

Mathematical morphology



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Outline of Lecture 7

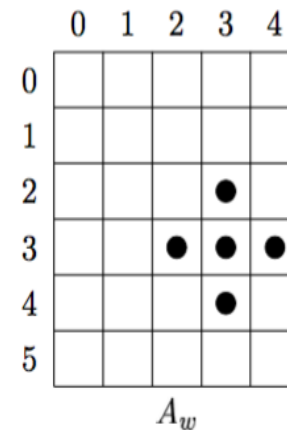
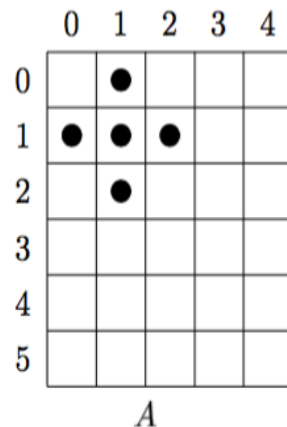
- ❑ Introduction
- ❑ Dilation and erosion
- ❑ Relationship between dilation and erosion
- ❑ boundary detection
- ❑ Opening and Closing
- ❑ Noise removal

Introduction

- ❑ Morphology is a branch of image processing which is particularly useful for **analyzing shapes in images**.
- ❑ These are the basic operations of morphology, **dilation and erosion**. All other operations are built from a combination of these two.
- ❑ **Non-linear** operation.

Translation

- Suppose that A is a set of pixels in a binary image, and $\omega = (x, y)$ is a particular coordinate point. Then A_ω is the set A “translated” in direction (x, y) . That is $A_x = \{(a, b) + (x, y) : (a, b) \in A\}$



$\omega = (2, 2)$

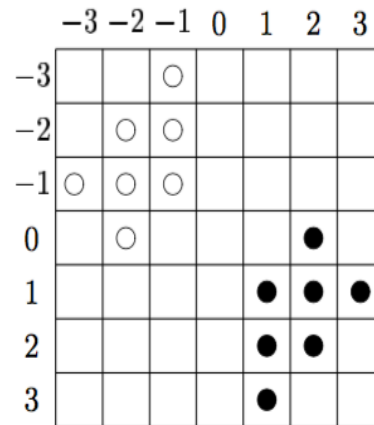
Translation

Note that here we are using **matrix coordinates**, rather than Cartesian coordinates,

Reflection

- If A is set of pixels, then its reflection, denoted \hat{A} , is obtained by reflecting A in the origin:

$$\hat{A} = \{(-x, -y) : (x, y) \in A\}$$



Reflection

Dilation and erosion

- ❑ Dilation: **Adds pixels** to the boundaries of objects in an image
- ❑ Erosion: **Removes pixels** on object boundaries
- ❑ These are the **basic operations** of morphology.
- ❑ Other operations are built from a combination of these two.

Dilation

- ❑ It **grows or thicken** objects in a binary image
- ❑ Thickening is controlled by a shape referred to as **structuring element or kernel**.
- ❑ **Structuring element** is a matrix of 1's and 0's.
- ❑ Suppose A and B are sets of pixels. Then the **dilation of A by B** , denoted, $A \oplus B$ is defined as:

$$A \oplus B = \bigcup_{x \in B} A_x$$

- ❑ For every point $x \in B$, we **translate A by those coordinates**. Then we take the **union of all these translations**.

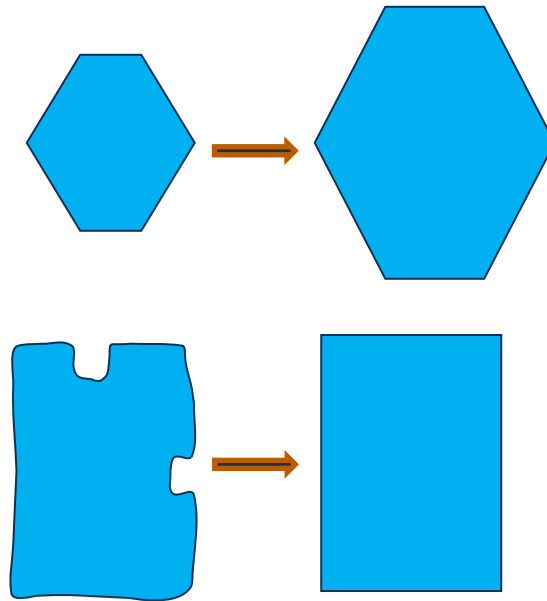
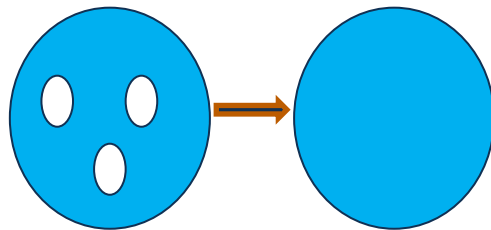
$$A \oplus B = \{(x, y) + (u, v) : (x, y) \in A, (u, v) \in B\}$$

- ❑ Dilation is **commutative**.

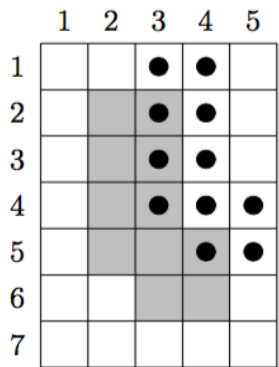
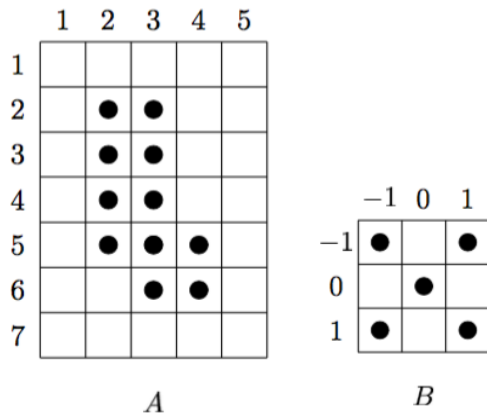
$$A \oplus B = B \oplus A$$

Dilation (cont.)

