

Part 3: Image Processing Basics of Mathematical Morphology

Georgy Gimel'farb

COMPSCI 373 Computer Graphics and Image Processing













- Main concepts
- O Structuring element
- 3 Erosion
- 4 Dilation
- **5** Opening
- 6 Closing
- Hit-and-Miss transform
- **8** Greyscale Morphology

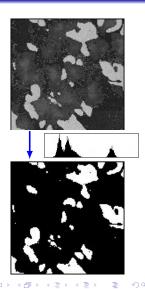


Morphology: a study of structure or form. (http://www.merriam-webster.com/dictionary/morphology) Morphological image processing may remove imperfections of a binary image.

 Regions in binary images produced by simple thresholding are typically distorted by noise.

Morphological operations are non-linear and account for structure and forms of regions (objects) to improve an image.

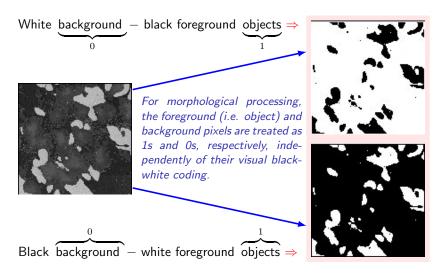
• These operations can be extended to greyscale images.

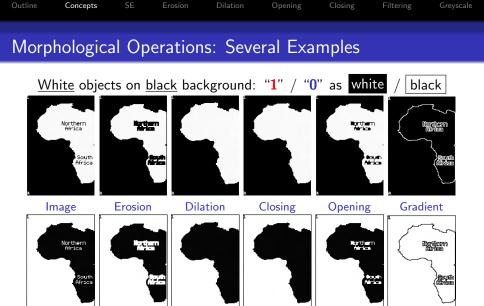


Binary Images: Object/Background

Outline

Concepts





<u>Black</u> objects on <u>white</u> background: "1" / "0"

white

as

< (T) >

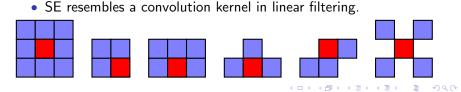
black



Morphological operations rely on $\underline{\text{relative ordering}}$ of pixel values, not on their numerical values.

- Thus the operations are especially suited to binary image processing.
- These operations can be applied also to greyscale images such that their absolute pixel values are of no or minor interest.
 - E.g. images with unknown light transfer functions.

Morphological operations probe an image with a small shape or template called a **structuring**, or structure **element** (SE).





A small binary image, i.e. a small matrix of pixels, each with a value of zero (0) or one (1).

- Zero-valued pixels of the SE are ignored.
- Size of the SE: the matrix dimensions.
- **Shape** of the SE: the pattern of ones and zeros.
- Origin of the SE: usually, one of its pixels.
 - Generally, the origin can be also outside the matrix.



 0
 0
 1
 0
 0

 0
 1
 1
 1
 0

 1
 1
 1
 1
 1

 0
 1
 1
 1
 0

 0
 1
 1
 1
 0

 0
 1
 1
 1
 0

 0
 0
 1
 0
 0

0

0

0

0

| 1 | 1 | 1 | |
|---|---|---|--|
| 1 | 1 | 1 | |
| 1 | 1 | 1 | |

Cross-shaped 5x5 element

Square 3x3 element

Square 5x5 element

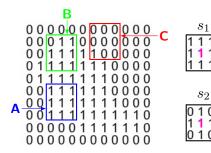
Diamond-shaped 5x5 element



Structuring Element

When an SE is placed in a binary image, each its pixel is associated with the pixel of the area under the SE:

- The SE fits the image if for each of its pixels set to 1 the corresponding image pixel is also 1.
- The SE hits (intersects) the image if at least for one of its pixels set to 1 the corresponding image pixel is also 1.



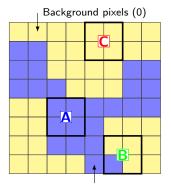
| | | Α | В | С |
|-----|-------|-----|-----|-----|
| fit | s_1 | yes | no | no |
| | s_2 | yes | yes | no |
| hit | s_1 | yes | yes | yes |
| | s_2 | yes | yes | no |

Outline Concepts SE Erosion Dilation Opening Closing Filtering Greyscale

Probing with a Structuring Element (SE)



- A: SE fits the foreground (object);
- B: SE hits (intersects with) the object;
- C: SE neither fits, nor hits the object.

