



Chapter 9 Morphological Image Processing

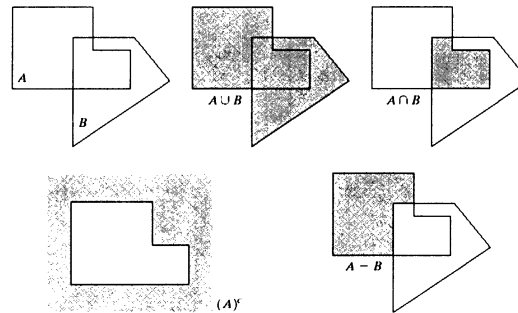


FIGURE 9.1
(a) Two sets A and B . (b) The union of A and B . (c) The intersection of A and B . (d) The complement of A . (e) The difference between A and B .

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

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

morphology — mathematical morphology uses set theory to extract and process image components such as boundaries, skeletons, etc.

The outputs are now attributes rather than a conventional image.

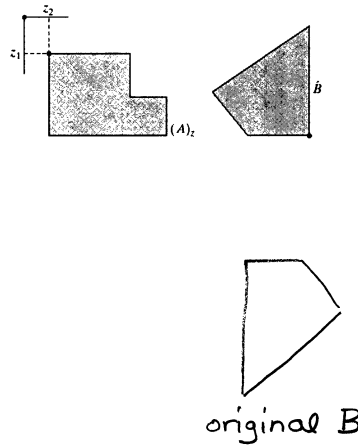
$\mathbb{Z}^2$ set of binary images specified by (x, y) locations

$$C = \{w \mid w = -d, \text{ for } d \in D\}$$

C is the set of elements w , such that w is formed by multiplying each of the two coordinates of all the elements of set D by -1



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a b
FIGURE 9.2
(a) Translation of A by z .
(b) Reflection of B . The sets A and B are from Fig. 9.1.

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Image morphology uses two definitions not normally used in set theory.

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

This is the reflection of B about the origin

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

↑
translate coordinates by $z = (z_1, z_2)$

This is the translation of B .



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TABLE 9.1
The three basic
logical operations.

p	q	$p \text{ AND } q \text{ (also } p \cdot q \text{)}$	$p \text{ OR } q \text{ (also } p + q \text{)}$	$\text{NOT } (p) \text{ (also } \bar{p} \text{)}$
0	0	0	0	1
0	1	0	1	1
1	0	0	1	0
1	1	1	1	0

$p \cdot q$

$p + q$

$\sim \bar{p}$
also
called
complement



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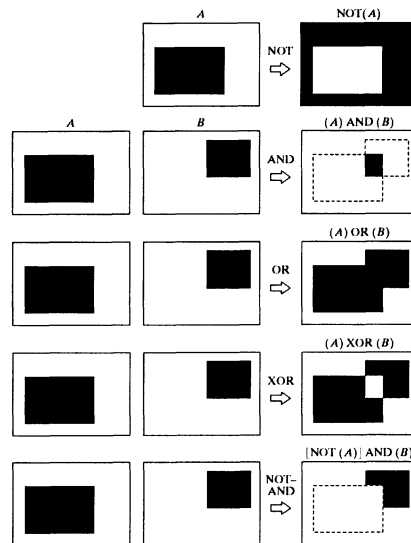


FIGURE 9.3 Some logic operations between binary images. Black represents binary 1s and white binary 0s in this example.

} complement of A

} AND gives the intersection of the sets

} OR gives the union of the sets

} This is the exclusive or and basically gives the complement of the OR

} more complex

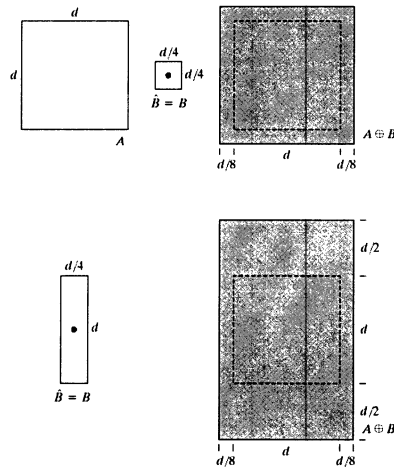
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We can perform logic operations between images on a pixel by pixel basis.



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FIGURE 9.4
(a) Set A .
(b) Square structuring element (dot is the center).
(c) Dilation of A by B , shown shaded.
(d) Elongated structuring element.
(e) Dilation of A using this element.