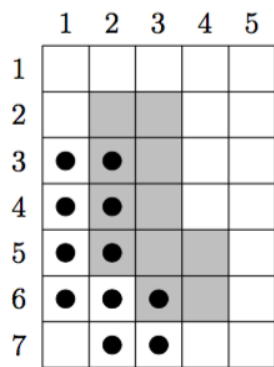
- ❑ Dilation **expands** the connected sets of 1s of a binary image.
- ❑ It can be used for
 - growing features
 - filling holes and gaps



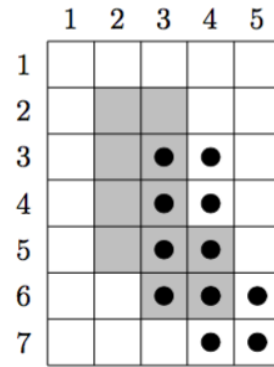
Dilation (cont.)



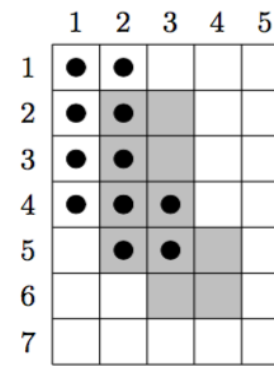
$A_{(-1,1)}$



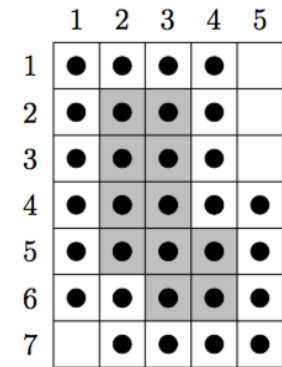
$A_{(1,-1)}$



$A_{(1,1)}$



$A_{(-1,-1)}$



$A \oplus B$

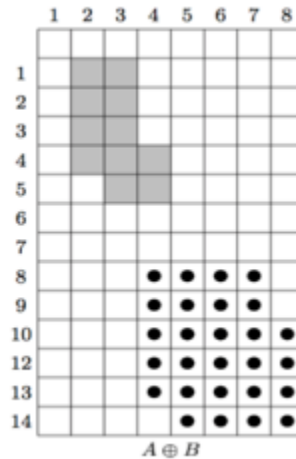
$$B = \{(0,0), (1,1), (-1,1), (1,-1), (-1,-1)\}$$

Dilation (cont.)

- it is not necessarily true that the original object A will lie within its dilation $A \oplus B$. Depending on the coordinates of B , $A \oplus B$ may end up quite a long way from A .

$$B = \{(7,3), (6,2), (6,4), (8,2), (8,4)\}$$

$$A \oplus B = A_{(7,3)} \cup A_{(6,2)} \cup A_{(6,4)} \cup A_{(8,2)} \cup A_{(8,4)}$$



A dilation for which $A \not\subseteq A \oplus B$

Dilation in Python

```
from skimage.morphology import binary_dilation as bwdilate
img = cv2.imread('text.png',0)
sq = np.ones((3,3))
image = bwdilate(img,sq)
```



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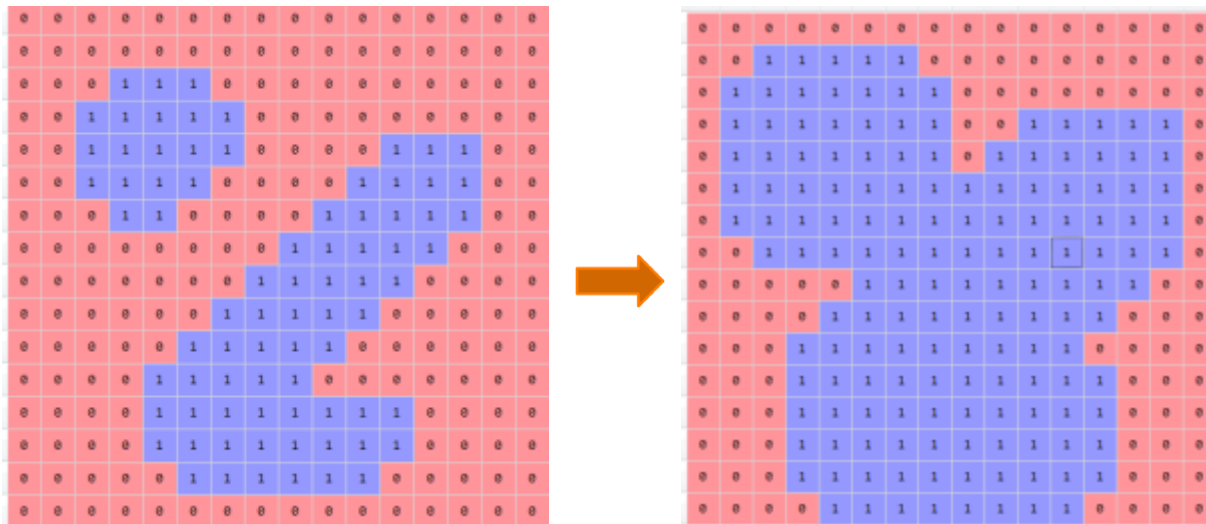


**Morphology is a branch
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Dilation of a binary image

Dilation (cont.)

