

Embedded Vision Design

EVD1 - Week 5

Morphological Filters

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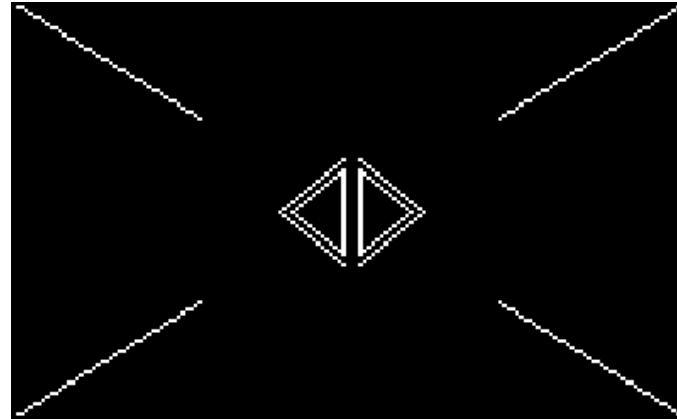
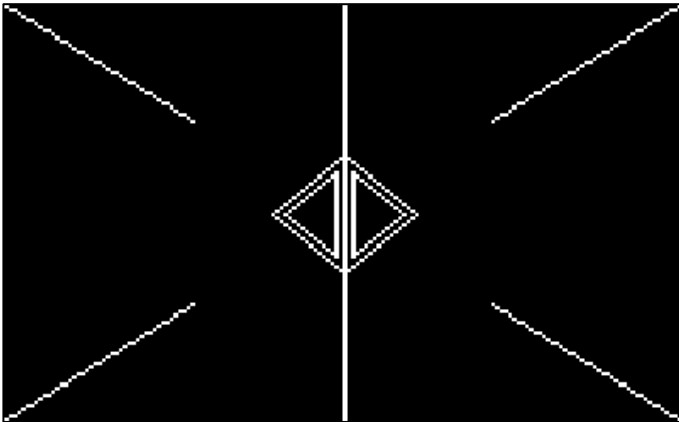
Morphological filters

- Are used prior to pattern recognition and object classification
- Changes the geometrical shape of the objects
- The goal is to smooth the object's contours and to decompose objects in their fundamental shapes
- Remove border blobs
- Fill holes
- Dilation & Erosion
- Closing & Opening
- Hit-miss
- Outline
- Skeleton

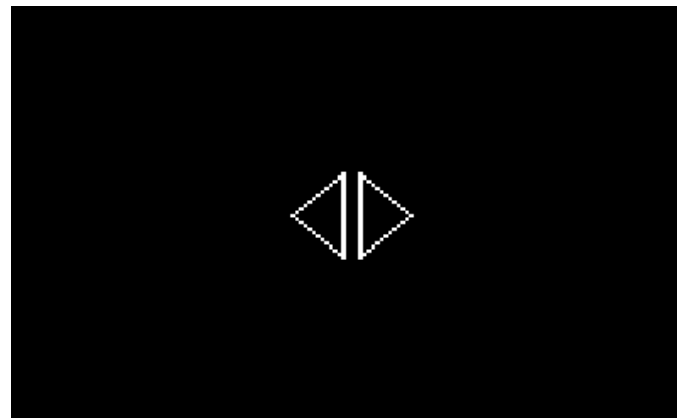
Remove border BLOBs

- Removes all objects that are 4/8-connected to a border

Remove border BLOBs - example



4-connected



8-connected

Remove border BLOBs

		1					
	1					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	1		1	1	1	1	

Source



						1	
					1	1	
						1	
						1	

Destination 8-connected

Remove border BLOBs – Iterative algorithm

		1					
	1					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	1		1	1	1	1	

Remove border BLOBs – Iterative algorithm

		2					
	1					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	2				1	1	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	2				2	1	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	1	1	1			1	
	2						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	2	1	1			1	
	2						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	2	2	1			1	
	2						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	2	2	2			1	
	2						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	2		1			1	
	2	2	2			1	
	2						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

		2					
	2					1	
					1	1	
	2		2			1	
	2	2	2			1	
	2						
	2				2	2	
	2		2	2	2	2	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked

