



Universität Hamburg

DER FORSCHUNG | DER LEHRE | DER BILDUNG

**MIN-Fakultät**  
**Fachbereich Informatik**  
Arbeitsbereich SAV/BV (KOGS)

# Image Processing 1 (IP1)

## Bildverarbeitung 1

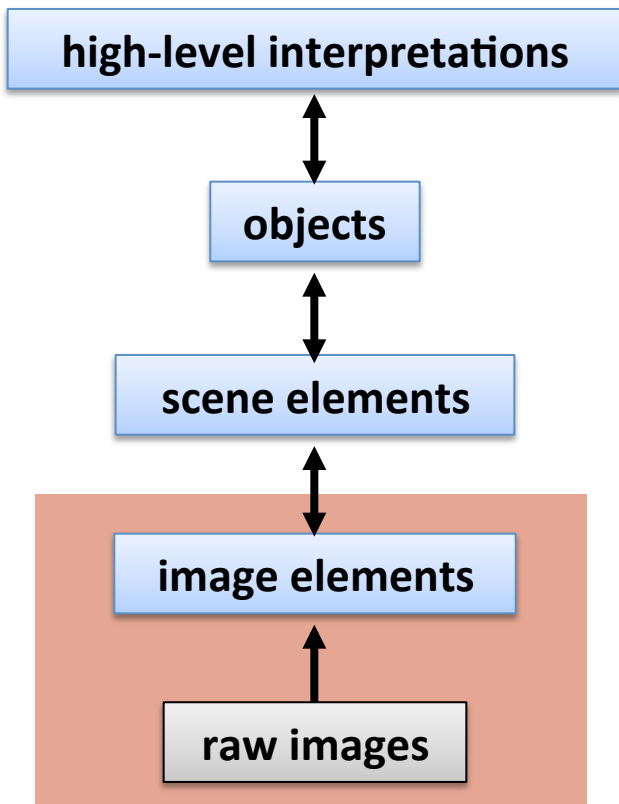
Lecture 10 – Image Segmentation 1

Winter Semester 2014/15

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Prof. Siegfried Stiehl

# Segmentation

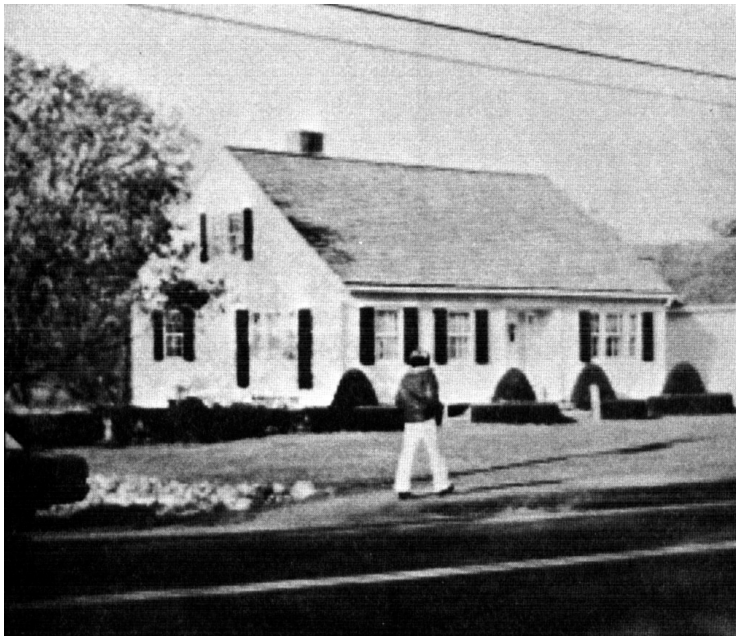
Segmenting the image into image elements which may correspond to meaningful scene elements



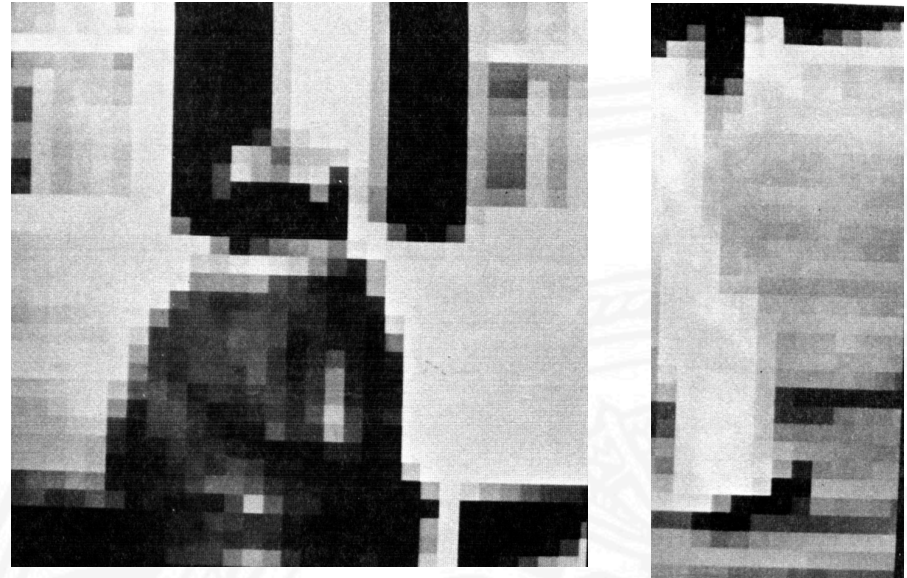
**Example:**  
Partitioning an image into regions which may correspond to objects