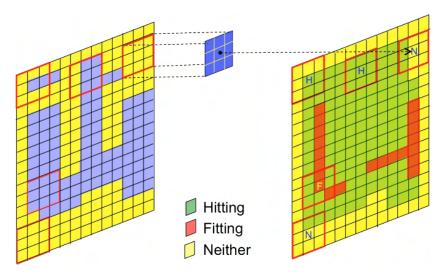


Foreground pixels, or objects of interest (1 or any non-zero value)

- SE is positioned at all possible locations in an image and compared with the pixel neighbourhood at each location.
- Operations test whether the SE "fits" within the neighbourhood or "hits" the neighbourhood.
- An operation on a binary image creates a new binary image in which the pixel has a foreground value only if the test at that place in the input image is successful.



Probing with a Structuring Element (SE)

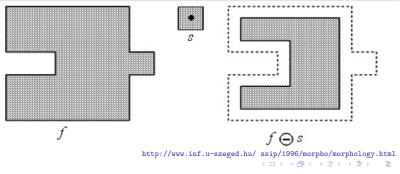




Erosion $f \ominus s$ of a binary image f by an SE s produces a new binary image $g = f \ominus s$.

Eroded image g has ones in all locations (x, y) of an origin of the SE s at which s **fits** the input image f.

For all pixel coordinates (x, y), g(x, y) = 1 if s fits f and 0 otherwise.



Erosion

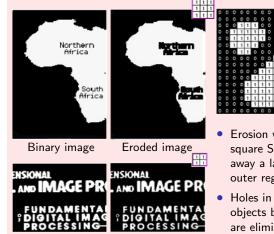
Ope

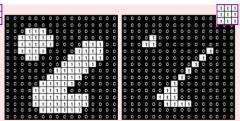
Opening

Filtering

Greyscale

Erosion of a Binary Image with 2×2 and 3×3 SE





- Erosion with small (e.g. $2 \times 2 5 \times 5$) square SEs shrinks an image by stripping away a layer of pixels from both inner and outer region boundaries.
- Holes in and gaps between foreground objects become larger, and small details are eliminated.

www.cs.princeton.edu/ pshilane/mosaic/ www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html //documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html



Larger SEs have a more pronounced effect.

- Erosion with a large SE is similar to an iterated erosion with a smaller SE of the same shape. I
- If a pair of SEs s_1 and s_2 are identical in shape, with s_2 twice the size of s_1 , then $f \ominus s_2 \approx (f \ominus s_1) \ominus s_1$.

Erosion removes fine (small-scale) details, as well as noise from a binary image.

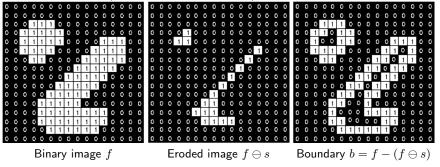
- Simultaneously, erosion reduces the size of regions of interest (objects), too.
- Background areas are growing, i.e. an image with the black or white background becomes blacker or whiter, respectively.



Internal gradient $b = f - (f \ominus s)$ of each region:

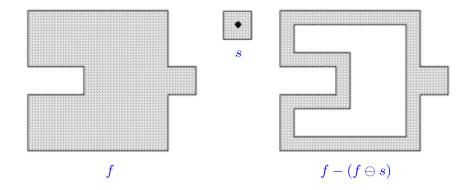
by subtracting the eroded image from an original image.

Gradient is computed with the 3×3 square SE: $\frac{1}{11}$





Internal gradient of each region:



http://www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

イロン イロン イヨン イヨン 三日

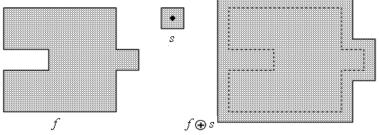
 Outline
 Concepts
 SE
 Erosion
 Dilation
 Opening
 Closing
 Filtering
 Greyscale

 Fundamental Operation:
 Dilation

Dilation $f \oplus s$ of a binary image f by an SE s produces a new binary image $g = f \oplus s$.

