

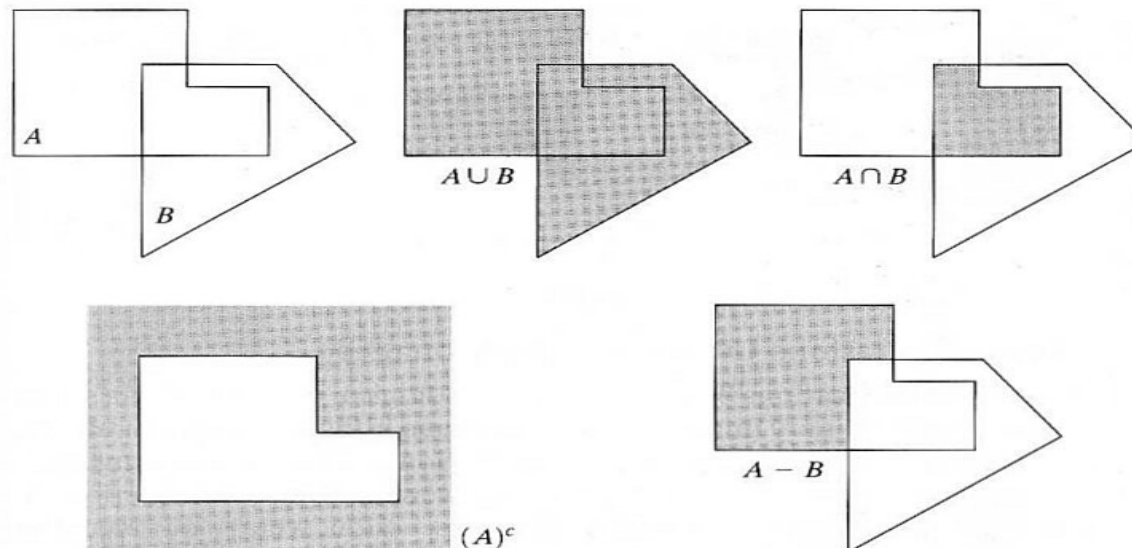


EDGE DETECTION AND SEGMENTATION OF IMAGES, II

- 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
- **Morphological techniques** for pre- or post-processing , such as morphological 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:

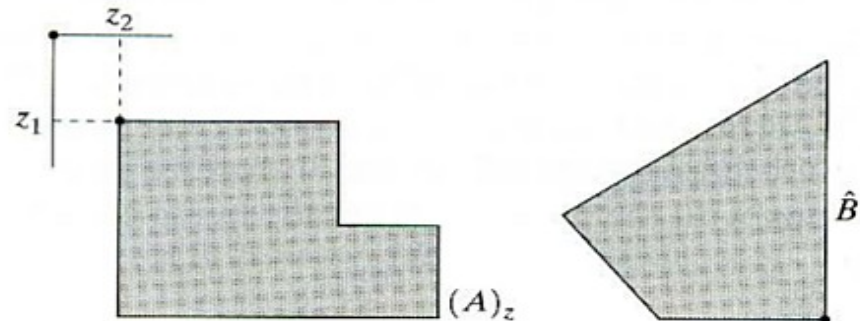
$$\hat{B} = \{w \mid w = -b, \text{ for } b \in B\}$$

(coordinates (x, y) have been replaced by $(-x, -y)$)

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

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

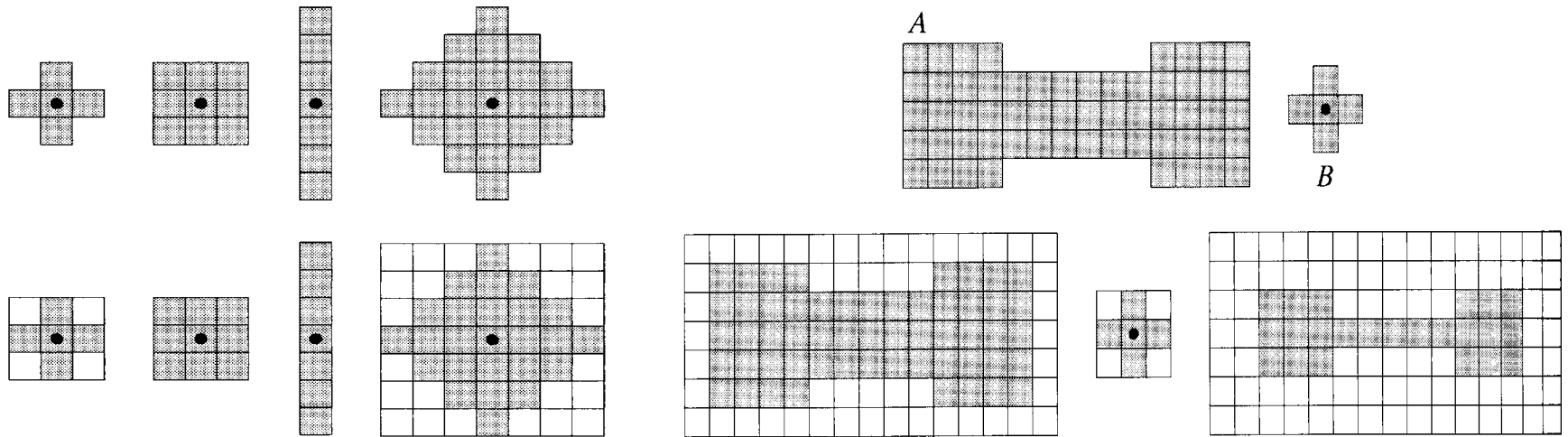
(coordinates (x, y) have been replaced by $(x + z_1, y + z_2)$)