Remove border BLOBs – Iterative algorithm

						1	
					1	1	
						1	
						1	

- Mark border object pixels
- While changes
 - Loop entire image and assign marker value if a neighbor is also marked
- Set marked pixels to background value (0)

Remove border BLOBs – Iterative algorithm

Advantage

- Easy implementation

Disadvantage

- Very slow, especially if the image is scanned in a single direction and the object happens the point towards the opposite direction

Remove border BLOBs – Iterative algorithm

```
uint32_t removeBorderBlobsIterative(  
    const image_t *src, image_t *dst,  
    const eConnected connected);
```

See file **EVDK_Operators\morphological_filters.c**

```
// Threshold the image  
threshold2Means(src, tmp, BRIGHTNESS_DARK);  
  
// Remove the border BLOBs  
removeBorderBlobsIterative(tmp, dst, CONNECTED_EIGHT);
```

Remove border BLOBs – Two-pass algorithm

		1					
	1					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	1		1	1	1	1	

Equivalence LUT					
1					
1					

Remove border BLOBs – Two-pass algorithm

		2					
	1					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT

Equivalence LUT					
1	2				
1	2				

Remove border BLOBs – Two-pass algorithm

		2					
	2					1	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**

Equivalence LUT					
1	2				
1	2				

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
 - No: **mark this pixel with a new value**

Equivalence LUT					
1	2				
1	2				

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					1	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
 - No: mark this pixel with a new value
- Add to equivalence LUT**

Equivalence LUT					
1	2	3			
1	2	3			

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	1	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
 - No: mark this pixel with a new value
- Add to equivalence LUT

Equivalence LUT					
1	2	3			
1	2	3			

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	1		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
 - No: mark this pixel with a new value
- Add to equivalence LUT

Equivalence LUT					
1	2	3			
1	2	3			

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		1			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
 - No: **mark this pixel with a new value**
- Add to equivalence LUT**

Equivalence LUT					
1	2	3	4		
1	2	3	4		

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			1	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
 - No: **mark this pixel with a new value**
- Add to equivalence LUT**

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	5	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	1	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
 - No: mark this pixel with a new value
- Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	5	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	1	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
 - No: mark this pixel with a new value
- Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	5	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
 - Update equivalence LUT
 - Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
 - No: mark this pixel with a new value
- Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	5	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	1			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
and
Update the LUT to the lowest neighbor value
 - No: mark this pixel with a new value
Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	4	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			1	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
and
Update the LUT to the lowest neighbor value
 - No: mark this pixel with a new value
Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	4	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	1						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
and
Update the LUT to the lowest neighbor value
 - No: mark this pixel with a new value
Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	4	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	1				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
and
Update the LUT to the lowest neighbor value
 - No: mark this pixel with a new value
Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	4	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
and
Update the LUT to the lowest neighbor value
 - No: mark this pixel with a new value
Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	4	4	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				1	1	
	2		2	2	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
and
Update the LUT to the lowest neighbor value
 - No: mark this pixel with a new value
Add to equivalence LUT

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	4	

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				1	1	
	2		2	2	2	2	

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: mark this pixel with the same value
and
Update the LUT to the lowest neighbor value
and
Search the LUT for other equivalence updates
 - No: mark this pixel with a new value
Add to equivalence LUT

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				2	1	
	2		2	2	2	2	

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
and
Update the LUT to the lowest neighbor value
and
Search the LUT for other equivalence updates
 - No: mark this pixel with a new value
Add to equivalence LUT

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				2	2	
	2		2	2	2	2	

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

- Mark border object pixels
- Update equivalence LUT
- Loop entire image
 - Is it an object pixel?
 - Is a neighbor already marked?
 - Yes: **mark this pixel with the same value**
and
Update the LUT to the lowest neighbor value
and
Search the LUT for other equivalence updates
 - No: mark this pixel with a new value
Add to equivalence LUT

Remove border BLOBs – Two-pass algorithm

		2					
	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				2	2	
	2		2	2	2	2	

- Loop entire image

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

Remove border BLOBs – Two-pass algorithm

	2					3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				2	2	
	2		2	2	2	2	

- Loop entire image
 - Is it an object pixel?
 - Is the corresponding LUT value set to 2?
 - Yes: **assign background (0)**

