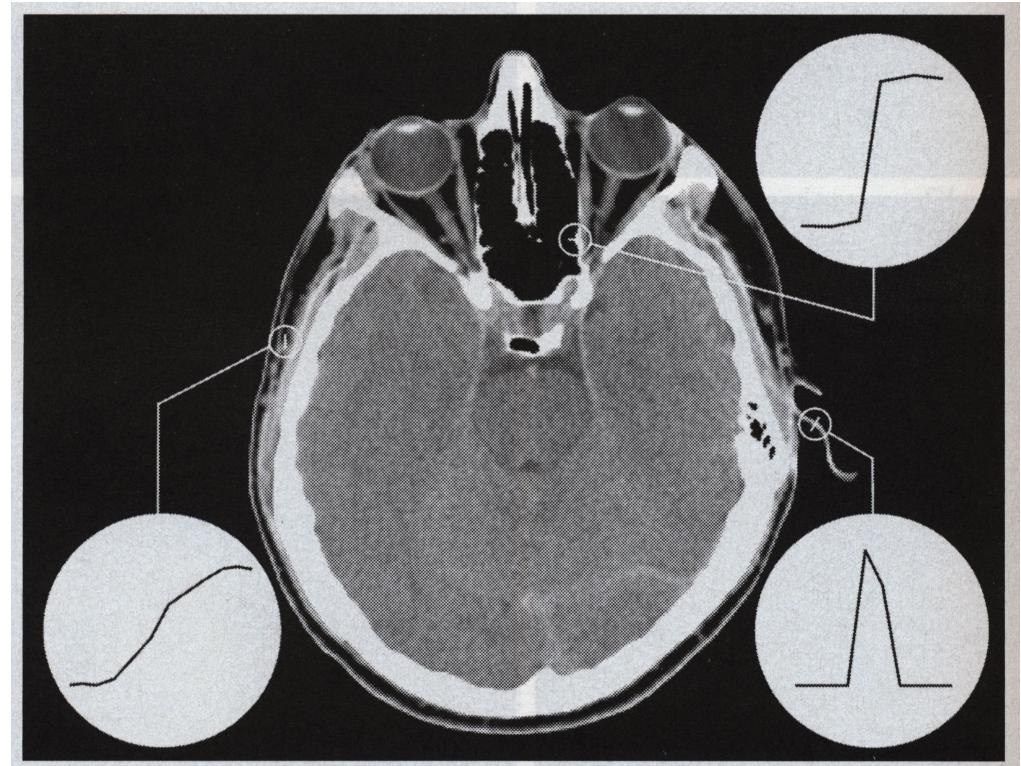
(Gonzales, Woods)

Biomedical signal and image processing

# Morphologic gradient

- **Exercises 3**

- Detecting contours of human organs in CT images using gray-scale morphologic algorithms  
(hint: link edges between image slices using 24-connectivity)



(Gonzales, Woods)

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# Top-hat and bottom-hat transformations

- The top-hat transformation of a gray-scale image  $f$  is defined as  $f$  minus its opening:

$$T_{\text{hat}}(f) = f - (f \circ b)$$

- The bottom-hat transformation of  $f$  is defined as the closing of  $f$  minus  $f$ :