(Gonzales, Woods)

Mathematical morphology

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



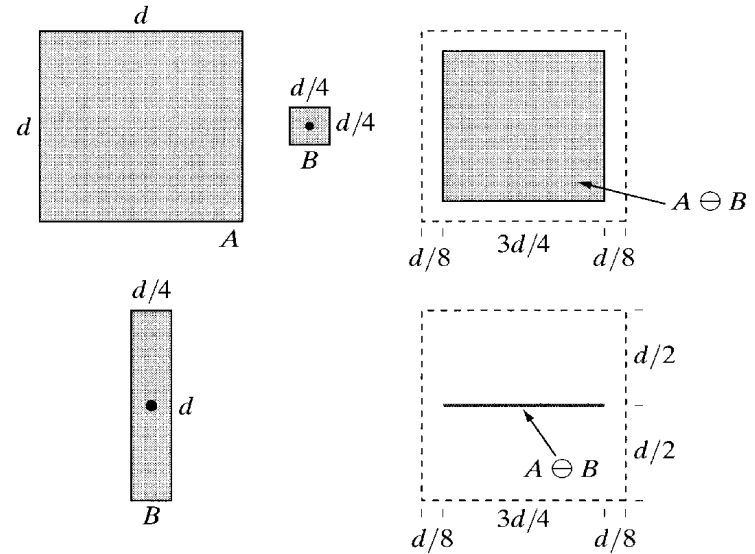
(Gonzales, Woods)

Erosion

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

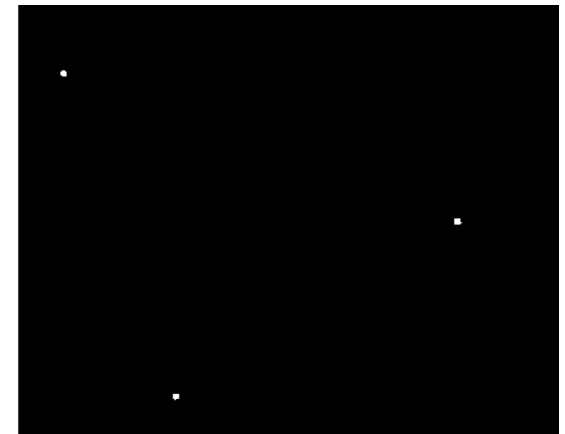
$$A \ominus B = \{z | (B)_z \subseteq A\}$$

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



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

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



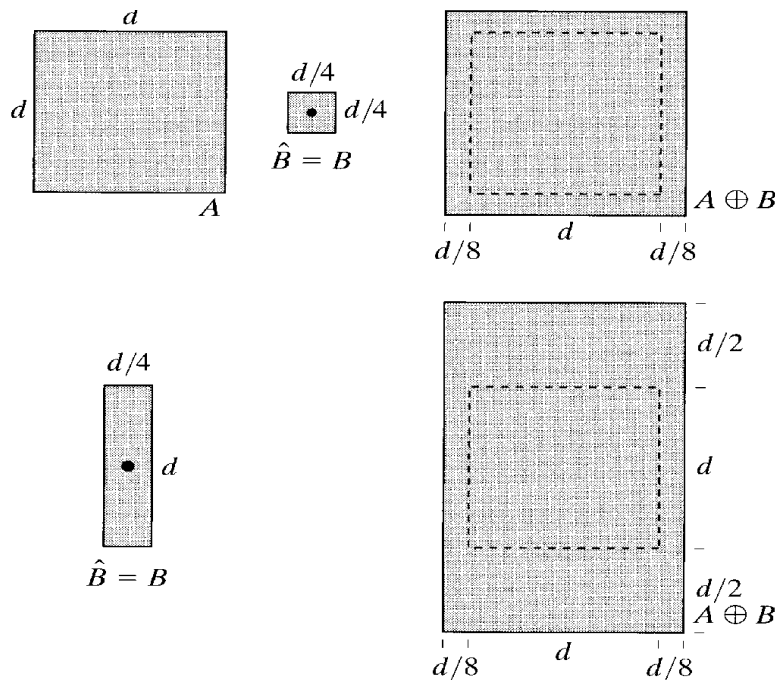
(Gonzales, Woods)