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

Remove border BLOBs – Two-pass algorithm

						3	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				2	2	
	2		2	2	2	2	

- Loop entire image
 - Is it an object pixel?
 - Is the corresponding LUT value set to 2?
 - Yes: **assign background (0)**

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

Remove border BLOBs – Two-pass algorithm

						1	
					3	3	
	4		5			3	
	4	4	4			3	
	4						
	2				2	2	
	2		2	2	2	2	

- Loop entire image
 - Is it an object pixel?
 - Is the corresponding LUT value set to 2?
 - Yes: assign background (0)
 - No: **assign foreground (1)**

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

Remove border BLOBs – Two-pass algorithm

						1	
					1	1	
						1	
						1	

- Loop entire image
 - Is it an object pixel?
 - Is the corresponding LUT value set to 2?
 - Yes: assign background (0)
 - No: **assign foreground (1)**

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

Remove border BLOBs – Two-pass algorithm

						1	
					1	1	
						1	
						1	

- The size of the equivalence LUT decides the number of labels that can be used
- The number of required labels is application depended, so we let the application decide by providing an argument

Equivalence LUT					
1	2	3	4	5	
1	2	3	2	2	

Remove border BLOBs – Two-pass algorithm

```
uint32_t removeBorderBlobsTwoPass(  
    const image_t *src,          image_t *dst,  
    const eConnected connected, const uint32_t lutSize);
```

See file **EVDK_Operators\morphological_filters.c**

```
// Threshold the image  
threshold2Means(src, tmp, BRIGHTNESS_DARK);  
  
// Remove the border BLOBs  
removeBorderBlobsTwoPass(tmp, dst, CONNECTED_EIGHT, 128);
```


EVD1 – Assignment



Study guide
Week 5

1 Morphological filters – `removeBorderBlobsTwoPass()`

Fill holes

- Fills the 4/8-connected holes in binary objects

Fill holes - example



4-connected



8-connected

Fill holes

		1	1				
	1			1			
	1			1			
		1	1	1	1	1	1
				1			1
				1			1
				1	1	1	1

- Where to start?

Fill holes

		1	1				
	1			1			
	1			1			
		1	1	1	1	1	1
				1			1
				1			1
				1	1	1	1

- Where to start?
- However, the algorithm is very similar to removing border BLOBs, if:
 - we define a hole as not being connected to the background

Fill holes

		1	1				
	1			1			
	1			1			
		1	1	1	1	1	1
				1			1
				1			1
				1	1	1	1

- Where to start?
- However, the algorithm is very similar to removing border BLOBs, if:
 - we define a hole as not being connected to the background
 - And the background has all 0 pixels connected to the border of the image

Fill holes

2	2	2	2	2	2	2	2
2		1	1				2
2	1			1			2
2	1			1			2
2		1	1	1	1	1	1
2				1			1
2				1			1
2	2	2	2	1	1	1	1

- Mark background border pixels

Fill holes

2	2	2	2	2	2	2	2
2	2	1	1	2	2	2	2
2	1			1	2	2	2
2	1			1	2	2	2
2	2	1	1	1	1	1	1
2	2	2	2	1			1
2	2	2	2	1			1
2	2	2	2	1	1	1	1

- Mark background border pixels
- Mark all adjacent pixels

Fill holes

2	2	2	2	2	2	2	2
2	2	1	1	2	2	2	2
2	1	1	1	1	2	2	2
2	1	1	1	1	2	2	2
2	2	1	1	1	1	1	1
2	2	2	2	1	1	1	1
2	2	2	2	1	1	1	1
2	2	2	2	1	1	1	1

- Mark background border pixels
- Mark all adjacent pixels
- Set background pixels to foreground pixels

Fill holes

		1	1				
	1	1	1	1			
	1	1	1	1			
		1	1	1	1	1	1
				1	1	1	1
				1	1	1	1
				1	1	1	1

- Mark background border pixels
- Mark all adjacent pixels
- Set background pixels to foreground
- Set marked pixels to background