Dilated image g has ones in all locations (x, y) of an origin of the SE s at which s <u>hits</u> the input image f.

For all pixel coordinates (x, y), g(x, y) = 1 if s hits f and 0 otherwise.



http://www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

Outline

SE

Dilation

Erosion

Ope

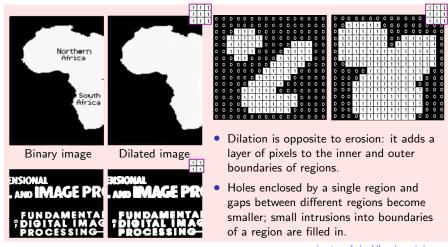
Opening

Closing

Filtering

Greyscale

Dilation of a Binary Image with 2×2 and 3×3 SE



www.cs.princeton.edu/ pshilane/mosaic/ www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html //documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html

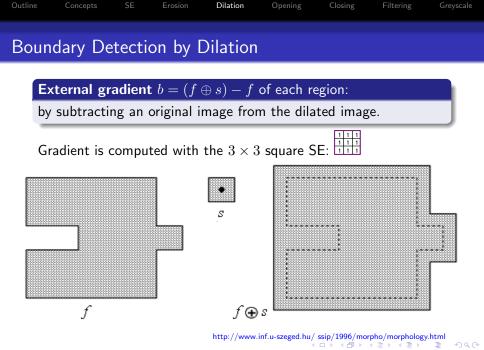


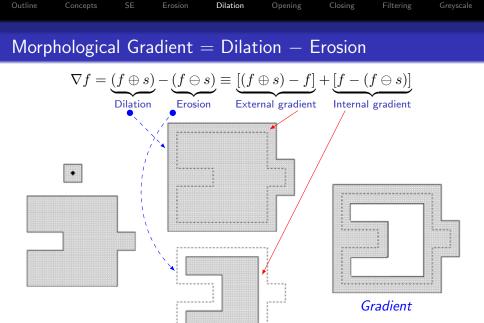
Dilation and erosion are **dual operations** in that they have opposite effects: $f \oplus s = f^c \oplus s_{rot}$.

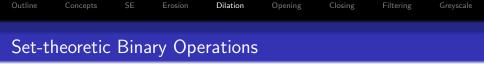
- $f^{\rm c}$ the complement of f produced by replacing "1"s / "0"s with "0"s / "1"s.
- $s_{\rm rot}$ the SE s rotated by 180° .
 - If a SE is symmetric with respect to rotation, then $s_{\rm rot}$ does not differ from s.

If a binary image is considered as a collection of connected regions of "1"s on background of "0"s:

- Erosion is the fitting of the SE to these regions.
- **Dilation** is the fitting of the SE, rotated if necessary, into the background, followed by inversion of the result.

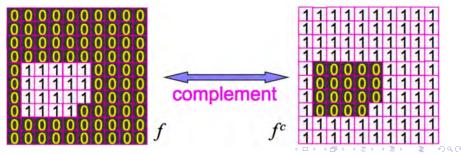






- Many morphological operations are combinations of erosion, dilation, and simple set-theoretic operations.
- Set-theoretic complement of a binary image:

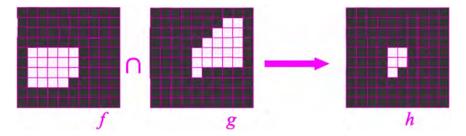
$$f^{c}(x,y) = \begin{cases} 1 & \text{if } f(x,y) = 0\\ 0 & \text{if } f(x,y) = 1 \end{cases}$$



Outline Concepts SE Erosion Dilation Opening Closing Filtering Greyscale Set-theoretic Binary Operations: Intersection

Intersection $h = f \bigcap g$ of two binary images f and g:

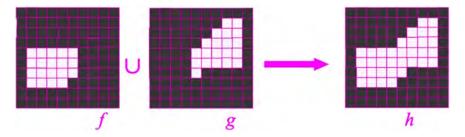
$$h(x,y) = \begin{cases} 1 & \text{if } f(x,y) = 1 \text{ AND } g(x,y) = 1 \\ 0 & \text{otherwise} \end{cases}$$