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dilation of A by B

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

B is called the structuring element.

Explanation

- Reflect B about the origin $\hat{B}$
- Shift it by z , $(\hat{B})_z$
- $A \oplus B$ is the set of all displacements z such that $\hat{B}$ and A overlap.

This is very similar to a convolution mask.

Other definitions are possible.



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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

joined gaps

a b c
FIGURE 9.5
(a) Sample text of poor resolution with broken characters (magnified view).
(b) Structuring element.
(c) Dilation of (a) by (b). Broken segments were joined.

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structuring element $\hat{B} = B$



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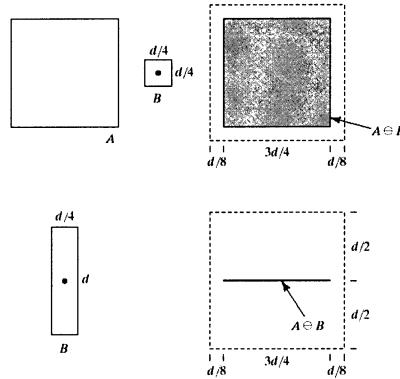


FIGURE 9.6 (a) Set A. (b) Square structuring element. (c) Erosion of A by B, shown shaded. (d) Elongated structuring element. (e) Erosion of A using this element.

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no up/down translation is possible so this becomes just a straight line.

Erosion

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

↑
subset of

$A \ominus B$ = set of all points z such that the translation of B by z is contained in A

Note that dilation and erosion are dual processes.

$$(A \ominus B)^c = \{z \mid (B)_z \subseteq A\}^c$$

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

if $(B)_z$ is in A then $(B)_z \cap A^c = \emptyset$

$$= \{z \mid (B)_z \cap A^c \neq \emptyset\}$$

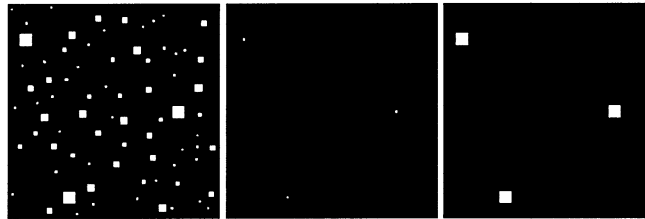
The complement is just the set for which

$$(B)_z \cap A^c \neq \emptyset$$

$$= A^c \oplus \hat{B}$$



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a b c

FIGURE 9.7 (a) Image of squares of size 1, 3, 5, 7, 9, and 15 pixels on the side. (b) Erosion of (a) with a square structuring element of 1's, 13 pixels on the side. (c) Dilation of (b) with the same structuring element.

result of
erosion by a
13x13 image
of 1's

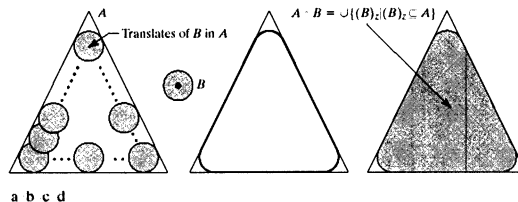
result of
dilating the eroded
image with a
13x13 all 1's structuring element

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Use erosion to eliminate irrelevant (small) detail.
Select a structuring element slightly smaller than the
details you want to keep.



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a b c d

FIGURE 9.8 (a) Structuring element B "rolling" along the inner boundary of A (the dot indicates the origin of B). (c) The heavy line is the outer boundary of the opening. (d) Complete opening (shaded).

geometric interpretation of opening

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Opening

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

$$= \bigcup \{ (B)_z \mid (B)_z \subseteq A \}$$

this is the set of all translates of B that fit inside A



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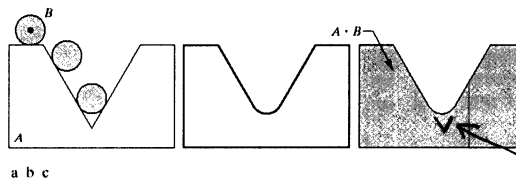


FIGURE 9.9 (a) Structuring element B "rolling" on the outer boundary of set A . (b) Heavy line is the outer boundary of the closing. (c) Complete closing (shaded).

geometric interpretation of closing
Roll B on the outside

there is no translate of B which can reach inside this region and not intersect A

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

$$A \circ B = \{w \mid (B)_z \cap A \neq \emptyset\}$$

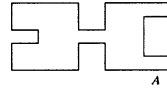
set of all w such that $(B)_z \cap A \neq \emptyset$ for any translate of $(B)_z$ that contains w .