Fill holes

		1	1				
	1	1	1	1			
	1	1	1	1			
		1	1	1	1	1	1
				1	1	1	1
				1	1	1	1
				1	1	1	1

- Two implementations
 - Iterative algorithm
 - Two-pass algorithm

Fill holes – Iterative algorithm

`uint32_t fillHolesIterative(const image_t *src, image_t *dst,
 const eConnected connected);`

See file **EVDK_Operators\morphological_filters.c**

```
// Threshold the image
threshold2Means(src, tmp, BRIGHTNESS_DARK);

// Remove the border BLOBs
fillHolesIterative(tmp, dst, CONNECTED_EIGHT);
```

Fill holes – Two-pass algorithm

```
uint32_t fillHolesTwoPass(    const image_t *src, image_t *dst,  
                             const eConnected connected ,  
                             const uint32_t lutSize);
```

See file **EVDK_Operators\morphological_filters.c**

```
// Threshold the image  
threshold2Means(src, tmp, BRIGHTNESS_DARK);  
  
// Remove the border BLOBs  
fillHolesTwoPass(tmp, dst, CONNECTED_EIGHT, 128);
```

EVD1 – Assignment



Study guide

Week 5

2 Morphological filters – fillHolesTwoPass()

Dilation and erosion

- Dilation of an object increases its geometrical area
- Dilation is defined as the union of all vector additions of all pixels a in object A with all pixels b in the structuring function B :

$$A \oplus B = \{t \in Z^2: t = a + b, a \in A, b \in B\}$$

where

t is an element of the image space Z^2

- Erosion of an object decreases its geometrical area
- Erosion is defined as the complement of the resulting dilation of the complement of object A with structuring function B :

$$A \ominus B = (A^c \oplus B)^c$$

Closing and opening

- All other morphological filters are derived from dilation and erosion
- Closing
- Reduces inward bumps and (small) holes
- Is defined as the dilation followed by an erosion of the dilated object

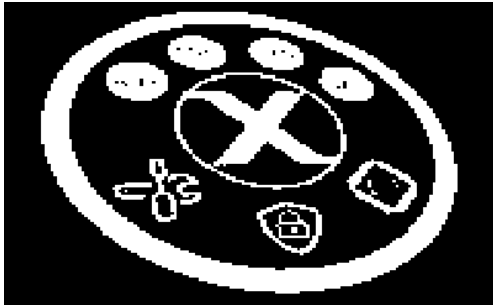
$$\textit{close}(A, B) = (A \oplus B) \ominus B$$

- Opening
- Reduces outward bumps
- Is defined as the erosion followed by a dilation of the eroded object