Typical results of first segmentation steps

# Problems with Segmentation



landhouse scene



upper part and leg of person

Greyvalues of foreground may be indistinguishable from greyvalues of background.

**In general, context knowledge is necessary for successful segmentation!**

# Primary Goal of Segmentation

*"Segmenting an image into image elements which may correspond to meaningful scene elements"*

**What sort of image elements may correspond to meaningful scene elements?**

Answer depends on type and complexity of images: Less constrained scenes must be segmented more conservatively.

## Segmentation into ...

- |   |          |   |
|---|----------|---|
| <b>... entire objects</b>                         | e.g. for | printed character recognition<br>industrial object recognition<br>medical cell analysis |
| <b>... edge lines</b>                             | e.g. for | aerial image analysis<br>indoor scenes  |
| <b>... edge elements,<br/>vertices, groupings</b> | e.g. for | natural scenes  |

# Secondary Goals of Segmentation

## Multiple resolutions for subsequent processes

- coarse resolution description for e.g.
  - analysis of image layout (horizon, foreground, background)
  - control of attention
  - planning a detailed analysis
- fine resolution description e.g. for
  - details
  - stereo analysis
  - motion analysis

## Data reduction

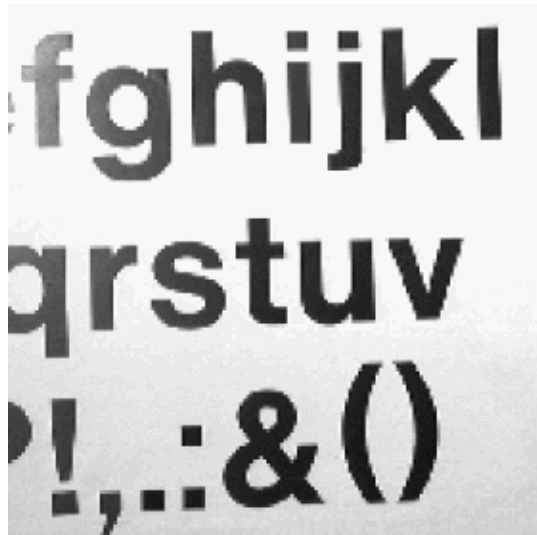
- Because of their large data volume, raw images are inconvenient as basic data structures for image analysis, e.g.:

TV colour image                      3 x 512 x 576  $\approx$  7 MB

10 sec TV colour images            10 x 25 x 7  $\approx$  1750 MB

# Thresholding

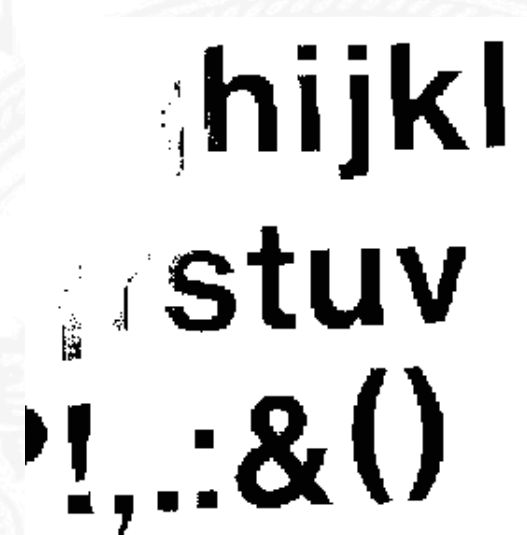
Thresholding has been introduced as a discretization technique.  
The same techniques can be applied for segmentation.