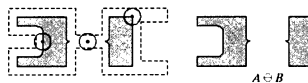
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a
b c
d e
f g
h i

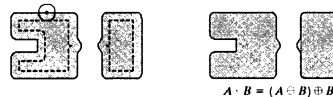
FIGURE 9.10
Morphological opening and closing. The structuring element is the small circle shown in various positions in (b). The dark dot is the center of the structuring element.



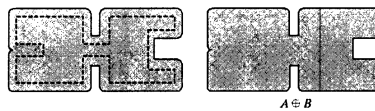
structuring element ①



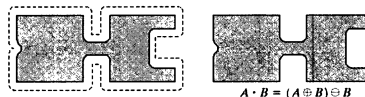
This is the result of erosion



Dilating the above gives the closing.



This is a dilation of the original image.



This shows the erosion of the dilation to complete the opening.

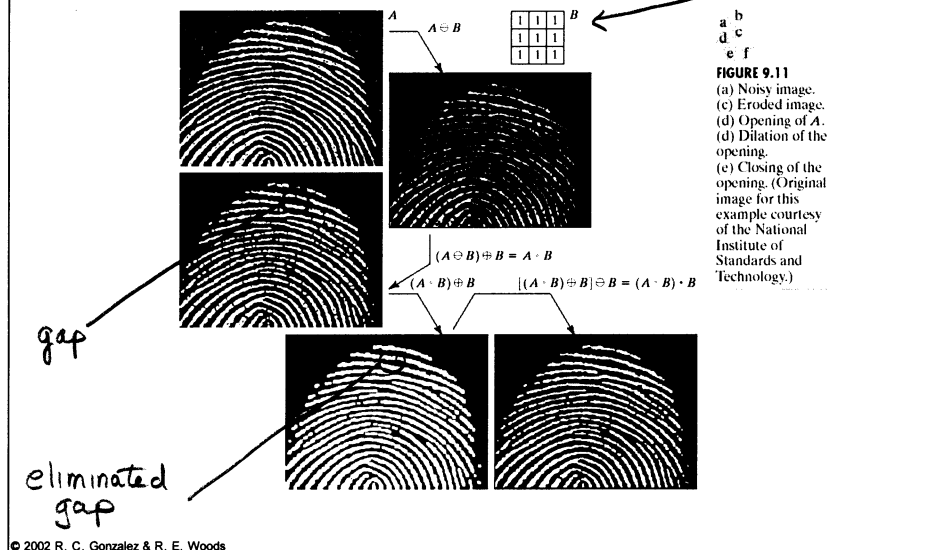
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(d), (e) shows the dilation. The topology (connection) was not preserved because B can not fit in A at the connection and the two right fingers.
 B must fit inside A to preserve topology.



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structuring element



Noise is white on black and black on white.

(c) erode A by B

eliminates white on black background noise
 since the white spots (1's) are smaller than the structuring element but the dark noise in the whorls increased since erosion decreased the size of the white objects

(d) dilate (c) to restore the whorls, i.e. increase the size of the white

(e) dilate (d) to eliminate gaps in the ridges

(f) erode (e) to thin the thickened ridges

Still some gaps because we did not consider how to maintain connectivity.



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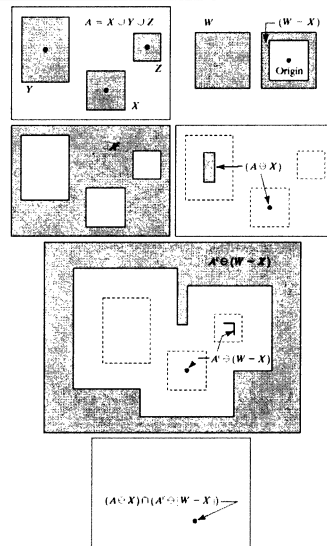


FIGURE 9.12
(a) Set A . (b) A window W , and the local background of X with respect to W , $(W - X)$. (c) Complement of A . (d) Erosion of A by X . (e) Erosion of A^c by $(W - X)$. (f) Intersection of (d) and (e), showing the location of the origin of X , as desired.

this is an assertion that we are looking for an isolated object with at least a pixel boundary completely around it.

There are several translates of $W-X$ such that $W-X$ is in A^c

one translate of $W-X$ fits X and is in A^c

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use the "hit-or-miss" algorithm to find shapes in images.