$$\textit{open}(A, B) = (A \ominus B) \oplus B$$

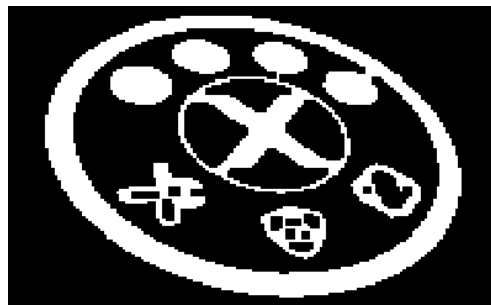
Examples

A



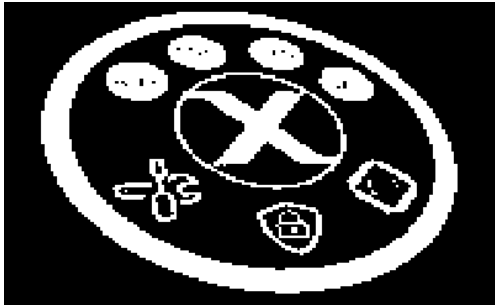
B

1	1	1
1	1	1
1	1	1



Examples

A



B

1	1	1
1	1	1
1	1	1

Dilation



Erosion



Closing

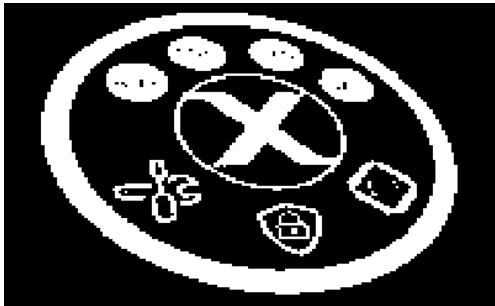


Opening



Examples

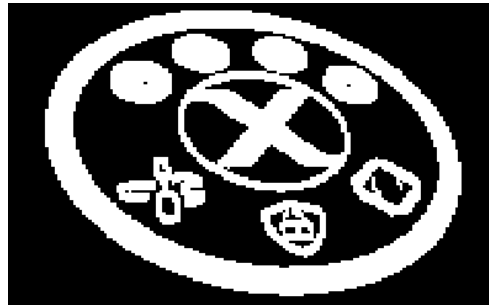
A



B

0	1	0
0	1	0
0	1	0

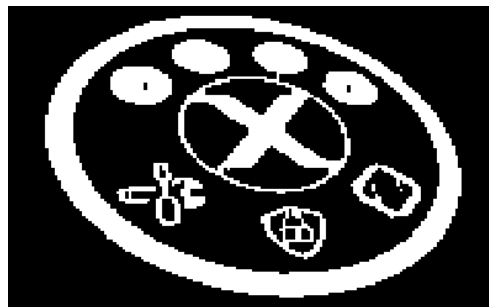
Dilation



Erosion



Closing



Opening



Binary skeleton

- Defines a unique compressed geometrical representation of an object
- Does not necessarily produce a fully connected object
- Is defined as the union of the set of pixels computed from the difference of the $n - 1_{th}$ eroded image and the opening of the n_{th} eroded image:

$$K_n(A) = erode_{n-1}(A) - open(erode_n(A), B)$$

where

$erode_n(A) = A \ominus B_n$ is the n_{th} erosion of the original image A with structuring function B

Binary skeleton

- The skeleton image is then given by the union of all $K_n(A)$ over all erosions
- The number of erosions n required by the skeleton algorithm is the number of erosions of the original image A by the structuring function B that yields the null image:

$$\text{erode}_n(A) = A \ominus B_n = \emptyset$$

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$$A = \text{erode}_0(A, B)$$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$$A = \text{erode}_0(A, B)$$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	0	0	0	0	0	0	0

$$\text{erode}_1(A, B)$$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$open(erode_0(A, B), B)$

$A = erode_0(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	0	0	0	0	0	0	0

$erode_1(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$dilate(erode_1(A, B), B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	1	1	1	0	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	1	1	1	1	1	0	0
0	0	1	1	1	0	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

$$K_1(A) = \text{erode}_0(A, B) - \text{open}(\text{erode}_0(A, B), B)$$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	0	0	0	1	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	0	0	0	1	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$erode_1(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$erode_1(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$erode_2(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$open(erode_1(A, B), B)$

$erode_1(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	1	1	1	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$erode_2(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$dilate(erode_2(A, B), B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	1	0	0	0	0
0	0	1	1	1	0	0	0
0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

$$K_2(A) = \text{erode}_1(A, B) - \text{open}(\text{erode}_1(A, B), B)$$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	0	0	0	1	0	0
0	0	1	0	1	0	0	0
0	0	0	0	0	0	0	0
0	0	1	0	1	0	0	0
0	1	0	0	0	1	0	0
0	0	0	0	0	0	0	0

$$K_1(A) \cup K_2(A)$$

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$erode_2(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$erode_2(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$erode_3(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Done!

Nothing left to erode.

Binary skeleton - example

B

0	1	0
1	1	1
0	1	0

$open(erode_2(A, B), B)$

$erode_2(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	1	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$erode_3(A, B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

$dilate(erode_3(A, B), B)$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0

Done!

Nothing left to erode.