greyvalue image



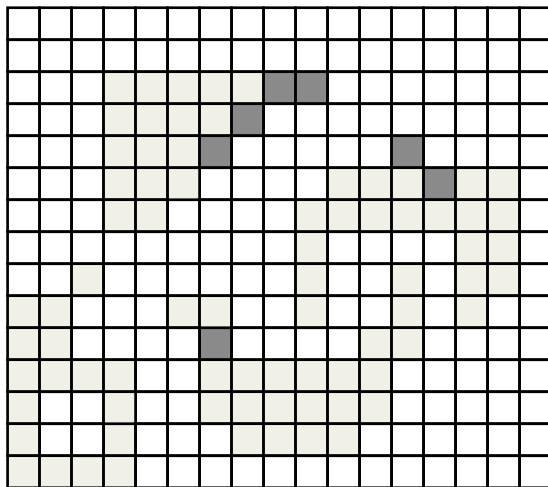
threshold too low



threshold too high

# Representing Regions

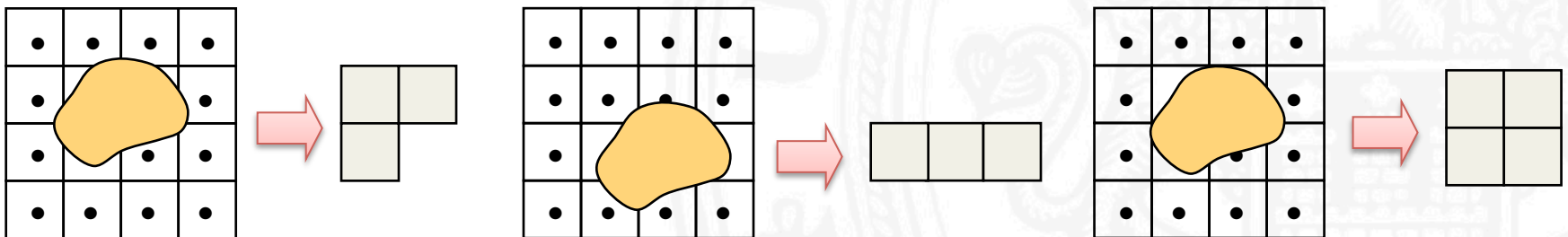
A region is a maximal 4- (or 8-) connected set of pixels.



Methods for digital region representation:

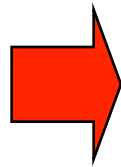
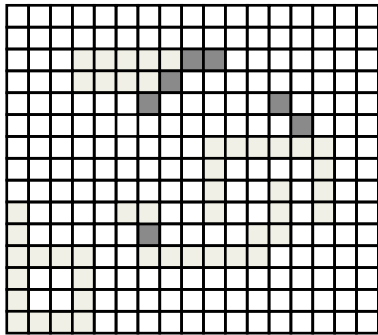
- grid occupancy
  - labelling
  - run-length coding
  - quadtree coding
  - cell sets
- boundary description
  - chain code
  - straight-line segments, polygons
  - higher-order polynomials

Note that discretizations of an analog region are not shift or rotation invariant:



# Component Labelling

## Determining connected regions in B/W images



Component 1  
(2 3 9)(3 3 7)(4 6 6)

Component 2  
(4 12 12)

Component 3  
(5 13 13)(6 9 14)(7 9 9 14 14)(8 9 9 14 14)(9 9 9 14 14)

Component 4  
(9 0 0)(10 0 0)(11 0 3)(12 0 0 3 3)(13 0 0 3 3)(14 0 0 3 3)

Component 5  
(9 5 6 12 12)(10 6 6 11 12)(11 6 11)

In this example:  
component  
descriptions using  
run-length coding

## Component labelling of B/W images with 4-neighbourhood

Scan image left to right, top to bottom:

if pixel is white then continue

if pixel is black then

if left neighbour is white and upper neighbour is white then assign new label

if left neighbour is black and upper neighbour is white then assign left label

if left neighbour is white and upper neighbour is black then assign upper label

if left neighbour is black and upper neighbour is black then

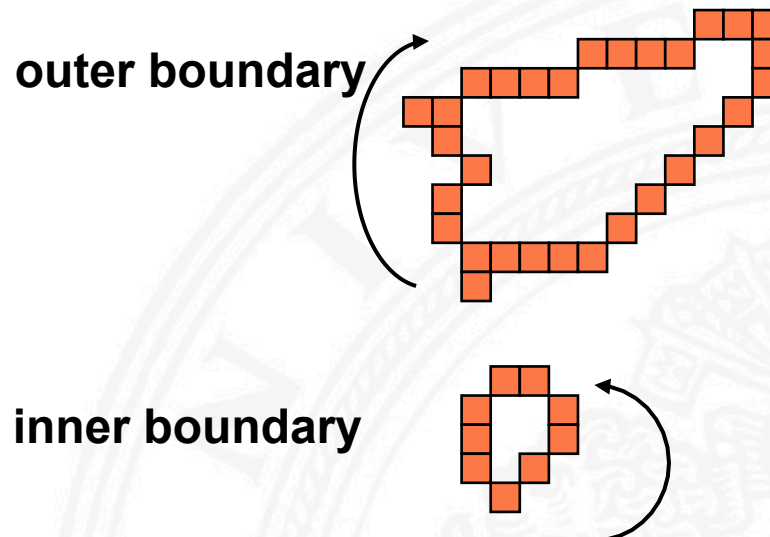
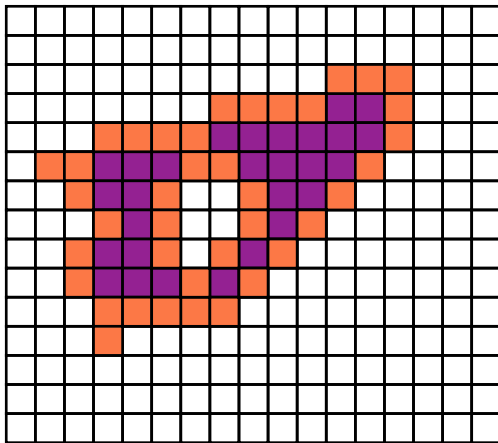
assign left label, merge left label and upper label