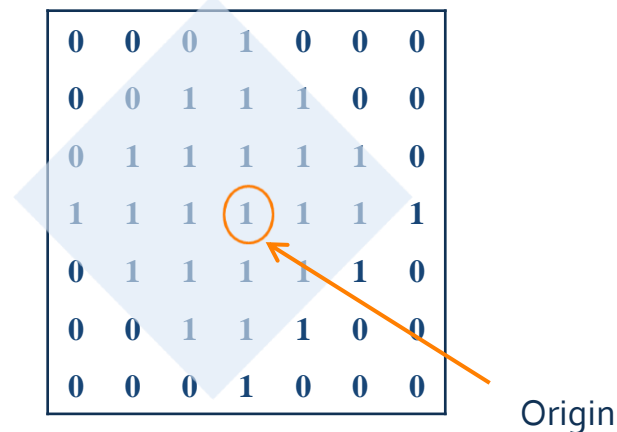
- Dilation fills gaps in an image.



Effect of dilation using 3x3 square structuring element

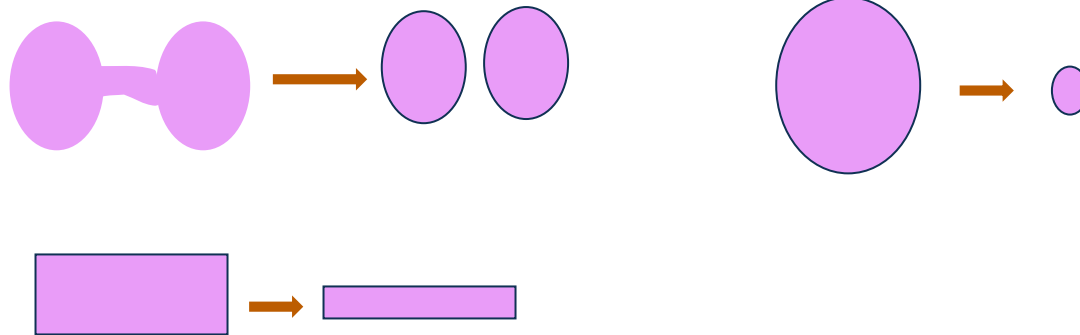
Structuring element

- ❑ The number of pixels added or removed from the objects in an image depends on the size and shape of the structuring element
- ❑ It's a matrix of 1's and 0's
- ❑ The center pixel of the structuring element, called **the origin**



Erosion

- ❑ Erosion **shrinks** the connected sets of 1s of a binary image.
- ❑ It can be used for
 - shrinking features
 - Removing bridges, branches and small protrusions



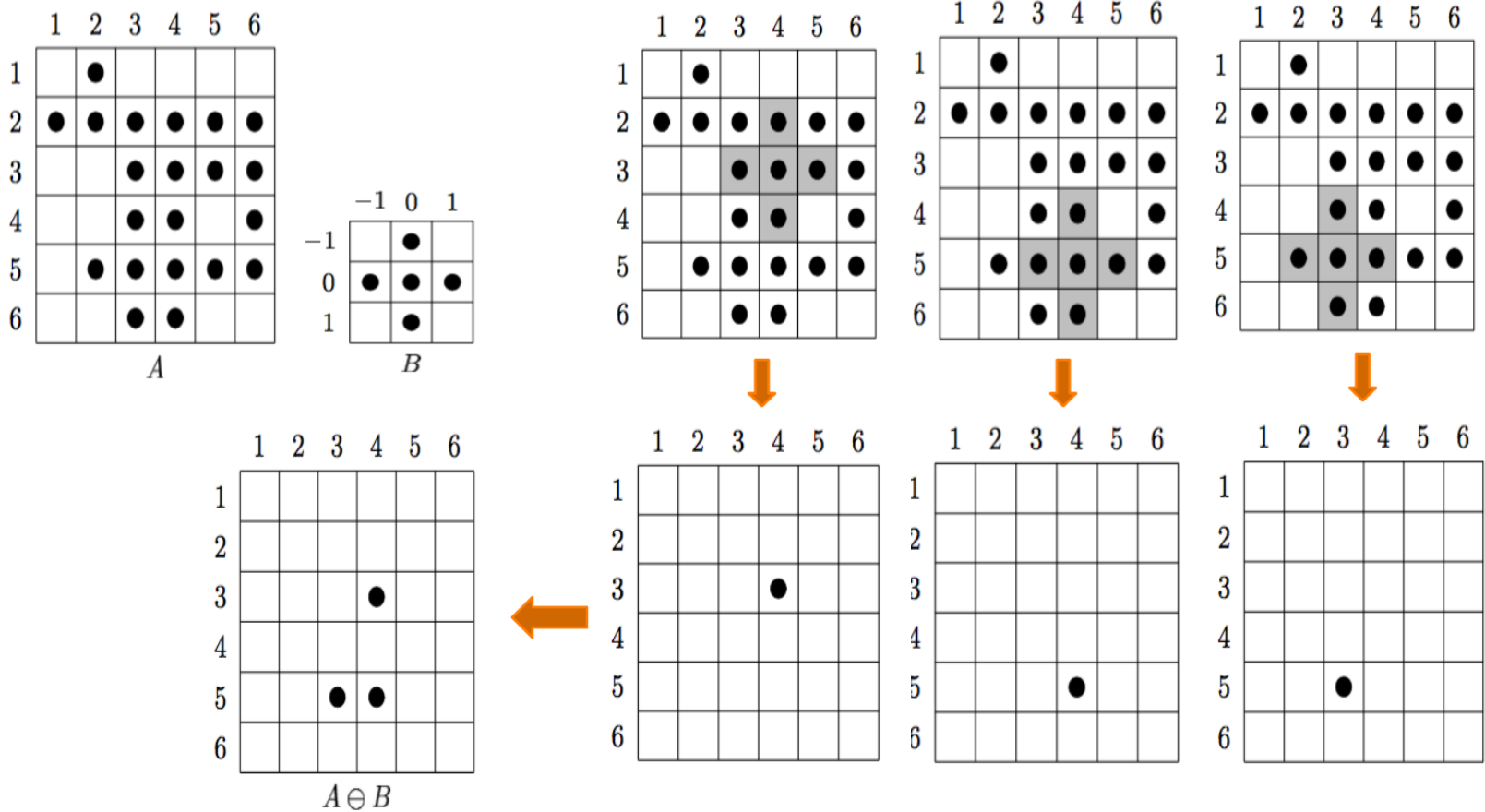
Erosion (cont.)