Binary skeleton - example

$$K_3(A) = \text{erode}_2(A, B) - \text{open}(\text{erode}_2(A, B), B)$$

0	0	0	0	0	0	0	0
0	0	0	0	0	0	0	0
0	1	0	0	0	1	0	0
0	0	1	0	1	0	0	0
0	0	0	1	0	0	0	0
0	0	1	0	1	0	0	0
0	1	0	0	0	1	0	0
0	0	0	0	0	0	0	0

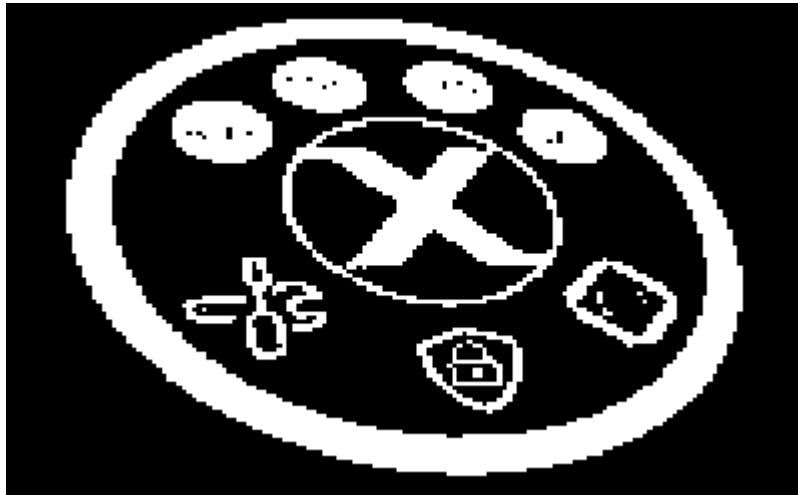
$$K_1(A) \cup K_2(A) \cup K_3(A)$$

Binary skeleton - example

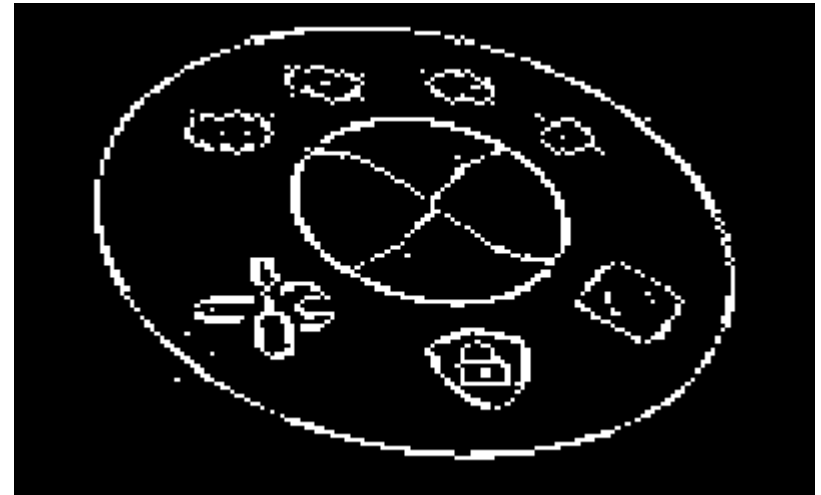
B

0	1	0
1	1	1
0	1	0

A



$K_n(A)$

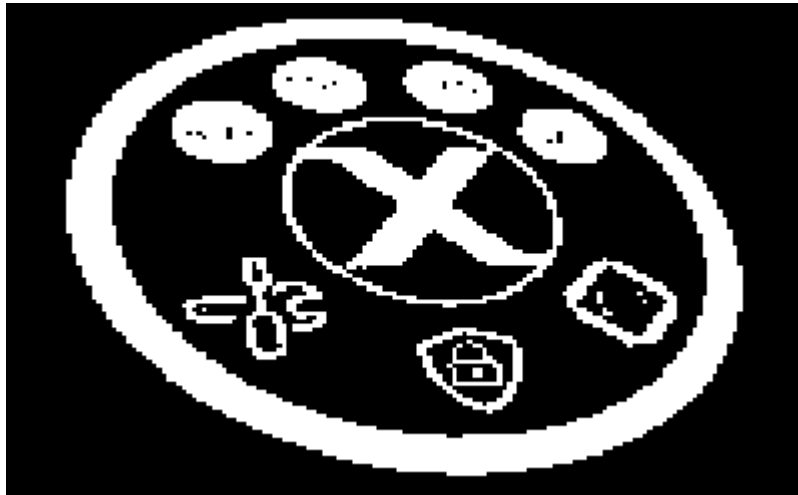


Binary skeleton - example

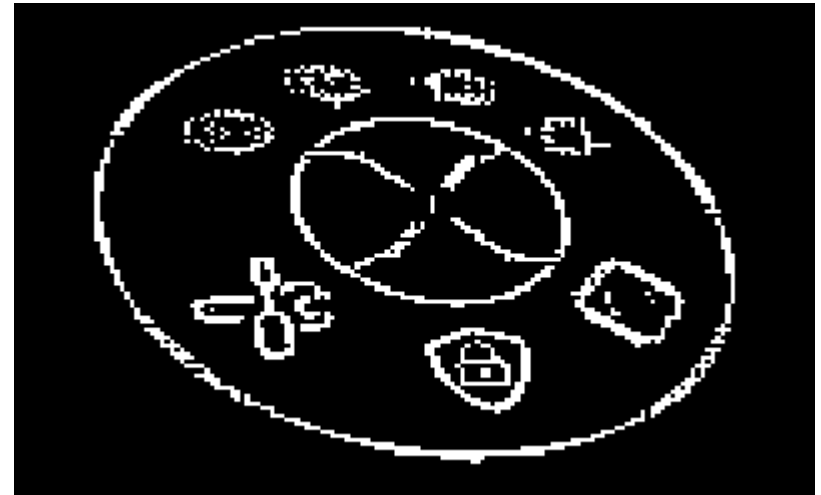
B

1	0	1
0	1	0
1	0	1

A



$K_n(A)$



Binary skeleton - algorithm

```
void skeleton(    const image_t *src, image_t *dst,  
                  const uint8_t *mask, const uint8_t n);
```

See file **EVDK_Operators\morphological_filters.c**

```
// Threshold the image  
threshold2Means(src, tmp, BRIGHTNESS_DARK);  
removeBorderBlobsTwoPass(tmp, rbb, CONNECTED_FOUR, 256);  
  