Dilation

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

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

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



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

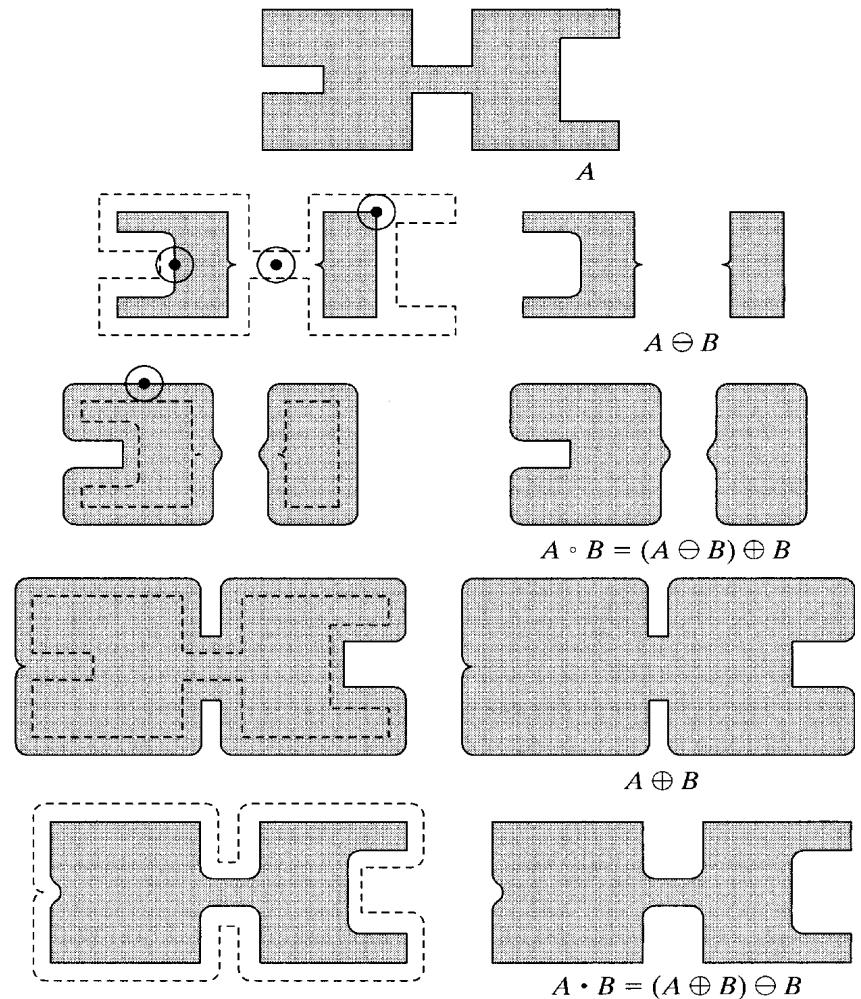
- The **opening** generally smooths the contour of an object, breaks **narrow isthmuses**, and eliminates **thin protrusions**

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

- 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

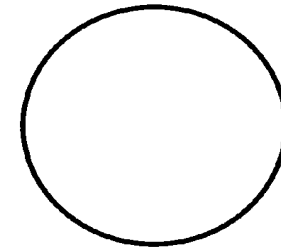
$$A \bullet B = (A \oplus B) \ominus B$$

(Gonzales, Woods)

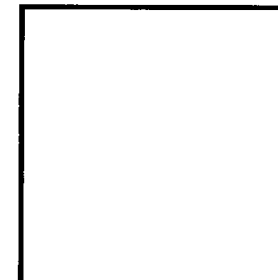


Gray-scale morphology

- 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

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 \hat{b} when the origin of \hat{b} 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 reflected 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:

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

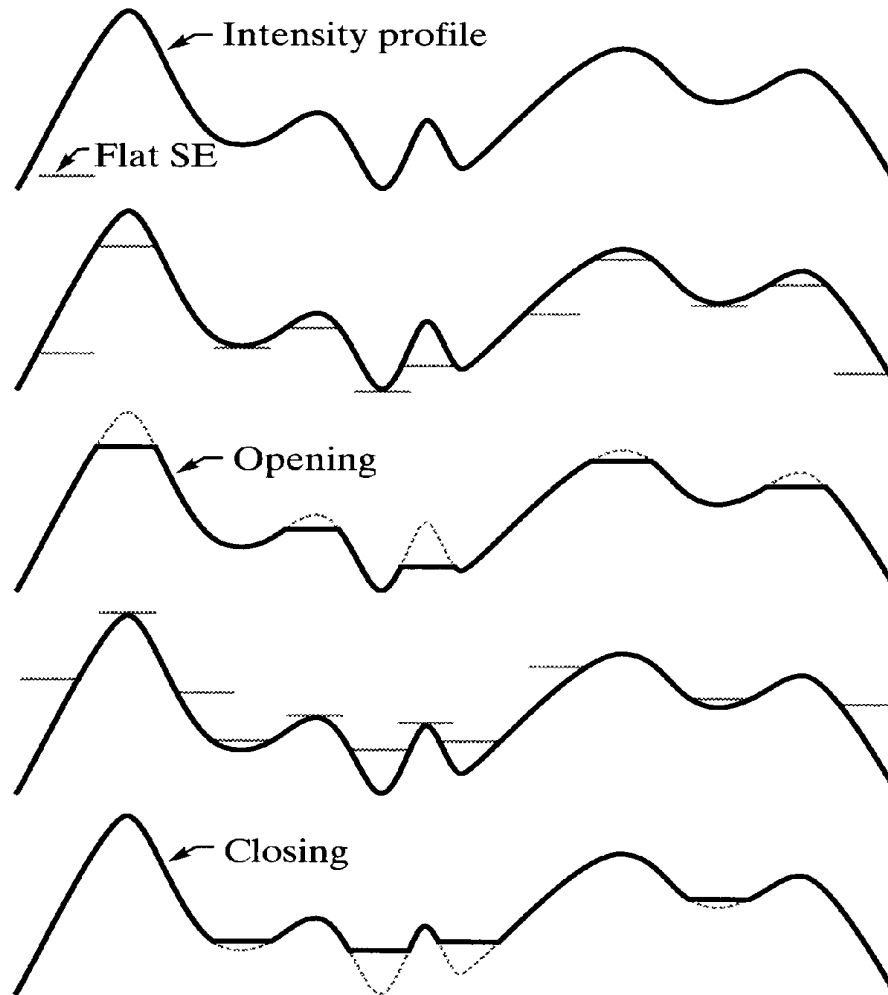
- Opening is simply the erosion of f by b , followed by a dilation of the result with b
- The **closing** of f by structuring element b at any location (x,y) is