- Given sets A and B , the erosion of A by B , written $A \ominus B$, is defined as:

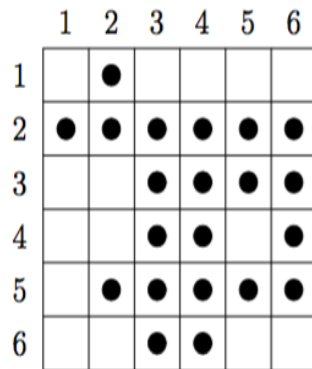
$$A \ominus B = \{w : B_w \subseteq A\}.$$

- The erosion A by B consists of all points $\omega = (x, y)$ for which B_ω is in A .
- $A \ominus B$ was a subset of A . This is not necessarily the case; it depends on the position of the origin in B . If B contains the origin, then the erosion will be a subset of the original object.

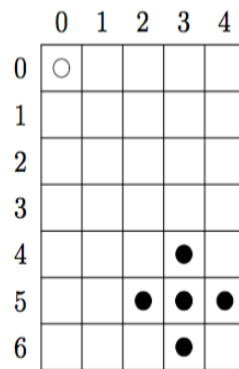
Erosion (cont.)



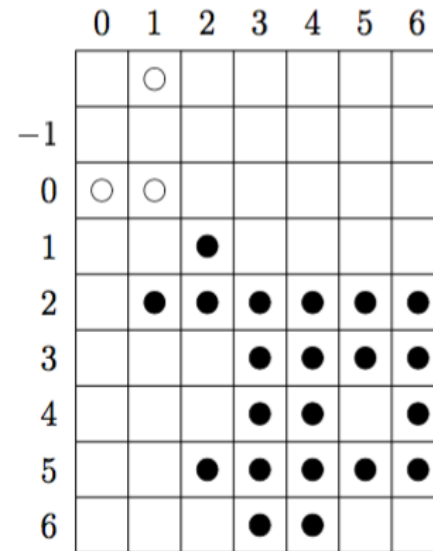
Erosion (cont.)



A



B



$A \ominus B$

Erosion with a structuring element not containing the origin

Erosion in Python

```
from skimage.morphology import binary_erosion as bwerode
img = cv2.imread('text.png',0)
sq = np.ones((3,3))
image = bwerode(img,sq)
```

A binary image showing the text "Morphology is a branch of image processing which is particularly useful for analyzing shapes in images." in white on a black background. The text is centered and occupies most of the frame.

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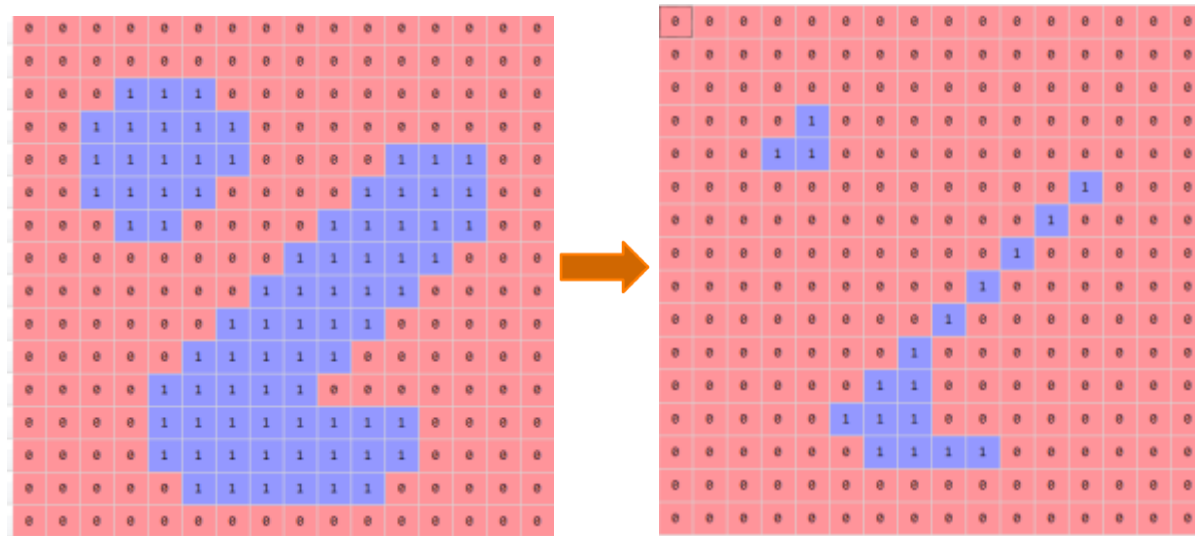
A binary image showing the same text as the previous image, but with significant erosion. The white pixels are now only the most prominent, thickened outlines of the original characters, with all the fine details and spaces removed.

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Erosion of a binary image

Erosion (cont.)

- Erosion eliminates unwanted detail.