# Boundaries

For a 4- (8-) connected region  $R$  the boundary is defined as the set of pixels of  $R$  which are 8- (4-) connected to the complement  $R^c$  of  $R$ .

**Example for 8-connectivity:**



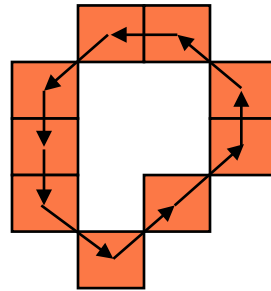
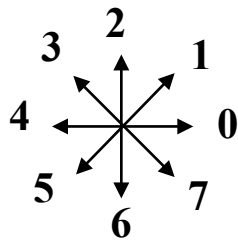
Boundary pixels are usually ordered clockwise for outer boundaries and counter-clockwise for inner boundaries.

- Disadvantage of this boundary definition:
- $R$  and  $R^c$  have different boundaries - but nothing is in between.

# Chain Code

Chain code represents boundaries by "chaining" direction arrows between successive boundary elements.

Chain code for 8-connectivity:



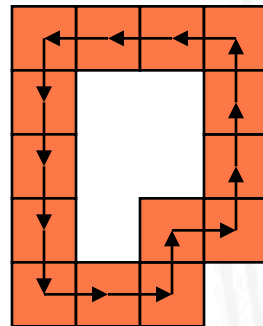
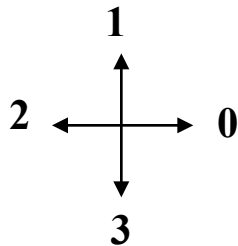
Arbitrary choice of starting point, chain code can be represented e.g. by

{456671123}

Normalization by circular shift until the smallest integer is obtained:

{112345667}

Chain code for 4-connectivity:



Arbitrary starting point:

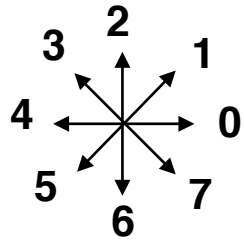
{22233330010111}

Normalized:

{00101112223333}

# Chain Code Derivatives

Chain code is highly susceptible to discretization noise. Hence derived properties are usually also noisy.

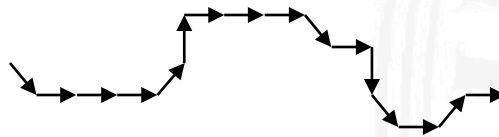
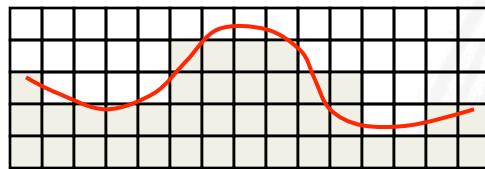


**Slope:**

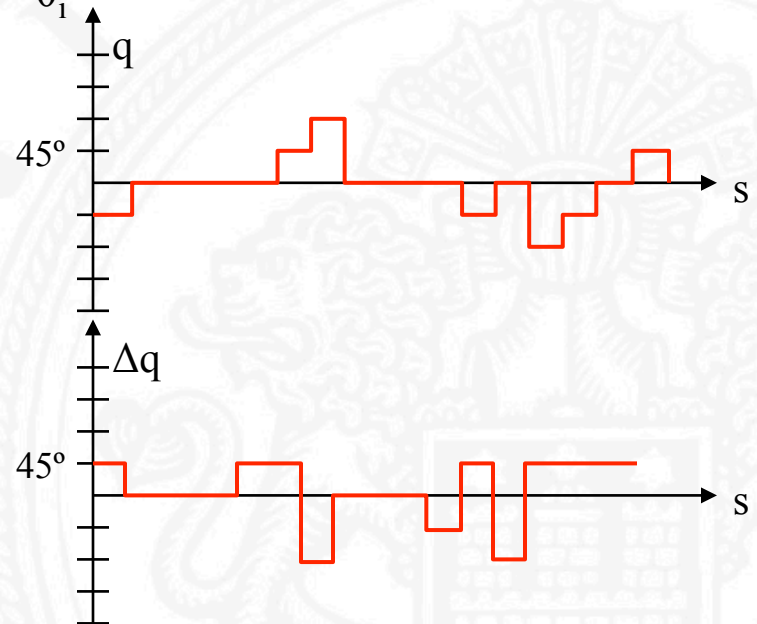
chain code	0	1	2	3	4	5	6	7
$\tan \theta$	0	1	$\pm\infty$	-1	0	1	$\pm\infty$	-1
$\theta$	0	45	90	135	$\pm 180$	-135	-90	-45