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

- 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



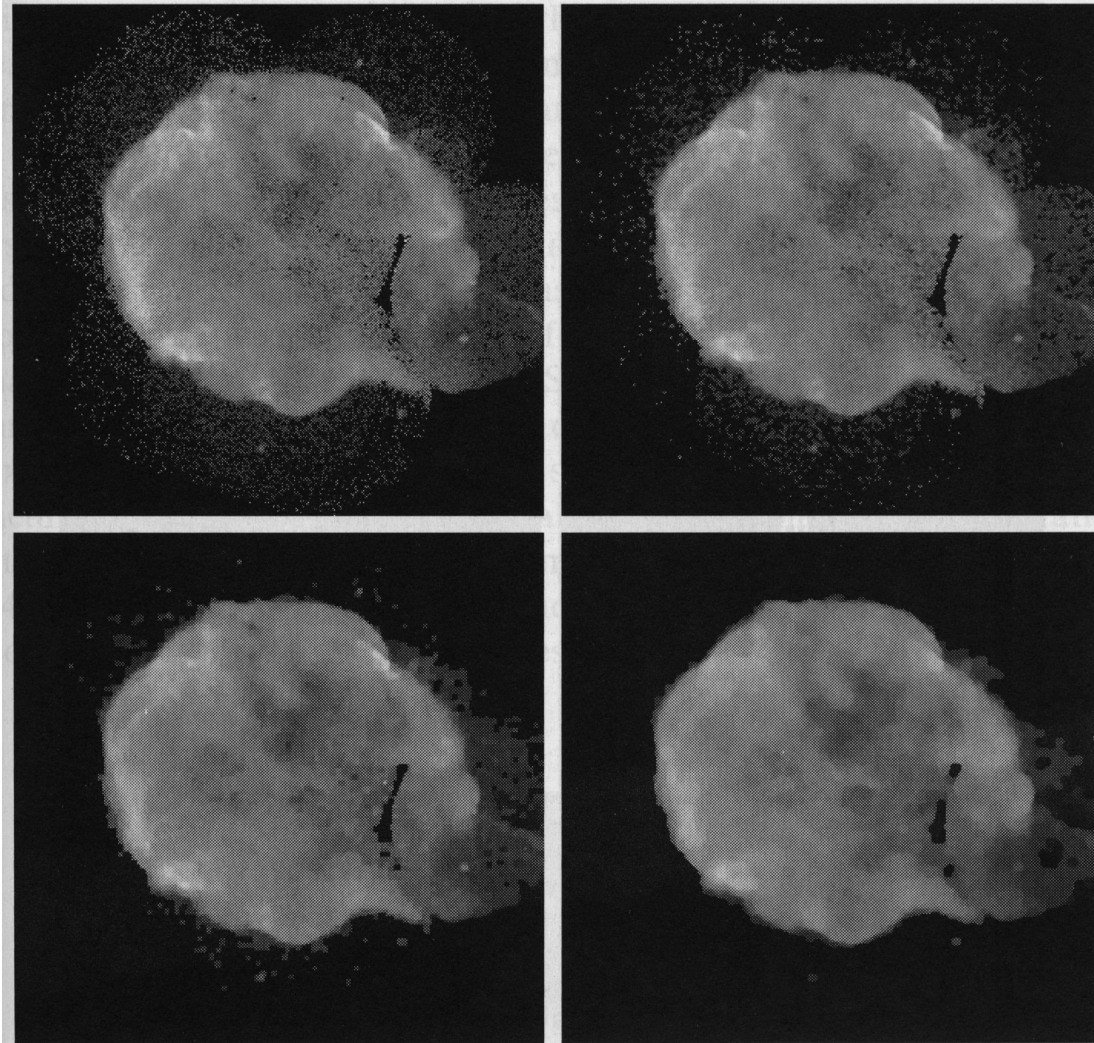
(Gonzales, Woods)