Effect of dilation using 3x3 square structuring element

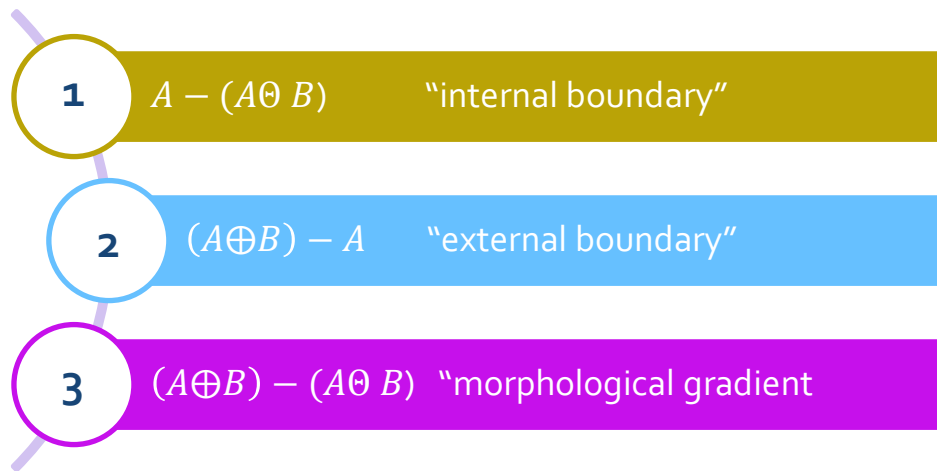
Relationship between erosion and dilation

- It can be shown that erosion and dilation are “inverses” of each other;
- the complement of an erosion is equal to the dilation of the complement.

$$\overline{A \ominus B} = \bar{A} \oplus \bar{B}$$

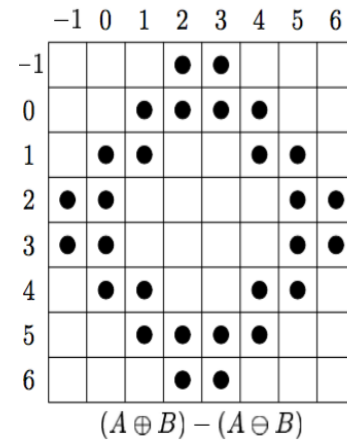
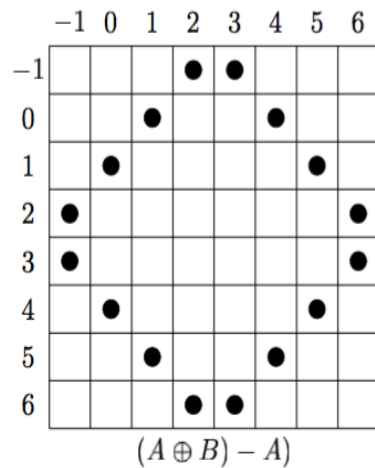
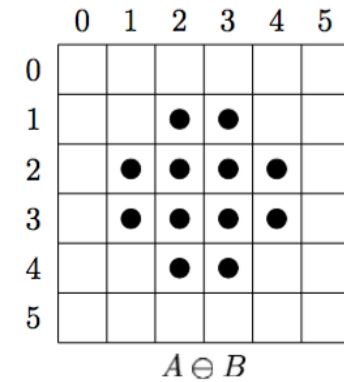
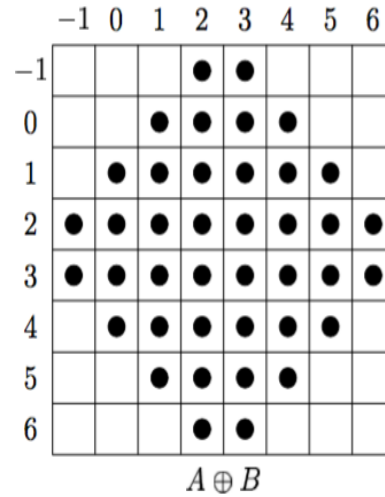
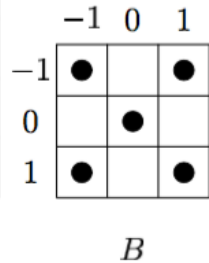
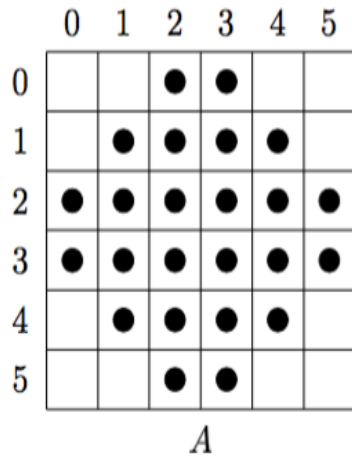
Boundary detection

- If A is an image, and B is a small structuring element consisting of point symmetrically places about the origin, then we can define the boundary of the image by any of the following methods:



- In each definition the minus refers to **set difference**.

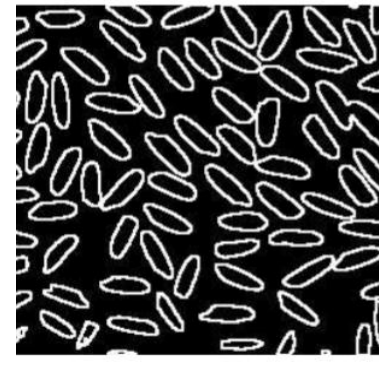
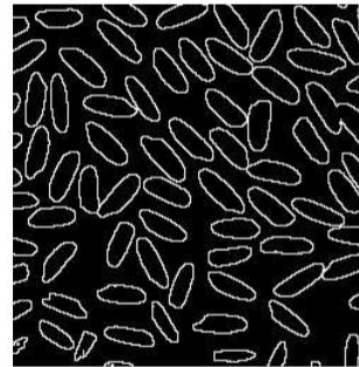
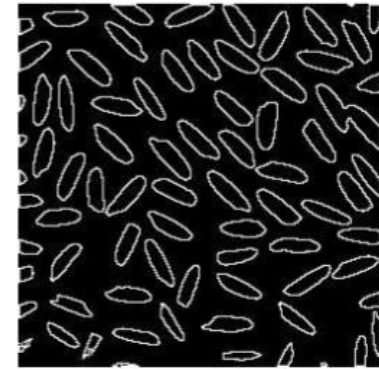
Boundary detection (cont.)