**Curvature:**  $\Delta\theta = \theta_{i+1} - \theta_i$

**Example:**



{7000120007067010}



# k-Slope and k-Curvature

## Smoothed chain code slope and curvature:

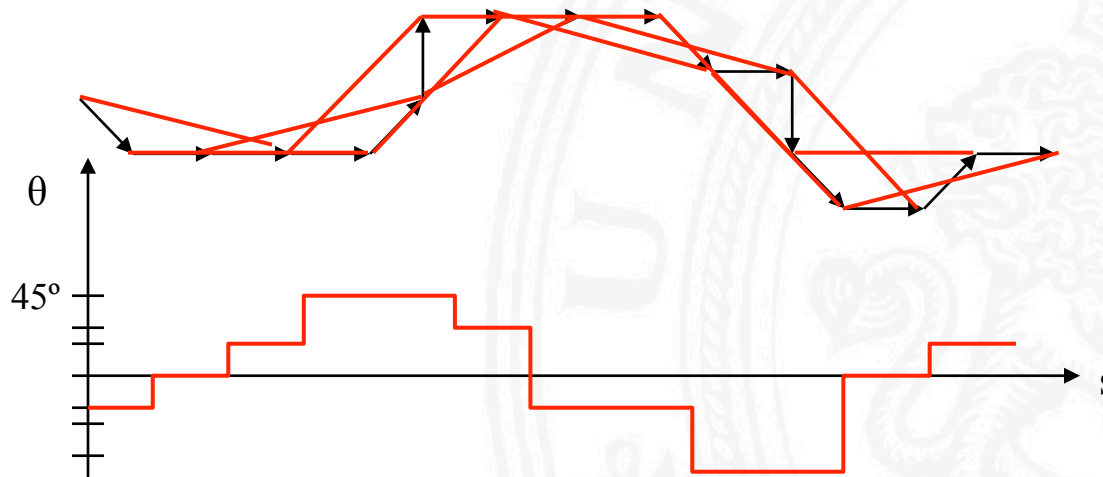
$L$  chain code

$\{p_1 \dots p_N\}$  starting points of chain code elements

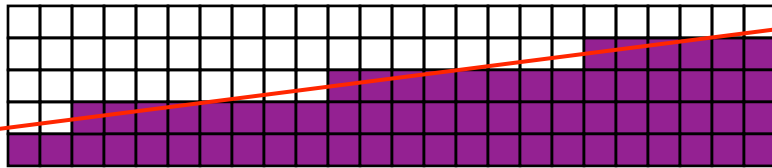
- right k-slope of  $L$  at  $i$ ,  $k \geq 1$ , is slope from  $p_i$  to  $p_{i+k}$
- left k-slope of  $L$  at  $i$ ,  $k \geq 1$ , is slope from  $p_i$  to  $p_{i+k}$
- k-curvature at  $i$  is difference between right and left k-slope

## Example:

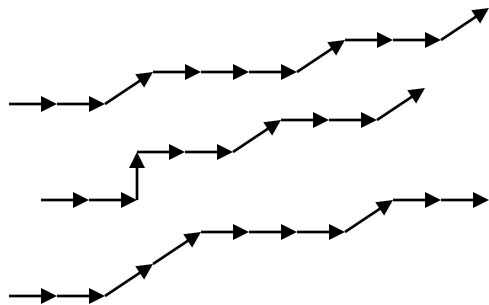
$k = 3$



# Digital Straight Lines



What are the properties of a chain code which represents a straight line boundary?