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

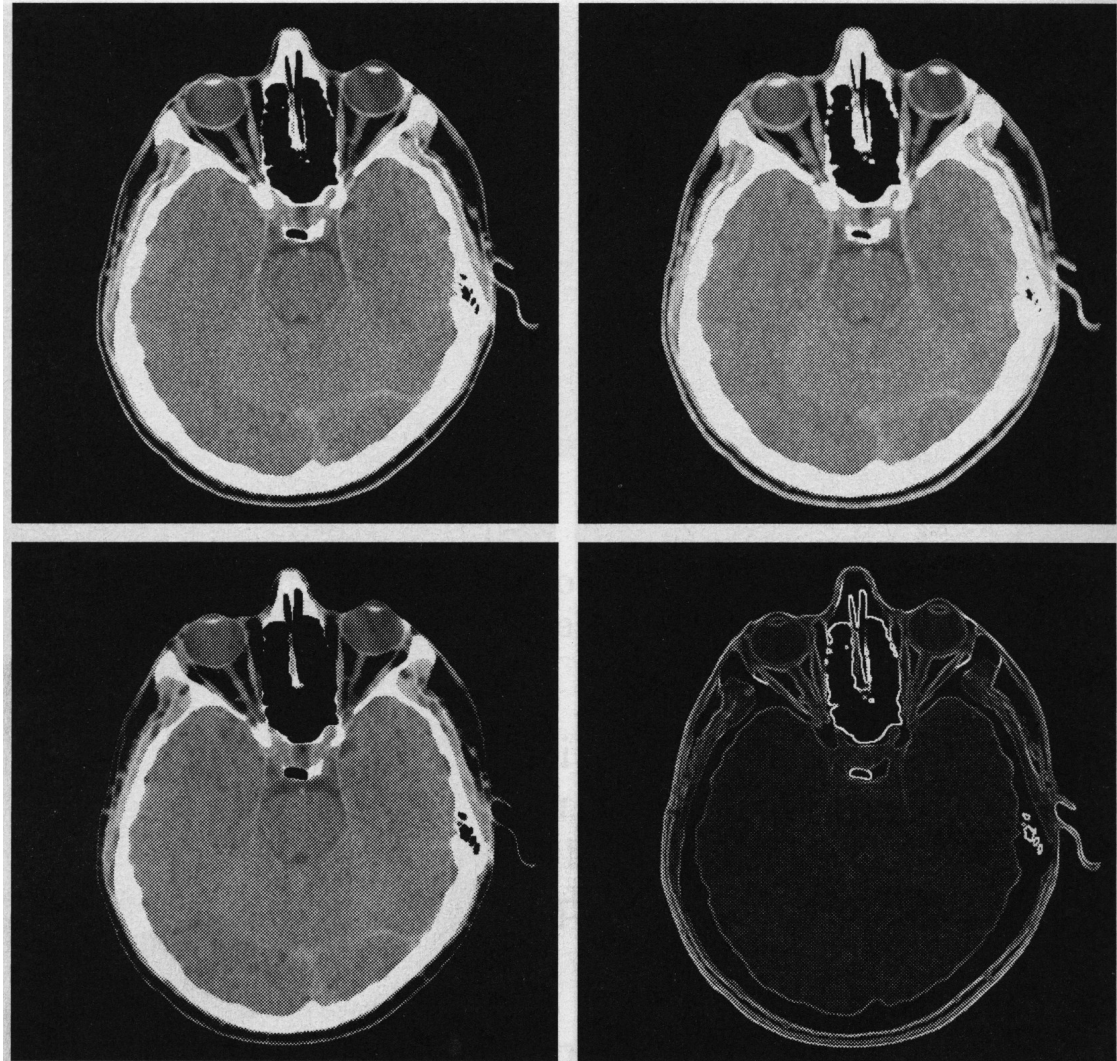


(Gonzales, Woods)

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

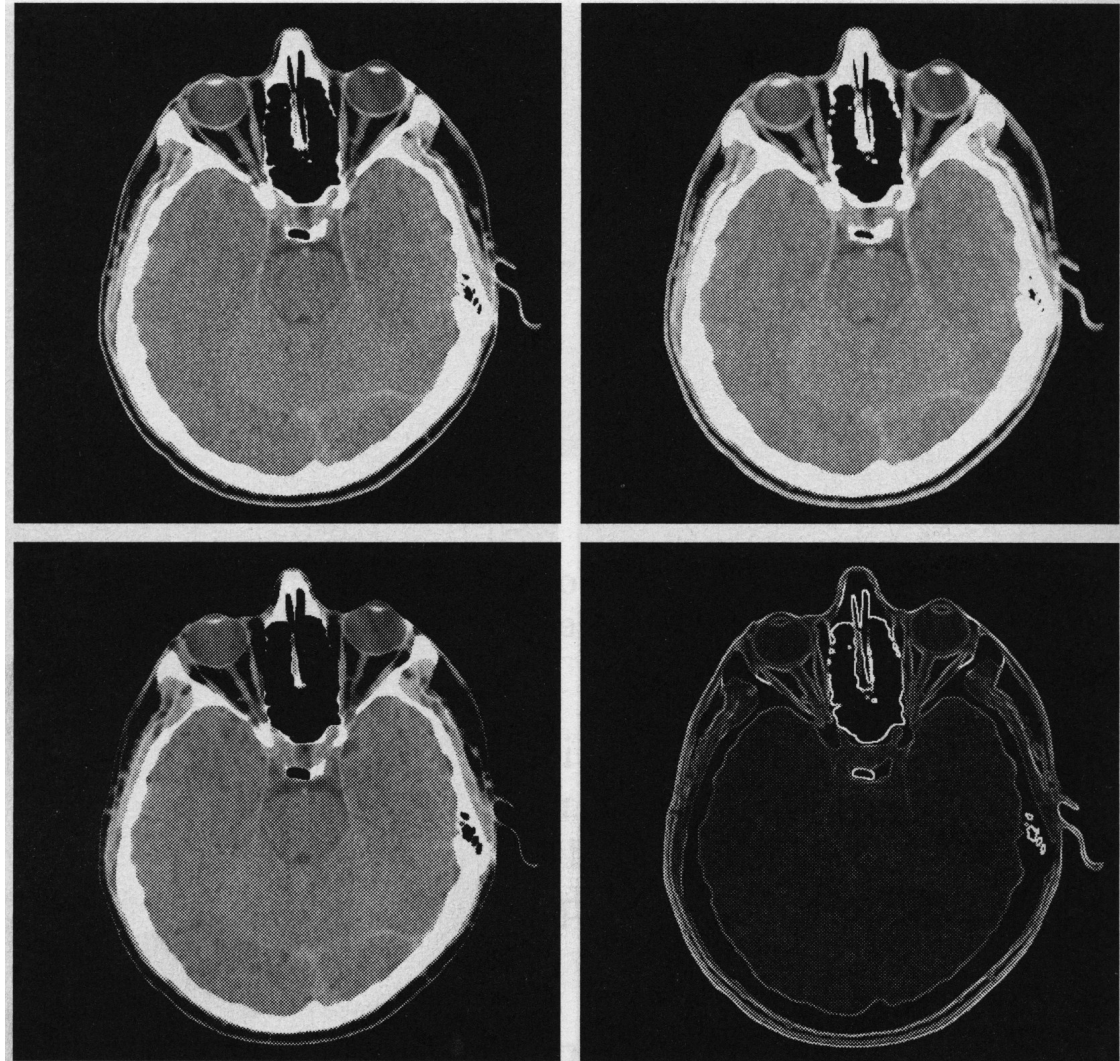
- **Morphologic gradient** of an image can be obtained by **subtraction** of **dilation** of the image and **erosion** of the image:

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

(a) (b)

(c) (d)

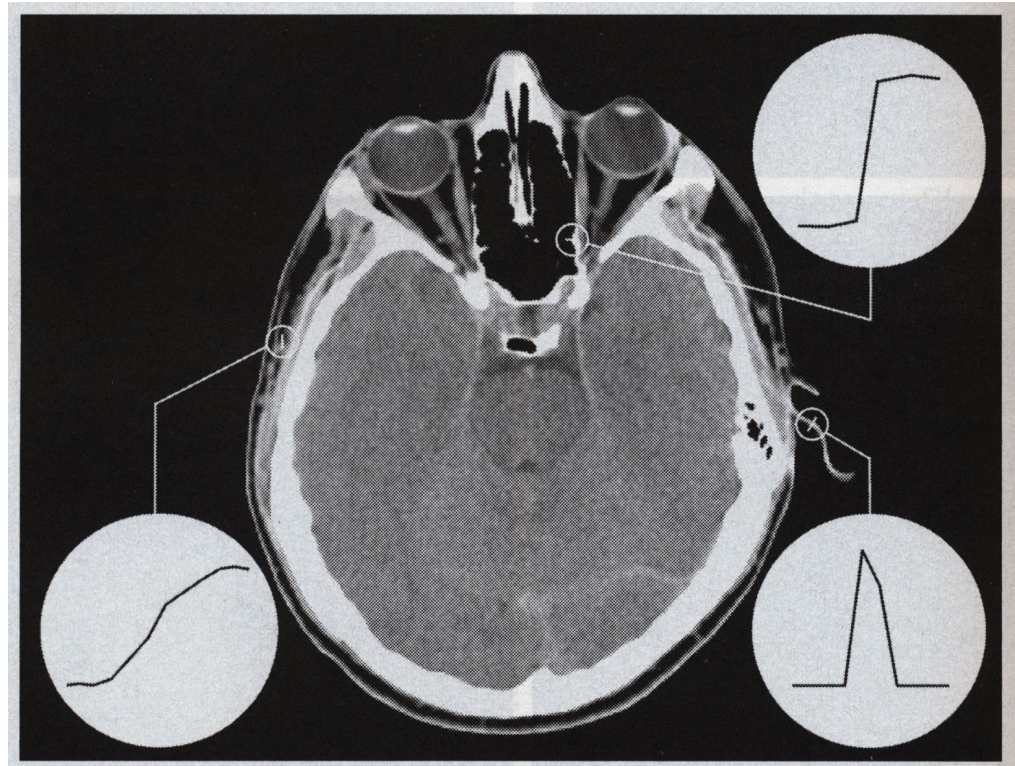
- (a) 512 x 512 image of a head CT scan
- (b) Dilation
- (c) Erosion
- (d) Morphologic gradient computed as the difference between (b) and (c)



(Gonzales, Woods)

Morphologic gradient

- **Exercises 2:**
 - Detecting contours of human organs in CT images using gray-scale morphological algorithms