Boundaries

boundary detection (cont.)

```
n=io.imread('images/rice.png')
sq=np.ones((3,3))
p=~((n>40) & (n<120))
pe=bwerode(p,sq)
#Internal boundary
p_int=p&~pe
#External boundary
pd=bwdilate(p,sq)
p_ex=pd&~p
#gradient
p_grad = pd&~pe
```



Internal boundary, external boundary and the morphological gradient of a binary image of a binary image

Opening and Closing

□ Opening :

- An Erosion followed by a dilation

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

□ Closing :

- A dilation followed by an erosion

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

Opening

- Given and a structuring element **B**, the opening of **A** by **B**, denoted $A \circ B$, is defined as:

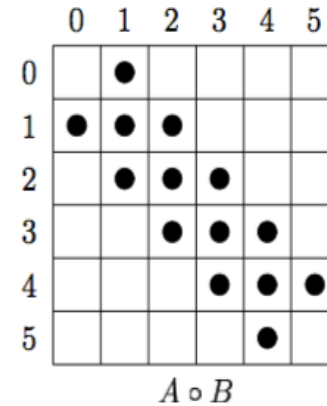
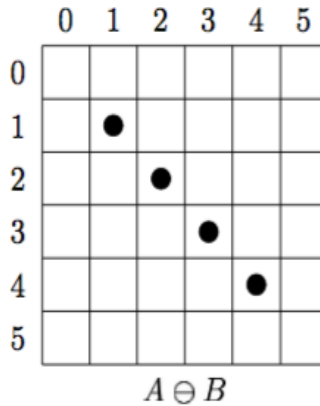
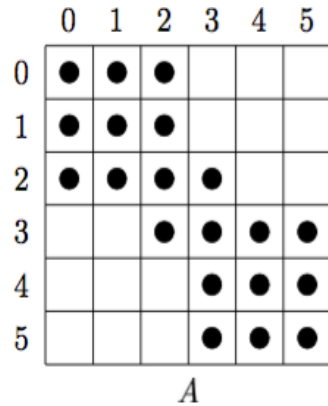
$$A \circ B = (A \ominus B) \oplus B$$

- So an opening consists of an erosion followed by a dilation. An equivalent definition is

$$A \circ B = \cup \{B_w : B_w\} \subseteq A$$

- That is, $A \circ B$ is the union of all translations of **B** which fit inside **A**. Note the difference with erosion: the erosion consists only $(0,0)$ of the point of **B** for those translations which fit inside **A**; the opening consists of all of **B**.
- Opening is implemented by the **bwopen** functions..

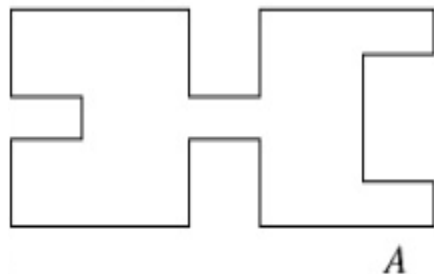
Opening (cont.)



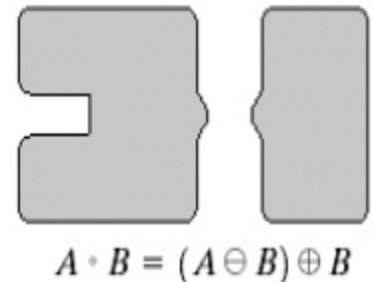
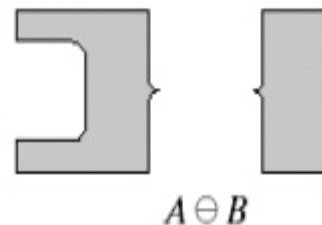
Opening

Properties of opening

- $A \circ B \subseteq A$. Note that this is not the case with erosion; as we have seen, an erosion may not necessarily be a subset.
- $(A \circ B) \circ B = A \circ B$. That is, an opening can never be done more than once. This property is called **idempotence**. Again, this is not the case with erosion; you can keep on applying a sequence of erosions to an image until nothing is left.
- If $A \subseteq C$, then $(A \circ B) \subseteq (C \circ B)$.
- Opening tends to “**smooth**” an image, to break narrow joins, and to remove thin protrusions.



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Opening in Python

```
from skimage.morphology import binary_opening as bwopen
img = cv2.imread('text.png',0)
sq = np.ones((3,3))
image = bwopen(img,sq)
```

A binary image showing the text "Morphology is a branch of image processing which is particularly useful for analyzing shapes in images." in white on a black background. The text is sharp and clear.

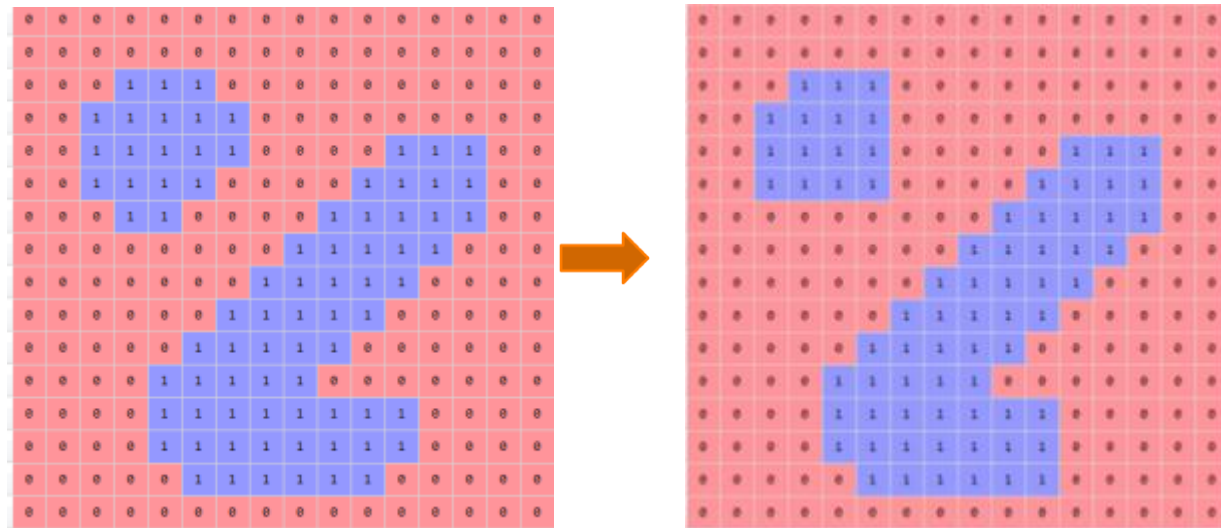
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A binary image showing the text "Morphology is a branch of image processing which is particularly useful for analyzing shapes in images." in white on a black background. The text is significantly blurred and the edges are smoothed, illustrating the effect of the opening operation.