Outline Concepts SE Erosion Dilation Opening Closing Filtering Greyscale Set-theoretic Binary Operations: Union Union

Union $h = f \bigcup g$ of two binary images f and g:

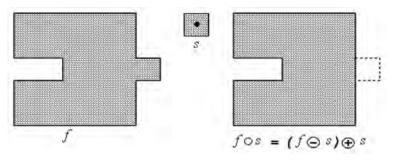
$$h(x,y) = \left\{ \begin{array}{ll} 1 & \text{if} \quad f(x,y) = 1 \ \mathbf{OR} \ g(x,y) = 1 \\ 0 \quad \text{otherwise} \end{array} \right.$$



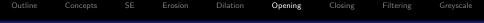


Opening $f \circ s$ of an image f by a structuring element s is an **erosion** followed by a **dilation**:

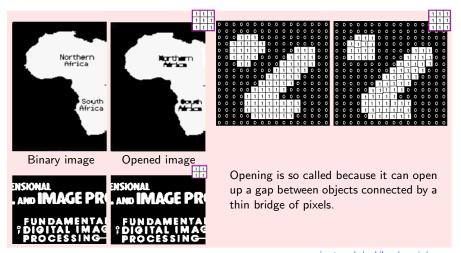
$$f \circ s = (f \ominus s) \oplus s$$



http://www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

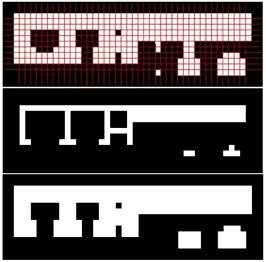


Opening of a Binary Image with Square 2×2 and 3×3 SE



www.cs.princeton.edu/ pshilane/mosaic/ www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html //documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html

Opening a Binary Image with a Square 3×3 SE



Outline

Initial image f: white "1"s and black "0"s

Opening

Erosion $f \ominus s$

$$\mathsf{Opening}\,\,f\circ s=(f\ominus s)\oplus s$$

www.cs.ru.nl/ ths/rt2/col/h11/11morphENG.html



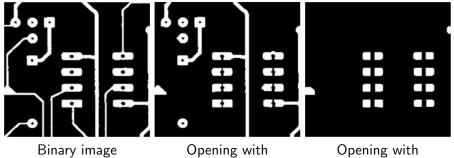
Any regions survived the erosion are restored to their original size by the dilation:



Idempotent operation: $(f \circ s) \circ s = f \circ s$

 Once an image is opened, next openings with the same structuring element have no further effect.

Opening a Binary Image with Square 5×5 and 9×9 SE



 $a 5 \times 5 SE$

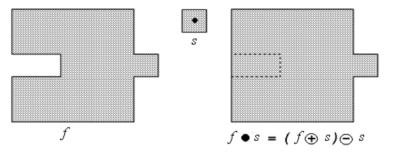
Opening with a 9×9 SE

www.mmorph.com/html/morph/mmopen.html/



Closing $f \bullet s$ of an image f by a structuring element s is a **dilation** followed by an **erosion**:

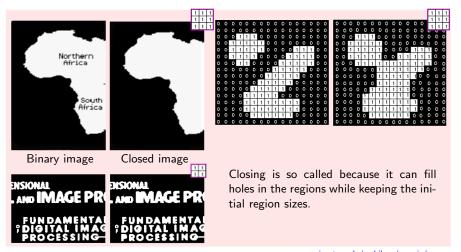
$$f ullet s = (f \oplus s) \ominus s$$



http://www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

<ロ > < 回 > < 回 > < 目 > < 目 > < 目 > 目 の Q (~ 29 / 59 Outline Concepts SE Erosion Dilation Opening Closing Filtering Greyscale

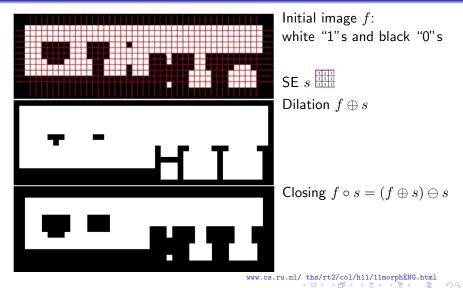
Closing of a Binary Image with Square 2×2 and 3×3 SE



www.cs.princeton.edu/ pshilane/mosaic/ www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html //documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology.ltmageProcessing6.3.html

Closing a Binary Image with a Square 3×3 SE

Outline

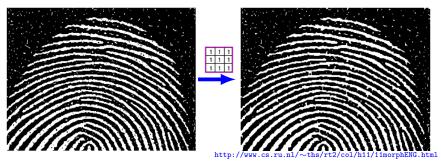


Closing



Dilation and erosion with a rotated by 180° SE.