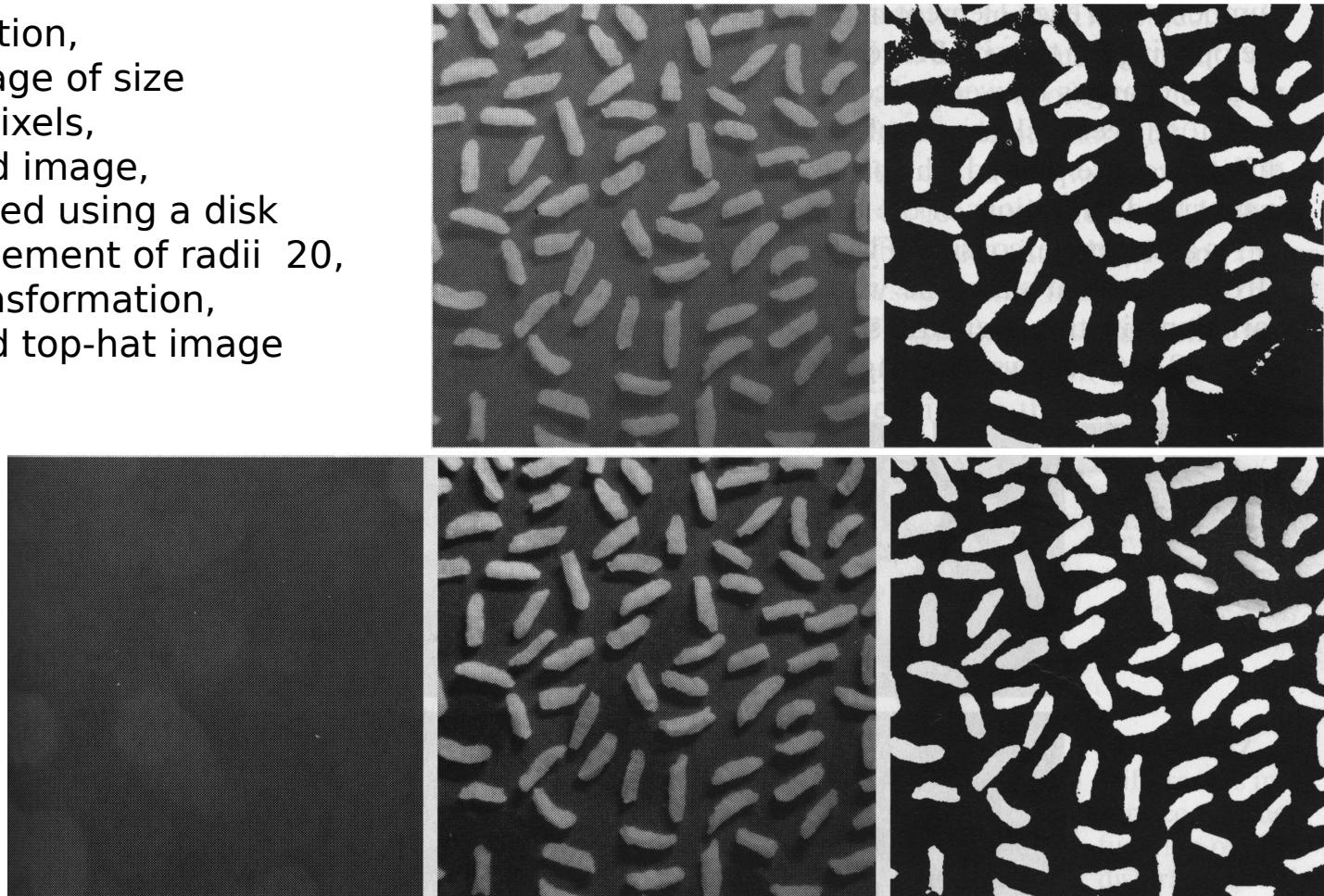
$$B_{\text{hat}}(f) = (f \bullet b) - f$$

- Principal applications of these transformations is in removing objects from an image by using a structuring element in the opening or closing operation that does not fit to the objects to be removed (the difference operation than yields an image in which only the removed components remain)
- The top-hat transformation is used for light objects on a dark background
- The bottom-hat transformation is used for dark objects on a light background
- An important use of top-hat transformations is in correcting the effects of nonuniform illumination
  - Proper (uniform) illumination plays a central role in the process of extracting objects from the background (i.e., in segmentation of images)



# Top-hat and bottom-hat transformations

- Shading correction,
  - (a) Original image of size  $600 \times 600$  pixels,
  - (b) Thresholded image,
  - (c) Image opened using a disk structural element of radii 20,
  - (d) Top-hat transformation,
  - (e) Thresholded top-hat image



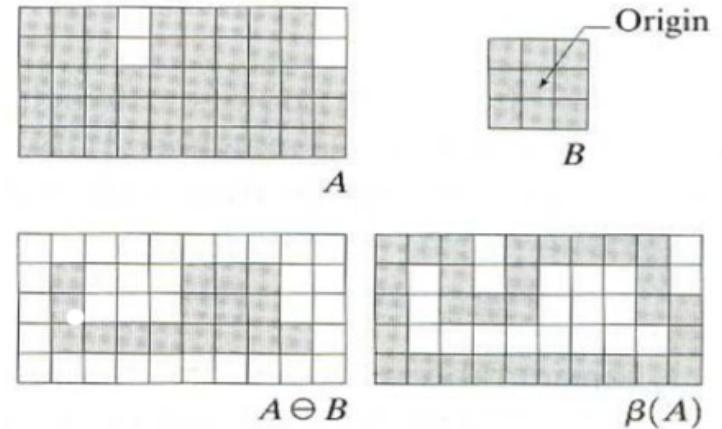
(Gonzales, Woods)

# Boundary extraction

- **Boundary extraction**

The boundary of a set  $A$  can be obtained by first eroding  $A$  by  $B$  (a suitable structuring element) and then performing the set difference between  $A$  and its erosion

$$\beta(A) = A - (A \ominus B)$$



(Gonzales, Woods)



# Top-hat transformation and boundary extraction

- Detecting flecks/drusen in OCT retinal images using top-hat transformation (left, right), detecting geographic atrophy in OCT retinal images using boundary extraction (left)