may represent a straight line

may not represent a straight line

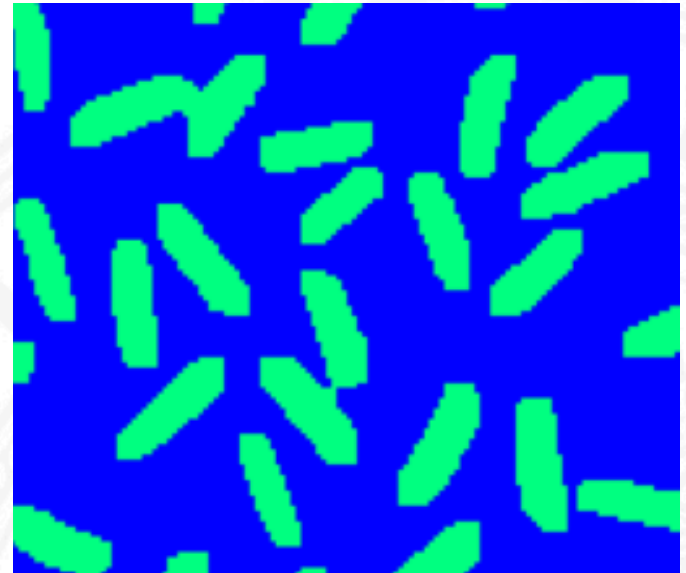
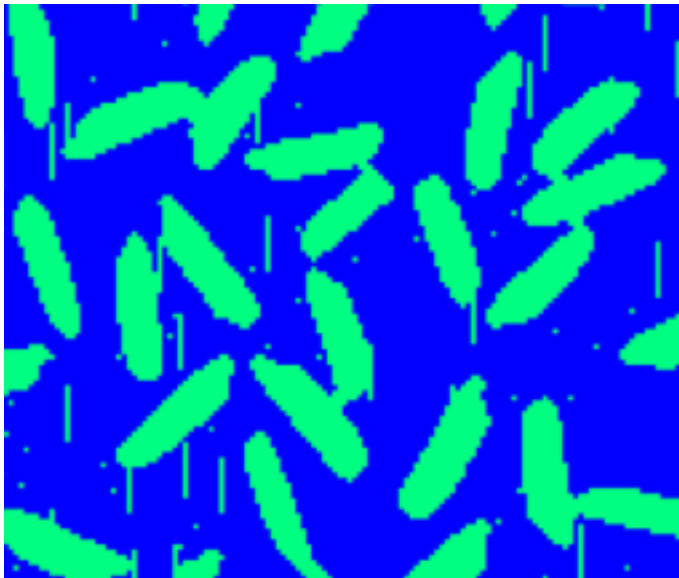
may not represent a straight line

**Necessary and sufficient straight line properties of chain code:**

1. Only 2 element types
2. Numerical difference of element types (mod 8) at most 1
3. One of the element types occurs only in runs of length 1 and is distributed "as regularly as possible".

"as regularly as possible": Assume 2 types a and b, b single. Runs of a must have lengths  $l_0$  and  $l_0+1$ . Consider  $l_0$ -runs and  $l_0+1$ -runs as 2 chain code types and apply straight line criteria recursively.

# Removal of Small Disturbances

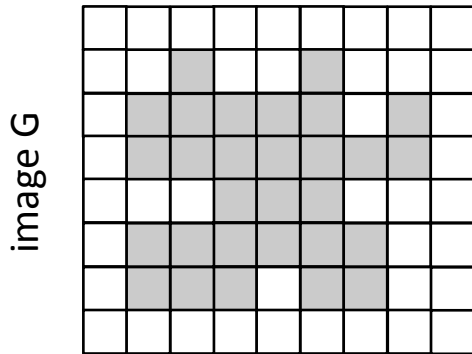


- **Salt-and-pepper noise creates false objects or holes**
- **Objects are merged because of touch or noise**

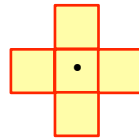
# Morphological Operations

- „morphology“  $\approx$  laws of structure, relevant for many disciplines
- Qualitative characterizations of morphological operations on images:
  - Erosion removes boundary strip from regions
  - Dilation expands regions by boundary strip
  - Opening erosion followed by dilation, removes small protrusions from a region
  - Closing dilation followed by erosion, removes small intrusions from a region
- Morphological operations in Image Processing are defined by logical operations on binary images:
  - black = 0 = F
  - white = 1 = T

# Erosion and Dilation



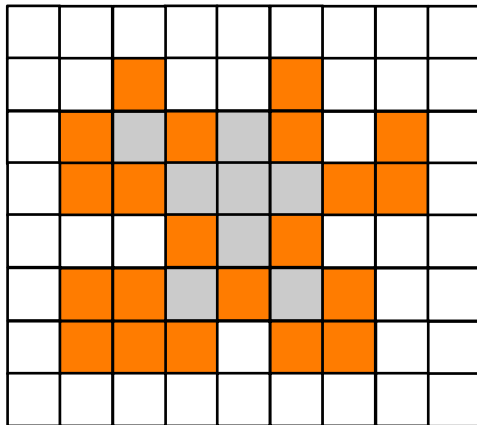
example of structuring element H



Local neighborhood operation with  $g' = f(G_H, H)$  where  $G_H$  are pixels of G covered by H.