- We want to find the location of X .
- Let X be enclosed by a small background W . Define the local background $W-X$ as shown in (b).
- This is simply the complement A^c of the set of all shapes, i.e. $A = X \cup Y \cup Z$
- Erode A by X . Since Z is smaller than X it disappears. X eroded by X is a single point, and Y eroded by X is a rectangular region of all locations of X inside Y .
- The most complicated thing is the erosion of A^c by $W-X$. It's the set of all translates of $W-X$ such that the center of $W-X$ is in A^c . Note that $W-X$ fits around X giving a center point. Since Z is smaller than X there is also a set of points inside Z corresponding to translates around Z .
- Intersection of $A \ominus X$ and $A^c \ominus (W-X)$ is the location of X .

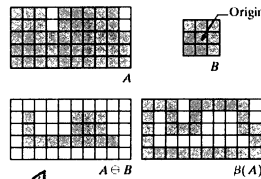
$$A \oplus B = (A \ominus X) \cap [A^c \ominus (W-X)]$$

can be written in other forms as well.



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FIGURE 9.13 (a) Set A . (b) Structuring element B . (c) A eroded by B . (d) Boundary, given by the set difference between A and its erosion.



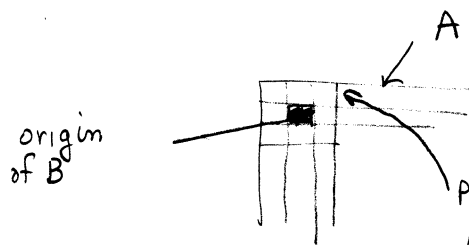
$$A \ominus B$$

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

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Boundary extraction :

Erode a set A by an appropriate structuring element B .
Subtract this from A to get the boundary $\beta(A)$.

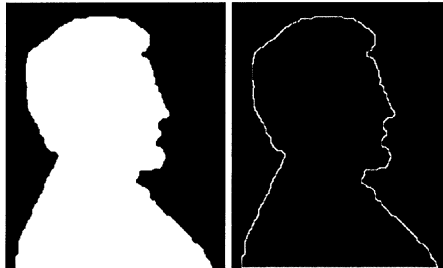


places B 1-pixel inside A giving 1-pixel boundaries.

A 5x5 would give 2-pixel boundaries but may eliminate detail.



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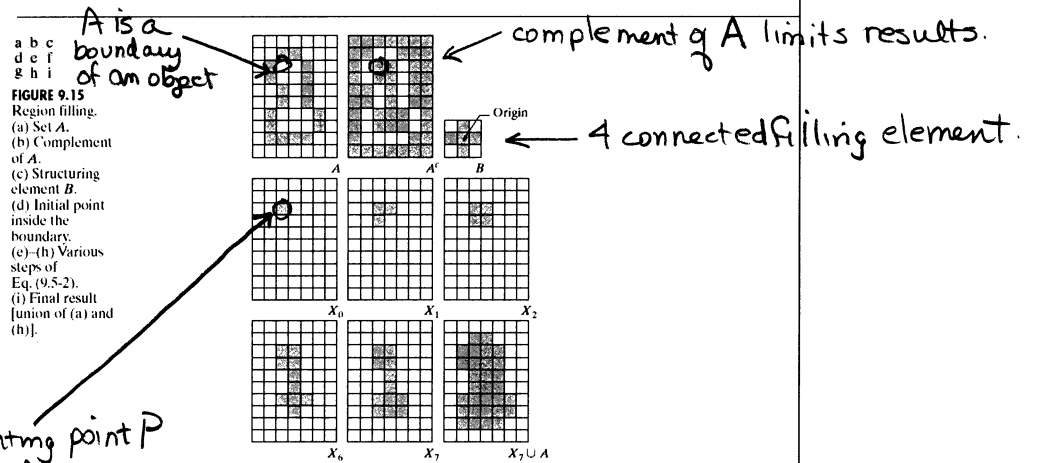


a b
FIGURE 9.14
(a) A simple binary image, with 1's represented in white. (b) Result of using Eq. (9.5-1) with the structuring element in Fig. 9.13(b).

Because the structuring element is 3×3 the boundary is 1 pixel thick.