uint8_t mask[9] =  
{  
    1,0,1,  
    0,1,0,  
    1,0,1,  
};  
  
skeleton(rbb, dst, mask, 3);
```

Binary hit-miss

- Use to find geometrical features
- Is defines as:

$$\text{hitmiss}(A, B, C) = (A \ominus B) \cap (A^c \ominus C)$$

where

B and C are structuring masks with the requirement:

$$B \cap C = \emptyset$$

because all 1s in B are considered object pixels and all 1s in C are considered background pixels

Binary hit-miss - example

B

0	0	0
1	1	0
0	0	0

C

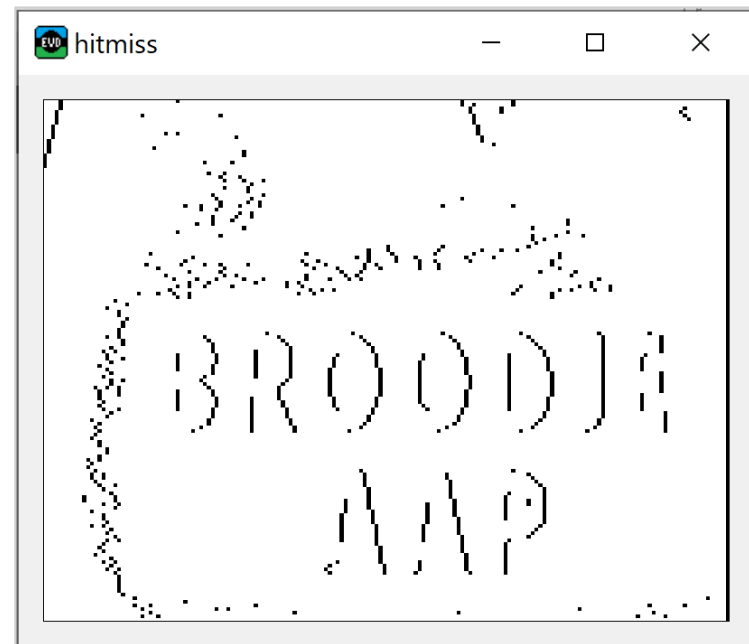
0	0	0
0	0	1
0	0	0

*Alternative
representation*

-	-	-
1	1	0
-	-	-

A

$hitmiss(A, B, C)$



Binary hit-miss - example

B

0	0	0
0	1	1
0	0	0

C

0	0	0
1	0	0
0	0	0

*Alternative
representation*

-	-	-
0	1	1
-	-	-

A



$hitmiss(A, B, C)$



Binary hit-miss - algorithm

```
void hitmiss(const image_t *src, image_t *dst,  
             const uint8_t *m1, const uint8_t *m2);
```