• Typical symmetric SE: the rotated and initial SE do not differ.



Idempotent operation: $(f \bullet s) \bullet s = f \bullet s$

• Once an image is closed, next closings with the same structuring element have no further effect.



Closing is the **dual operation** of opening.

• Just as opening is the dual operation of closing.

Closing of a binary image (*dual implementation*):

- Take the **complement** of that image ("1 / 0" \Rightarrow "0 / 1").
- Perform **opening** with the structuring element.
- Take the complement of the result.

Opening of a binary image (*dual implementation*):

- Take the complement of that image ("1 / 0" ⇒ "0 / 1").
- Perform **closing** with the structuring element.
- Take the complement of the result.



Closing with a square or disk SE:

- Fills thin connections within an object.
- Eliminates small holes and fills dents in contours.
- Fills small gaps in parts of an object.

Opening with a square or disk SE:

- Breaks thin connections within an object.
- Eliminates small islands and sharp protrusions.



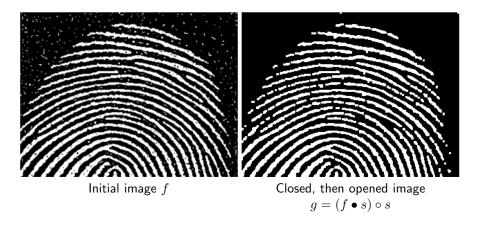


34/59

< ロ > < 同 > < 回 > < 回 >



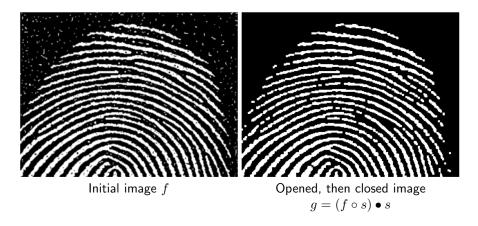
Binary Image: Closing + Opening



http://www.cs.ru.nl/~ths/rt2/col/h11/11morphENG.html



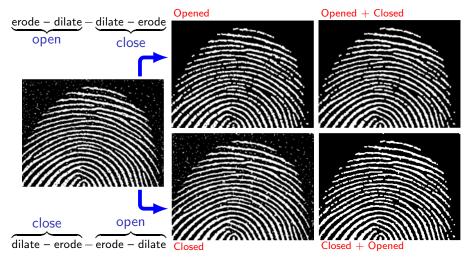
Binary Image: Opening + Closing



http://www.cs.ru.nl/~ths/rt2/col/h11/11morphENG.html

line Concepts SE Erosion Dilation Opening **Closing** Filtering Greysca

Opening+Closing vs. Closing+Opening

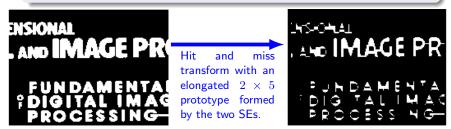




The hit-and-miss transform tests how objects in a binary image relate to their surroundings.

Matched pair of SEs, $\{s_1, s_2\}$, probes the inside and outside, respectively, of objects in the image:

$$f \otimes \{s_1, s_2\} = (f \ominus s_1) \bigcap (f^{\mathsf{c}} \oplus s_2)$$

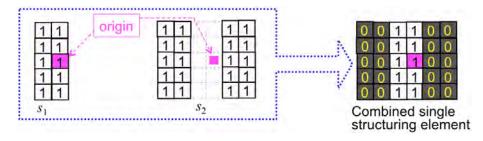


http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html



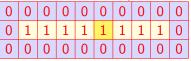
Preserves a pixel of a region if and only if s_1 for that pixel fits inside the region AND s_2 for that pixel fits outside the region.