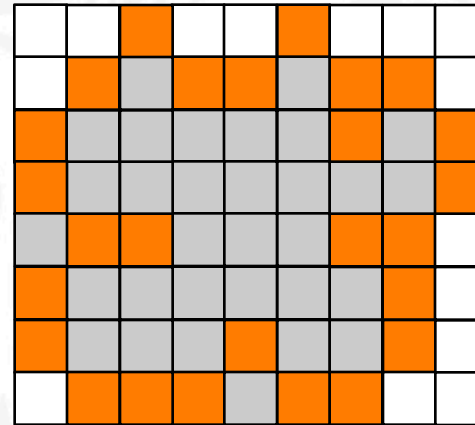
**Erosion:**  $g' = \text{AND}(G_H, H)$

Reference location is 1 if all pixels covered by H are 1.



**Dilation:**  $g' = \text{OR}(G_H, H)$

Reference location is 1 if at least one pixel covered by H is 1.

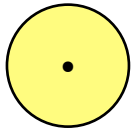




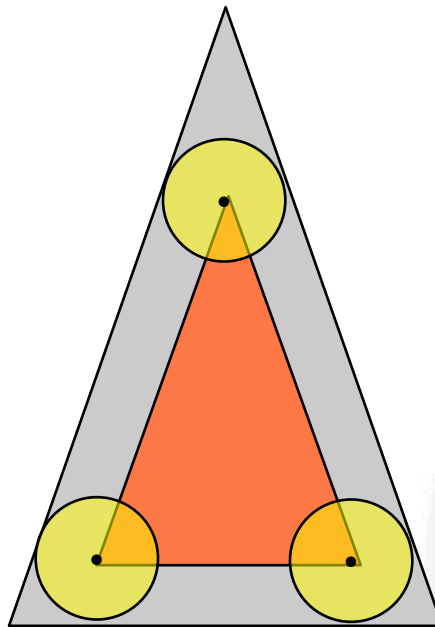
# Erosion and Dilation Examples

The basic effect is best illustrated in continuous space:

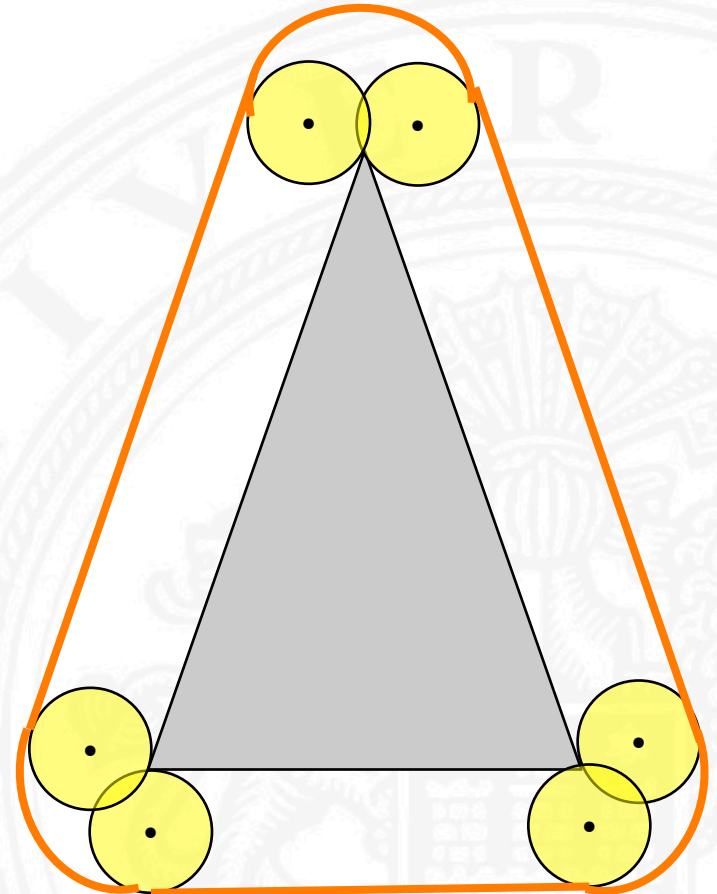
**Structuring element**



**Erosion**



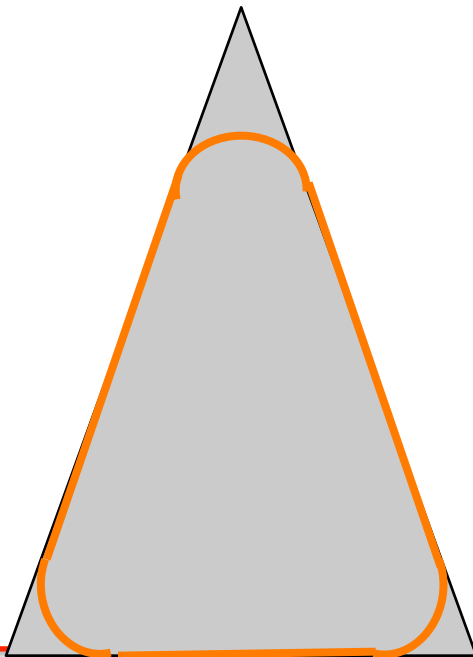
**Dilation**



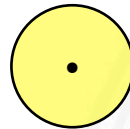
# Opening and Closing

**Opening** is erosion of  $G$  by  $H$ , resulting in  $G'$ , followed by dilation of  $G'$  by  $H$ .

Opening removes small protruding structures.