See file **EVDK_Operators\morphological_filters.c**

Binary outline

- Change all of the object's pixels to the background value, except those pixels that lie on the object's contour
- The contour width is determined by the structuring element
- The result is the eroded image subtracted from the original image or the original image subtracted from the dilated image
- Is defined as

$$outline(A, B) = A - (A \ominus B)$$

or

$$outline(A, B) = (A \oplus B) - A$$

where

B is the structuring mask

Binary outline - example

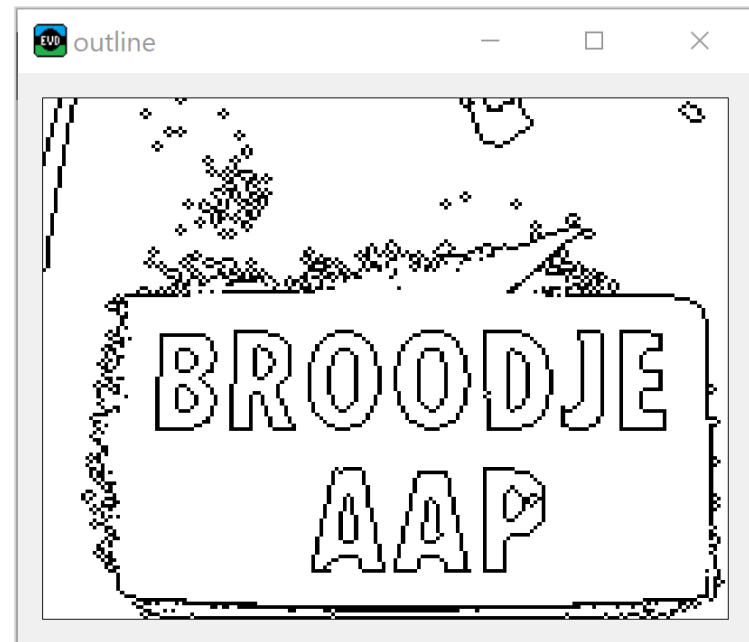
B

0	1	0
1	1	1
0	1	0

A



$outline(A, B)$



Binary outline - example

B

1	0	1
0	1	0
1	0	1

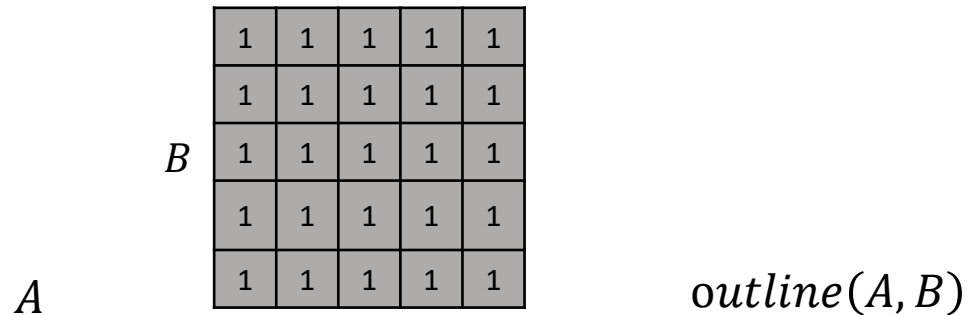
A



$outline(A, B)$



Binary outline - example



Binary outline - algorithm

```
void outline( const image_t *src, image_t *dst,  
              const uint8_t *m, const uint8_t n);
```

See file **EVDK_Operators\morphological_filters.c**

References

- Myler, H. R., & Weeks, A. R. (2009). *The pocket handbook of image processing algorithms in C*. Prentice Hall Press.