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Region filling

$$X_0 = P.$$

$$X_1 = \underbrace{(P \oplus B)}_{\text{expands } P \text{ in four directions}} \cap A^c$$

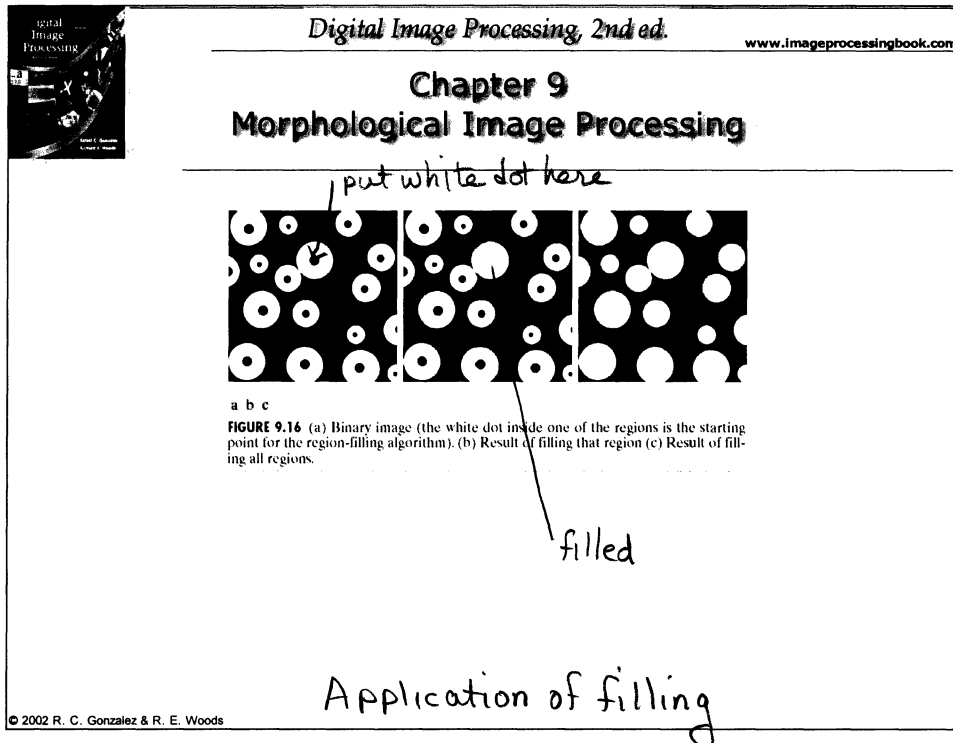
Handwritten notes:
- stops all pixels in boundary
- this is called conditional dilation

$$X_2 = \underbrace{(X_1 \oplus B)}_{\text{continues to expand (dilate) } P} \cap A^c$$

Handwritten notes:
- stops all pixels at boundary.

In general
$$X_k = (X_{k-1} \oplus B) \cap A^c, \quad k=1, 2, 3, \dots$$

stop when $X_k = X_{k-1}$



- (a) possible thresholded image from ball bearings.
The spots might be due to reflections. One dot inside spot
- (b) Fill up to boundary of circle.

Need additional algorithm to identify circles for this to become automated.



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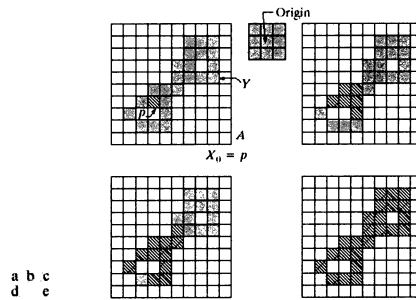


FIGURE 9.17 (a) Set A showing initial point p (all shaded points are valued 1, but are shown different from p to indicate that they have not yet been found by the algorithm). (b) Structuring element. (c) Result of first iterative step. (d) Result of second step. (e) Final result.

B as given assumes 8-connectivity of Y .

Extraction of connected components.

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We want to construct a list of connected components in A .

Suppose we are given P which is a part of object Y .

Dilate $X_0 = P$ by B

$X_1 = X_0 \cap A$ gives all the 1's in A connected to P , i.e., elements of Y

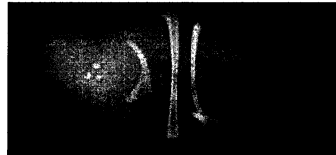
$X_2 = (X_1 \oplus B) \cap A$
etc.



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a
b
c
d

FIGURE 9.18
(a) X-ray image of chicken fillet with bone fragments.
(b) Thresholded image.
(c) Image eroded with a 5×5 structuring element of 1's.
(d) Number of pixels in the connected components of (c). (Image courtesy of NTB Elektronische Geräte GmbH, Diepholz, Germany, www.ntbxray.com.)