• Structuring elements s_1 and s_2 do not intersect, otherwise it would be impossible for both fits to occur simultaneously.





Easier description: by considering s_1 and s_2 as a single element with "1"s for pixels of s_1 and "0"s for pixels of s_2 :



- An output pixel is set to 1 only if the 1s and 0s in the SE exactly match the 1s and 0s, respectively, in the input image.
- Otherwise, that pixel is set to 0.

If the two SEs together present a specific shape (spatial pattern of foreground 1s and background 0s), the transform can detects the desired shapes.

• The transform can be used for thinning or thickening of linear elements of objects.



Compound operations (e.g. opening and closing) act as non-linear filters of shape in a binary image.

- Opening and closing with a disc SE smooth corners from the inside and the outside, respectively.
- Details smaller in size than the disc are also filtered out.
 - Opening is filtering at a scale of the size of the SE.
 - Only those portions of the image that fit the SE are passed by the filter.
 - Smaller structures are blocked and excluded.

The size of the SE is most important in order to eliminate noisy details but not to damage objects.

• If the SE is too large, the object could be degraded by the operation.



Definitions of operations:

Similar to the binary case but with the additional dimension of pixel grey level.

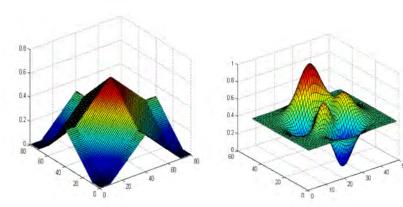
An image is considered as a 3D surface f(x, y).

- The height at any point represents the non-negative integer grey level f at that point.
- The structuring element $s(\xi,\eta)$ is also 3D surface, but its pixels take any integer value s, including zero and negative values.



f(x, y)

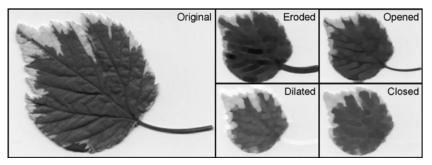




http://www.cs.wits.ac.za/ michael/Lab5.html



- The SE is sometimes referred in the greyscale morphology to as a structuring function.
- Zero value is now significant: pixels that do not participate in morphological operations have to be indicated by some other means.



http://rsb.info.nih.gov/ij/plugins/images/gray-morphology.jpg



Greyscale erosion $f \ominus s$ of an image f by the SE s:

Replacing the grey level in the pixel aligned with the origin of s with the minimum difference between each pixel grey level in f and the corresponding value in s over the domain \mathbb{S}_s of the SE:

$$f_{\text{ero}}(x,y) = \min_{(\xi,\eta) \in \mathbb{S}_s} \{ f(x+\xi,y+\eta) - s(\xi,\eta) \}$$

| 220 | 210 | 120 | 45 | 50 | | | | | 12 | E E E | E-E) | |
|-----|-----|-----|----|----|----------|----|----|----|-------------------|-------|------|-----|
| 225 | 200 | 130 | 67 | 53 | | -1 | -9 | -1 | | 101 | 56 | 42 |
| 202 | 199 | 100 | 73 | 45 | Θ | 11 | 11 | 11 | $ \Rightarrow $ | 89 | 62 | 34 |
| 189 | 190 | 110 | 68 | 49 | | -1 | -9 | -1 | | 101 | 57 | 38 |
| 190 | 200 | 134 | 71 | 57 | 1 | | | | 11 | | | 111 |

・ロト・白マ・山マ・山マ・山

45 / 59



Greyscale erosion $f_{\text{ero}} = f \ominus s$ of an image f by the SE s:

$$f_{\text{ero}}(x,y) = \min_{(\xi,\eta) \in \mathbb{S}_s} \{ f(x+\xi,y+\eta) - s(\xi,\eta) \}$$

where (ξ, η) — 2D indices of a pixel in the SE *s*, i.e. pixel coordinates with respect to the origin of the SE *s*.