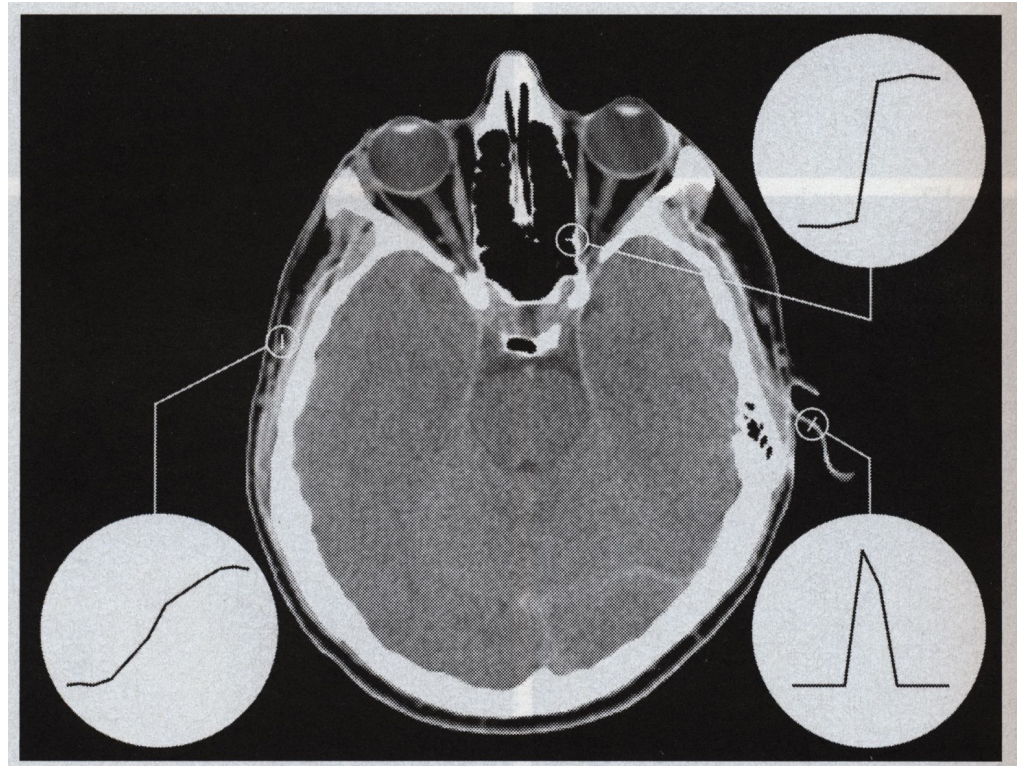


(Gonzales, Woods)

Morphologic gradient

- **Exercises 2:**

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



(Gonzales, Woods)

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 :

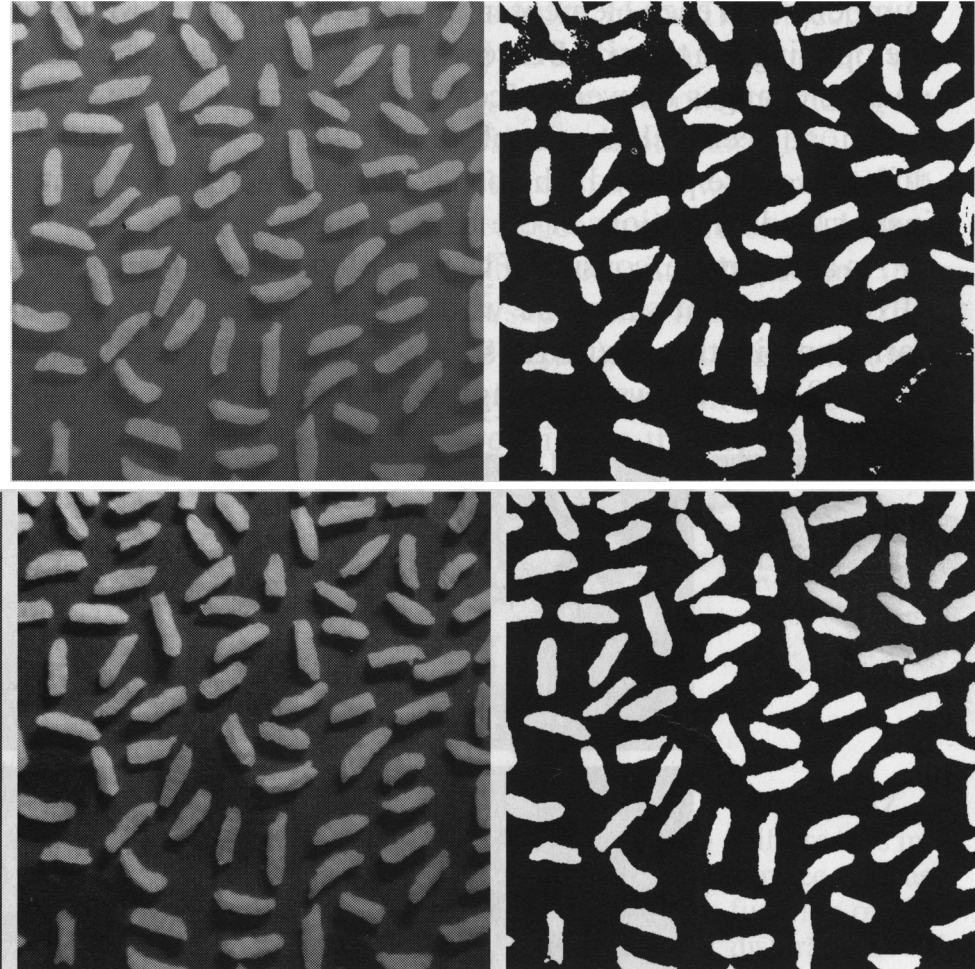
$$B_{\text{hat}}(f) = (f \bullet b) - f$$

- **Principal applications** of these transformations is in **extracting objects** from an image by using a structuring element in the opening or closing operation **that does not fit to those objects that need to be extracted**. The difference operation then yields an image in which only the extracted objects 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 x 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



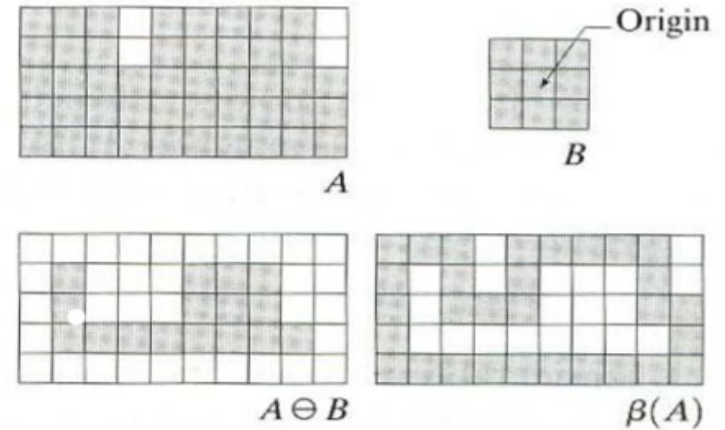
(Gonzales, Woods)