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Opening of a binary image

Opening (cont.)



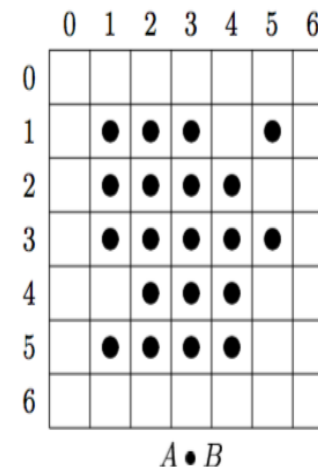
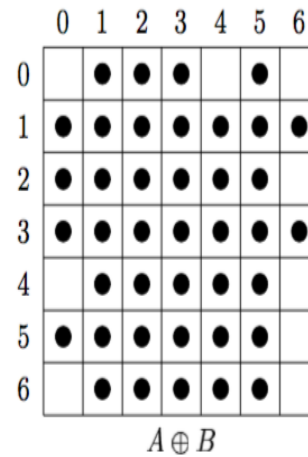
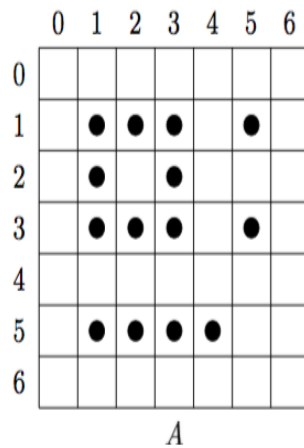
Effect of opening using 3x3 square structuring element

Closing

- a dilation followed by an erosion, and is denoted : $A \bullet B$

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

- Closing is implemented by the **bwclose** function.



Closing

Closing in Python

```
from skimage.morphology import binary_closing as bwclose
img = cv2.imread('text.png',0)
sq = np.ones((3,3))
image = bwclose(img,sq)
```



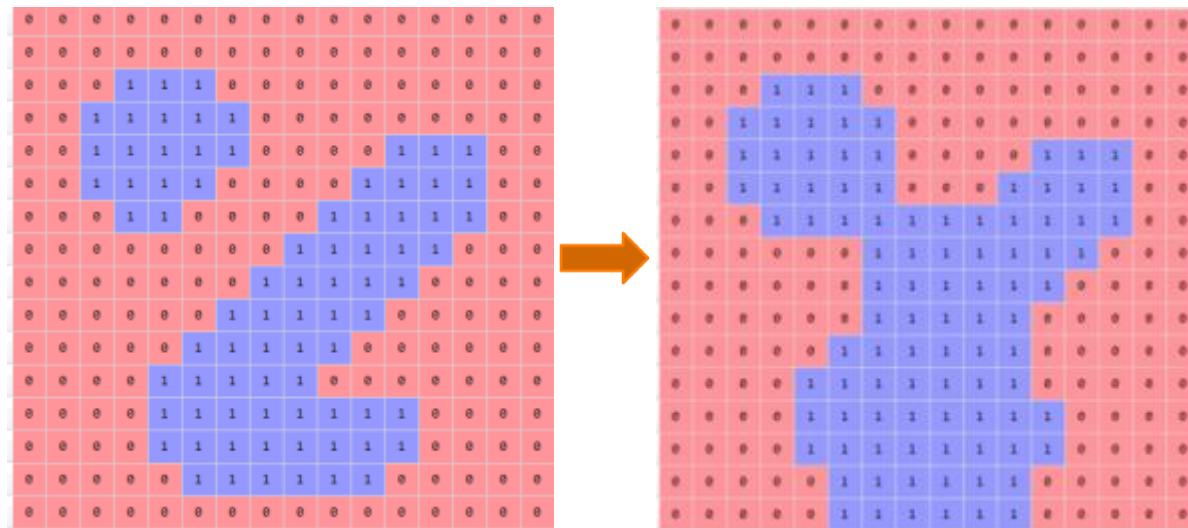
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Closing of a binary image

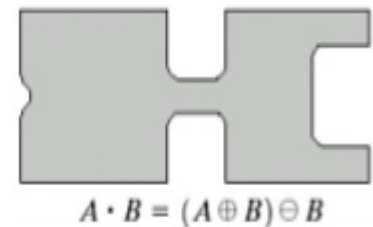
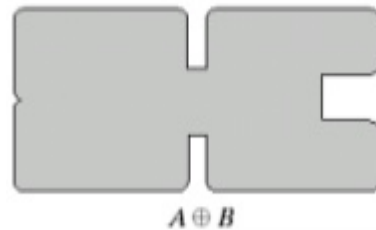
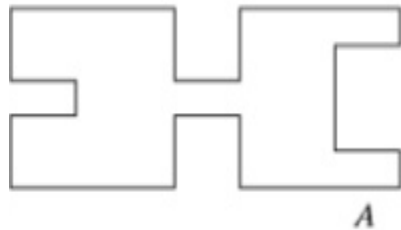
Closing (cont.)



Effect of closing using 3x3 square structuring element

Properties of closing

- $A \subseteq (A \bullet B)$.
- $(A \bullet B) \bullet B = A \bullet B$; that is, closing, like opening, is idempotent.
- If $A \subseteq C$, then $(A \bullet B) \subseteq (C \bullet B)$.
- Closing tends also to **smooth** an image, but it fuses narrow breaks and thin gulfs, and eliminates small holes.