• For a $(2k+1) \times (2k+1)$ square SE s, the indices $\xi, \eta \in [-k, -k+1, \dots, 0, 1, \dots, k].$

| 220 | 210 | 120 | 45 | 50 |
|-----|-----|-----|----|----|
| 225 | 200 | 130 | 67 | 53 |
| 202 | 199 | 100 | 73 | 45 |
| 189 | 190 | 110 | 68 | 49 |
| 190 | 200 | 134 | 71 | 57 |

 $\min \left\{ \begin{matrix} 220+ \ 1,210+ \ 9,120+ \ 1,\\ 225-11,200-11,130-11,\\ 202+ \ 1,199+ \ 9,100+ \ 1 \end{matrix} \right\}$

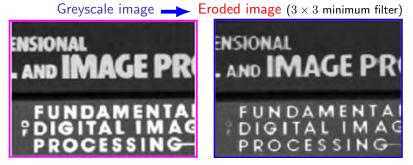
 $= \min\{221, 219, 121, 214, 189, \\119, 203, 208, 101\} = 101$

46 / 59



Flat structuring element: $s(\xi, \eta) = 0$ for all $(\xi, \eta) \in \mathbb{S}_s$.

- Erosion with the flat SE: $f_{\text{ero}}(x, y) = \min_{(\xi, \eta) \in \mathbb{S}_s} \{ f(x + \xi, y + \eta) \}$
- The same effect as the minimum rank, or minimum filter:

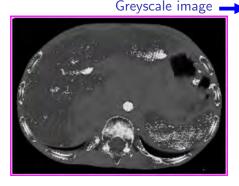


http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

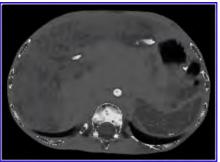
イロト イポト イヨト イヨト



Selects the minimum (bottom-ranked) grey level from the neighbourhood as the output value.



Greyscale image \longrightarrow Eroded image (3 \times 3 minimum filter)



http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

> <□ ト < □ ト < □ ト < 亘 ト < 亘 ト < 亘 ト ○ Q (~ 48 / 59



Greyscale dilation $f \oplus s$ of an image f by the SE s:

Replacing the grey level in the pixel aligned with the origin of s with the maximum sum of each pair of the pixel grey level in f and the corresponding value in s over the domain \mathbb{S}_s of the SE:

$$f_{\mathsf{dil}}(x,y) = \max_{(\xi,\eta) \in \mathbb{S}_s} \{f(x-\xi,y-\eta) + s(\xi,\eta)\}$$

| 220 | 210 | 120 | 45 | 50 | | | | | | 1 | H. | |
|-----|-----|-----|----|----|----------|----|----|----|-------------------------|-----|-----|-----|
| 225 | 200 | 130 | 67 | 53 | | -1 | -9 | -1 | | 236 | 211 | 141 |
| 202 | 199 | 100 | 73 | 45 | \oplus | 11 | п | 11 | $ \Rightarrow \square$ | 224 | 210 | 111 |
| 189 | 190 | 110 | 68 | 49 | | -1 | -9 | -1 | | 201 | 201 | 133 |
| 190 | 200 | 134 | 71 | 57 | | | | | 1 | 11 | 1 | |

▲□▶▲@▶▲≣▶▲≣▶ = ● ● ●

49 / 59



Greyscale dilation $f_{dil} = f \oplus s$ of an image f by the SE s:

$$f_{\mathsf{dil}}(x,y) = \max_{(\xi,\eta) \in \mathbb{S}_s} \{ f(x-\xi, y-\eta) + s(\xi,\eta) \}$$

where (ξ, η) — 2D indices of a pixel in the SE s.

Greyscale dilation is a dual operation with respect to erosion.

1

| 220 | 210 | 120 | 45 | 50 |
|-----|-----|-----|----|----|
| 225 | 200 | 130 | 67 | 53 |
| 202 | 199 | 100 | 73 | 45 |
| 189 | 190 | 110 | 68 | 49 |
| 190 | 200 | 134 | 71 | 57 |

| -1 | -9 | -1 |
|----|----|----|
| 11 | 11 | 11 |
| -1 | -9 | -1 |

| 1 | (220 - 1,210 - 9,120 - 1,) | |
|----------------|---|---|
| $\max \langle$ | $ \begin{array}{c} 220-1,210-9,120-1,\\ 225+11,200+11,130+11, \end{array} $ | ł |
| | 202 - 1,199 - 9,100 - 1 | |

 $= \max\{219, 201, 119, 236, 211, \\141, 201, 190, 99\} =$ **236**



Flat structuring element: $s(\xi,\eta) = 0$ for all $(\xi,\eta) \in \mathbb{S}_s$.