Connected component	No. of pixels in connected comp
01	11
02	9
03	9
04	39
05	133
06	1
07	1
08	743
09	7
10	11
11	11
12	9
13	9
14	674
15	85

X-ray of bones in a chicken fillet

Thresholded

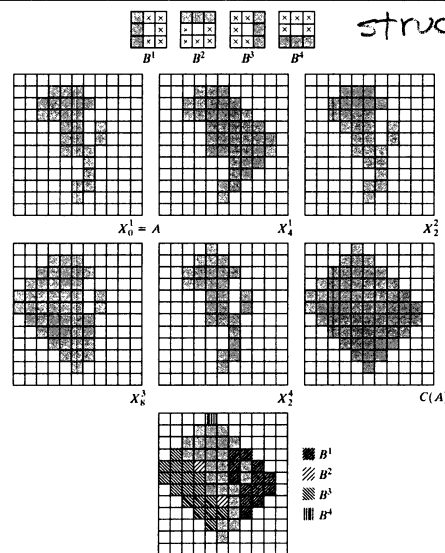
} connected components.

eroded by a 5×5 structuring element of 1's



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FIGURE 9.19
(a) Structuring elements. (b) Set A . (c)–(f) Results of convergence with the structuring elements shown in (a). (g) Convex hull. (h) Convex hull showing the contribution of each structuring element.



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This is a repetitive "hit or miss" algorithm.

You apply B^i to A , i.e., $X_0^i \oplus B^i$
which finds the locations of B^i and you add them to A .

$$X_1^i = (X_0^i \oplus B^i) \cup A$$

Continue this process until nothing changes.

Do this for each shape B^i starting with A

Combine the results to get the convex hull.

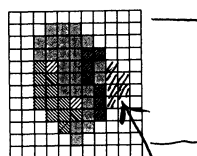
$$X_k^i = (X_{k-1}^i \oplus B^i) \cup A \quad i=1, 2, 3, \dots$$

$$k=1, 2, 3, 4$$

$$C(A) = \bigcup_{i=1}^4 D^i \quad \text{where} \quad D^i = X_{\text{converged}}^i$$



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original
boundaries

FIGURE 9.20 Result of limiting growth of convex hull algorithm to the maximum dimensions of the original set of points along the vertical and horizontal directions.

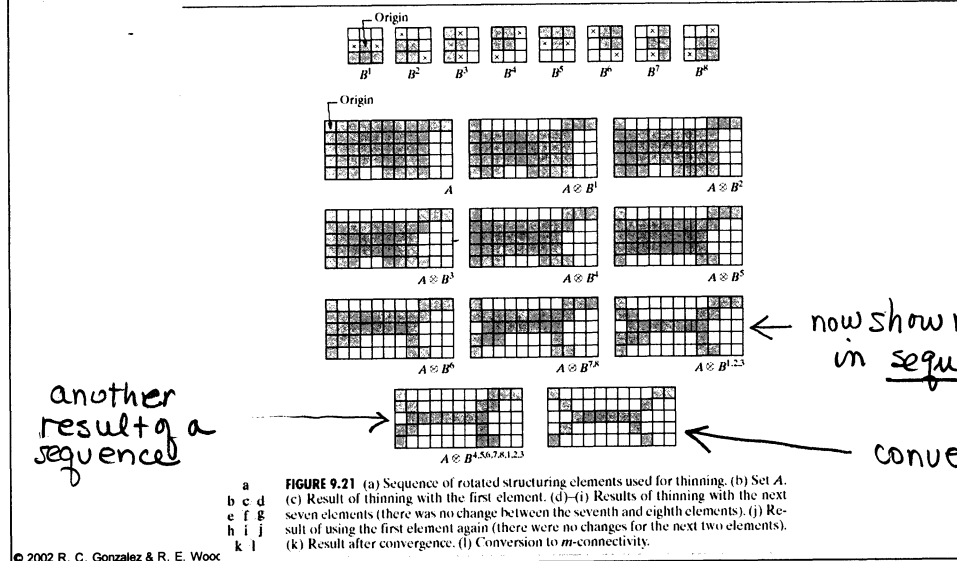
original
boundaries

bounding prevents this growth
past the original boundaries.

LIMITING GROWTH



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Thinning is often used to reduce thick objects to "skeletons". In this case if the structuring elements match we remove that pixel.