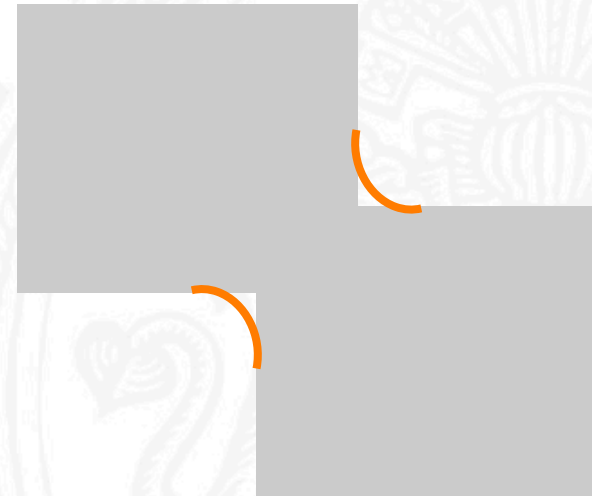


**H**



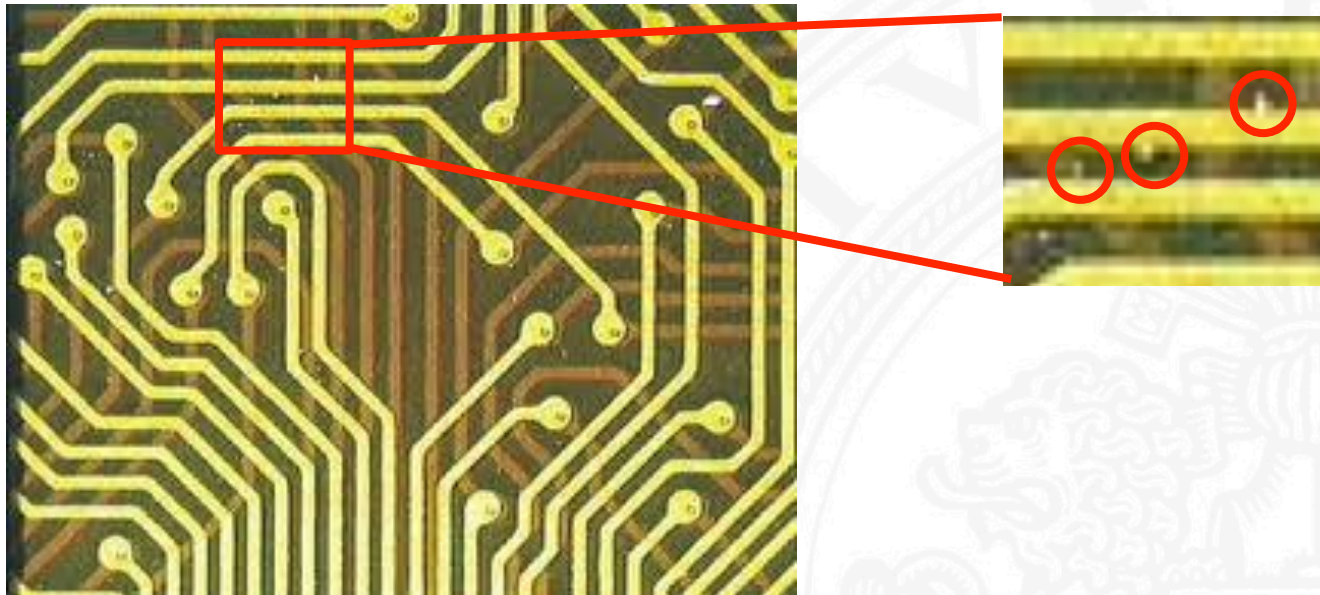
**Closing** is dilation of  $G$  by  $H$ , resulting in  $G'$ , followed by erosion of  $G'$  by  $H$ .

Closing adds small protruding structures.



# Example for Morphological Operations

- Quality control of printed circuits:
- Find small unwanted protrusions



- What morphological operations can locate protrusions?

# Erosion and Dilation for Greyvalue Images

**Erosion:**  $g' = \min(G_H, H)$

New value  $g'$  at reference location is minimum of all greyvalues of  $G$  covered by  $H$ .

**Dilation:**  $g' = \max(G_H, H)$

New value  $g'$  at reference location is maximum of all greyvalues of  $G$  covered by  $H$ .

original



eroded



dilated



Note that morphological operations are often defined similar to convolution: Move mirror image of  $H$  across  $G$  (no difference if  $H$  is symmetrical).