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

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

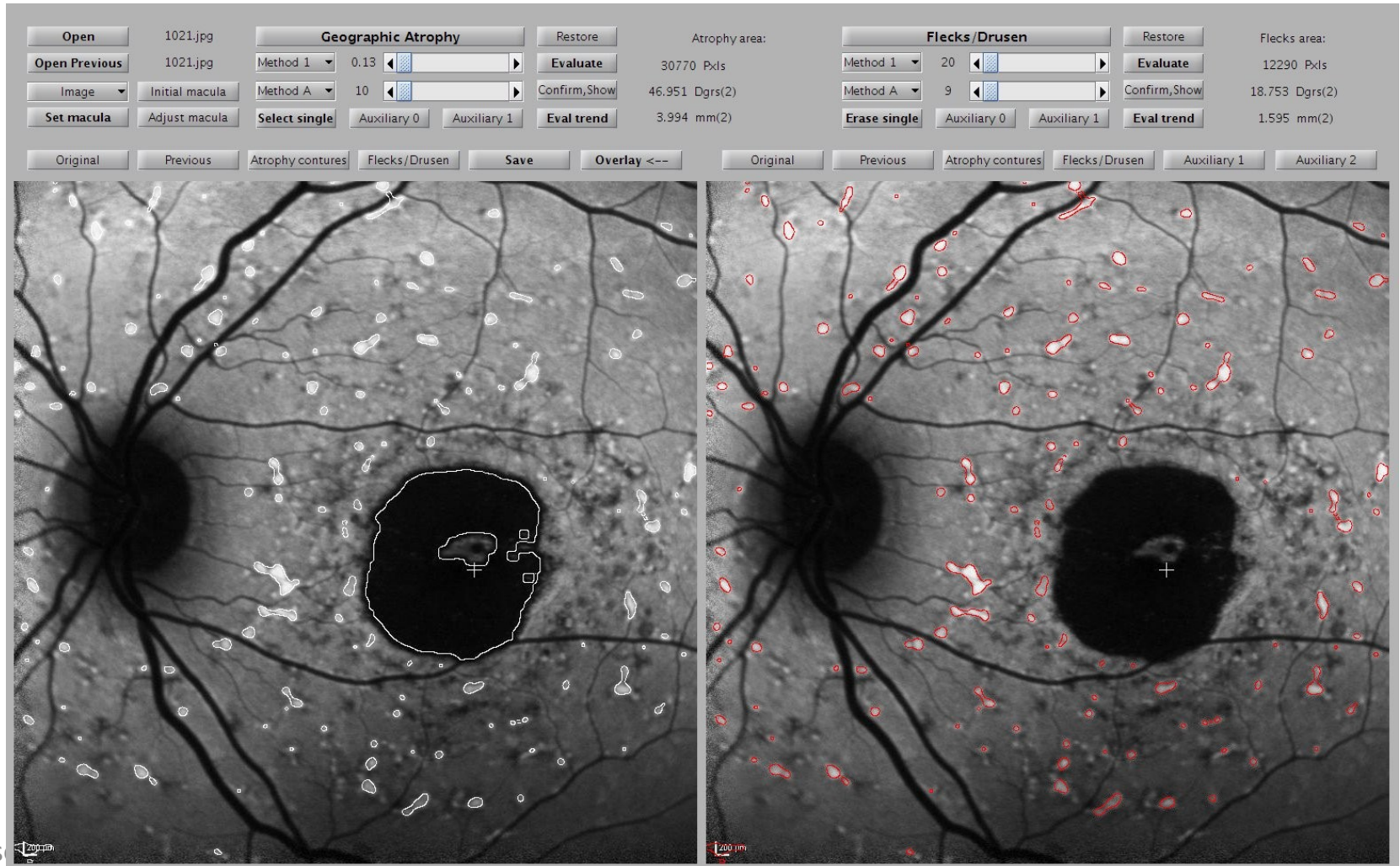


(Gonzales, Woods)



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)



The software interface displays two analysis results side-by-side. The left panel, titled "Geographic Atrophy", shows a retinal image with white outlines of atrophy. The right panel, titled "Flecks/Drusen", shows the same image with red outlines of flecks and drusen.

| Geographic Atrophy | | | | Atrophy area: | | Flecks/Drusen | | | | Flecks area: | |
|--------------------|----------------|---------------|-------------|---------------|----------------|---------------|-------------|---------------|----------------|--------------|--|
| Open | 1021.jpg | Method 1 | 0.13 | Restore | 30770 Pxls | Method 1 | 20 | Restore | 12290 Pxls | | |
| Open Previous | 1021.jpg | Method A | 10 | Evaluate | 46.951 Dgrs(2) | Method A | 9 | Confirm, Show | 18.753 Dgrs(2) | | |
| Image | Initial macula | Select single | Auxiliary 0 | Eval trend | 3.994 mm(2) | Erase single | Auxiliary 0 | Auxiliary 1 | Eval trend | 1.595 mm(2) | |
| Set macula | Adjust macula | | Auxiliary 1 | | | | | | | | |

Below the analysis panels, there are navigation buttons: "Original", "Previous", "Atrophy contours", "Flecks/Drusen", "Save", "Overlay <--", "Original", "Previous", "Atrophy contours", "Flecks/Drusen", "Auxiliary 1", "Auxiliary 2".