Noise removal

- ❑ Suppose A is a **binary image** corrupted by impulse noise—some of the black pixels are white, and some of the white pixels are black.
- ❑ Then $A \ominus B$ will **remove** the single **white pixels**, but will enlarge the holes.
- ❑ We can **fill the holes** by dilating twice: $((A \ominus B) \oplus B) \oplus B$.
- ❑ The first dilation returns the holes to their original size; the second dilation removes them. But this will enlarge the objects in the image. To reduce them to their correct size, perform a final erosion: $((A \ominus B) \oplus B) \oplus B \ominus B$
- ❑ Thus this noise removal method is in fact an opening followed by a closing:
 $(A \circ B) \bullet B$
- ❑ This is called **morphological filtering**.

An application: noise removal

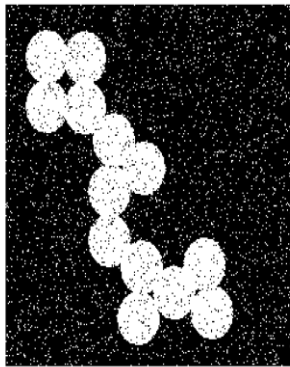
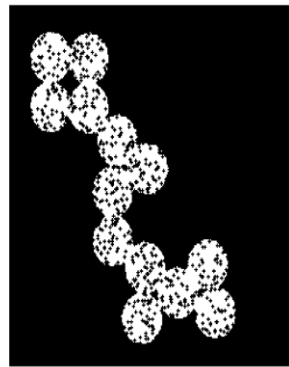
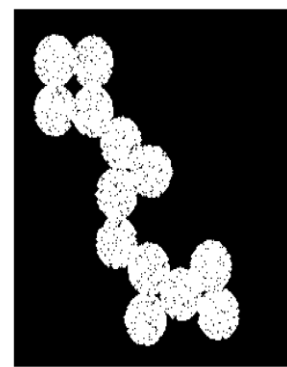


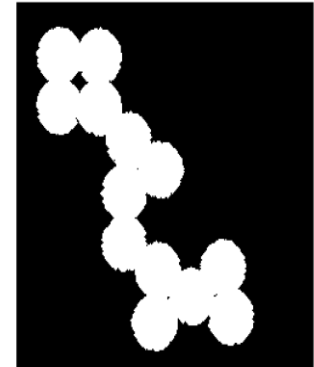
Image with impulse noise



$A \ominus B$

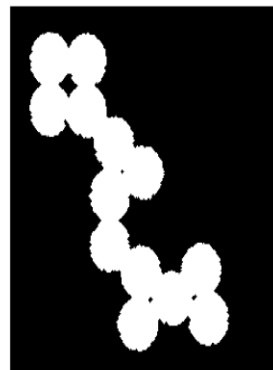


$((A \ominus B) \oplus B)$



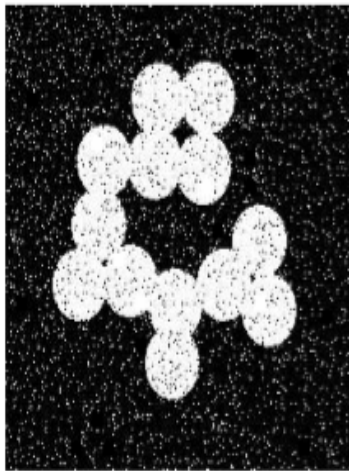
$((((A \ominus B) \oplus B) \oplus B)$

```
import skimage.io as io
import numpy as np
img=io.imread('circles.png')
x=np.random.random_sample(img.shape)
img[np.nonzero(x>0.95)]=0
img[np.nonzero(x<=0.05)]=1
```

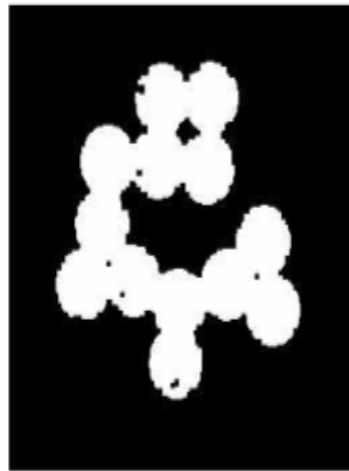


$((((A \ominus B) \oplus B) \oplus B) \ominus B)$

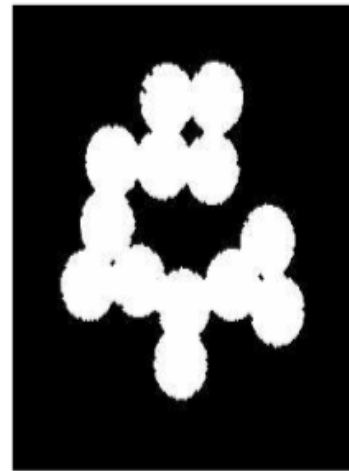
An application: noise removal



(a)



(b)



(c)

A noisy binary image and results after morphological filtering with different structuring elements.

```
import skimage.io as io
import numpy as np
from skimage.morphology import binary_closing as bwclose
from skimage.morphology import binary_opening as bwopen
img=io.imread('circle_noise.jpg')
sq = np.ones((3,3))
img2=bwclose(bwopen(img,sq),sq)
```

Relationship between opening and closing

- Opening and closing share a relationship very similar to that of erosion and dilation:
- the complement of an opening is equal to the closing of a complement, $\overline{A \circ B} = \overline{A} \bullet \hat{B}$.

$$\overline{A \bullet B} = \overline{A} \circ \hat{B}$$

- complement of an closing is equal to the opening of a complement.

Next Week Lecture (Week8)

- Lecture8:Color Processing

Thank You