- Dilation with the flat SE: $f_{dil}(x, y) = \max_{(\xi, \eta) \in \mathbb{S}_s} \{ f(x \xi, y \eta) \}$
- The same effect as the maximum rank, or maximum filter:

Greyscale image \longrightarrow Dilated image (3 \times 3 maximum filter)



http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

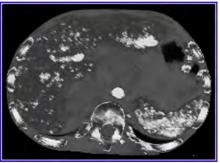
イロト イポト イヨト イヨト



Selects the maximum (top-ranked) grey level from the neighbourhood as the output value.



Greyscale image \longrightarrow Dilated image (3 \times 3 maximum filter)



・ロト ・四ト ・ヨト ・ヨト

http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html



Opening and **closing** for greyscale images are defined just as those for binary images:

Opening
$$f \circ s = (f \ominus s) \oplus s$$

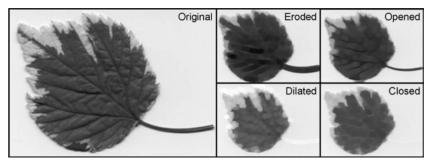
Closing $f \bullet s = (f \oplus s) \ominus s$

With an appropriate structuring element, these operations can smooth the image.

• However, it is the surface of grey levels that is smoothed, rather than the contours of shapes in a binary image.



- Opening tends to smooth away small-scale **bright** details in an image.
- Closing tends to smooth away the small-scale **dark** details in an image.

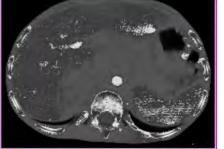


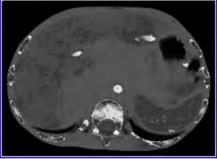
http://rsb.info.nih.gov/ij/plugins/images/gray-morphology.jpg



Greyscale Opening

Greyscale image **Opened image** $(3 \times 3 \text{ square flat filter})$





Smoothing out bright small-scale noisy details of the initial image.

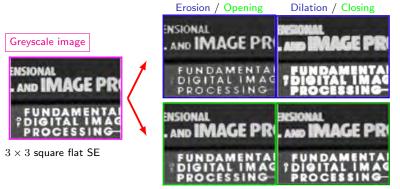
http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

Outline Concepts SE Erosion Dilation Opening Closing Filtering Greyscale

Erosion - Opening / Dilation - Closing

The pairs differ like the corresponding binary operations.

- Erosion shrinks bright features and enlarges dark features.
- Opening removes small bright features, but does not enlarge dark ones.
- Similar considerations apply to dilation and closing.



http://documents.wolfram.com/applications/digitalimage/UsersGuide/Morphology/ImageProcessing6.3.html



Morphological smoothing: an opening-closing iteration.

- Removes small-scale bright and dark details.
- Resembles extreme forms of the median filter.

Top-hat transform: $g = f - (f \circ s)$.

- Opening $f \circ s$ removes small-scale bright details.
- Top-hat transform selects only these details.
- Therefore the top-hat transform acts as a detector of peaks and ridges of the grey level surface.



 Greyscale image
 Top-hat transform (3 × 3 square flat SE)

 Image: Strain of the strain of th

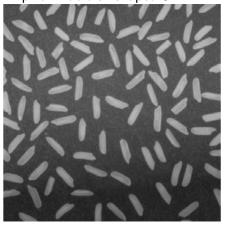
The dual of the top-hat transform, $(f \bullet s) - f$, detects pits and valleys in the grey level surface.

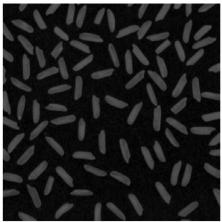
www.inf.u-szeged.hu/ ssip/1996/morpho/morphology.html

-



Correcting uneven illumination if the background is dark with a 12 pixel wide disk-shaped SE:





http://www.mathworks.fr/help/toolbox/images/ref/imtophat.html