

# Computer Vision Project

Summer 2021

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Pattern Recognition Lab (CS 5)



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# Today's Outline

- Organization of this project
- Motivation
- What is computer vision?
- Today's topic: **Image Processing for Grayscale and Distance Images**



# Organization



## Organization – Waiting List

- Has everyone joined the StudOn-course?
  - Course member
  - Waiting list

## Organization – Grades and Certificates

- Project for Computer Science and Medical Engineering  
([https://lme.tf.fau.de/teaching/curriculum-courses/lv\\_id/21623404/](https://lme.tf.fau.de/teaching/curriculum-courses/lv_id/21623404/))

### Hochschulpraktikum

Lectures  
Exercises  
(5 ECTS)

### Hochschul- & Forschungspraktikum

Lectures  
Exercises  
Research project  
(10 ECTS)

- Grade for Hochschulpraktikum, if necessary, based on short talk (about a state-of-the-art research paper)
- The research project will be related to one of the discussed topics
- **Forschungspraktikum only:** contact us or any other PhD student at the lab for a research project (Overview: <https://lme.tf.fau.de/teaching/thesis/>)



# Organization

Who are you?



## Organization – Exercises

- Exercises are coded in Python
- You can work in groups of two
- Tasks are complementary to the lecture of the previous week. It is mandatory to **complete them all**
  - **At home**
    - It is strongly recommended to begin with the programming tasks before the exercise!
- Results have to be presented to one of the supervisors
- All tasks have to be finished by their individual deadlines (more later)



## Organization – Exercises

- Prepare questions or problems **before** the exercise
- Zoom-Meeting:  
<https://fau.zoom.us/j/94348907556?pwd=NmtDMDNjci8xRjIROVJHVDFWw0lQdz09>  
Meeting-ID: 943 4890 7556  
Password: 987411
- Zoom Breakout Rooms
- **Lecture and exercises on face recognition will be held via Skype.**
- **Own virtual hardware**  
Virtual CIP-Pools: <https://remote.cip.cs.fau.de/> (Xpra)
- You can ask additional questions via:  
Studon Forum



## Organization - Topics

- Basic image processing of grayscale and distance images
- Image Processing using Seam Carving
- Writer Identification/Retrieval
- Face Recognition
- Image Recognition for Humanities



Distance image

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If we desire to avoid insult we must be able to repel it.  
If we desire to secure peace on of the most  
powerful instruments of our rising prosperity it must be  
known that we are at all times ready for war



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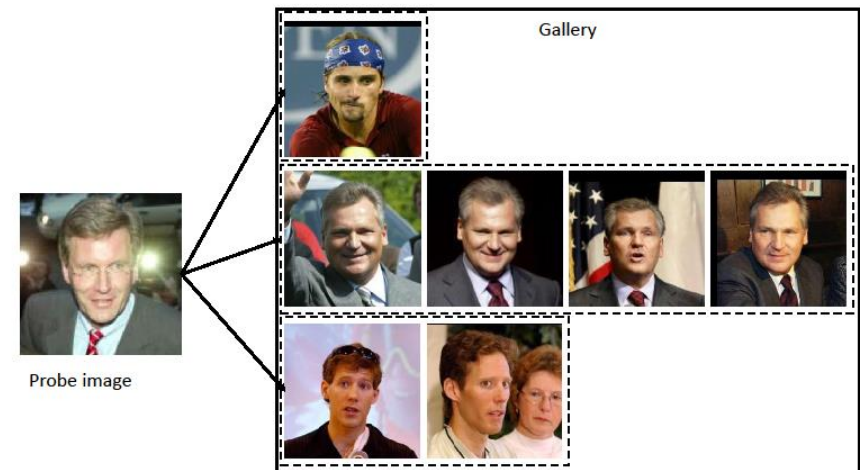


Figure: Supervised learning (face identification)

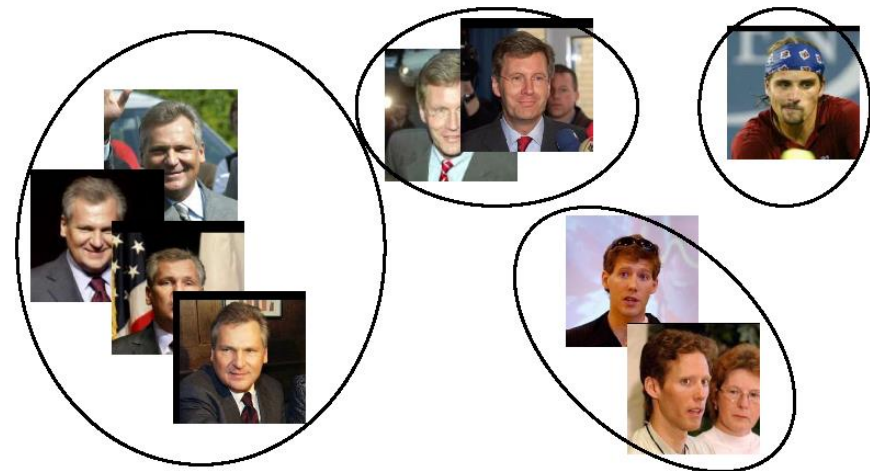


Figure: Unsupervised learning (face clustering)

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# Organization – Lectures and Exercises

- Lecture and exercise will alternate from week to week
- After each Lecture there is an optional **question section** for the current exercises

## Preliminary schedule

12.04.	TODAY – Lecture 1
19.04.	Exercise 1
26.04.	Lecture 2
03.05.	Exercise 2 ( <b>Deadline ex 1</b> )
10.05.	Lecture 3
17.05.	Exercise 3 ( <b>Deadline ex 2</b> )
31.05.	Lecture 4
07.06.	Exercise 4 ( <b>Deadline ex 3</b> )
14.06.	Exercise 4
21.06.	Lecture 5
28.06.	Exercise 5 ( <b>Deadline ex 4</b> )
05.07.	Exercise 5
12.07.	( <b>Deadline ex 5</b> )



# Organization

- Are there any questions?



# Motivation: Why are you here?



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## Motivation: Collision Avoidance



- Use cameras to observe a human/machine environment
- Avoid collisions by fusing camera and robot position information

# Motivation: Autonomous Driving





# Motivation: Hand Tracking



# Computer Vision Primer

- Computer Vision is about extracting information from images
  - **Grayscale**
  - RGB
  - Multispectral
  - 2.5D and 3D



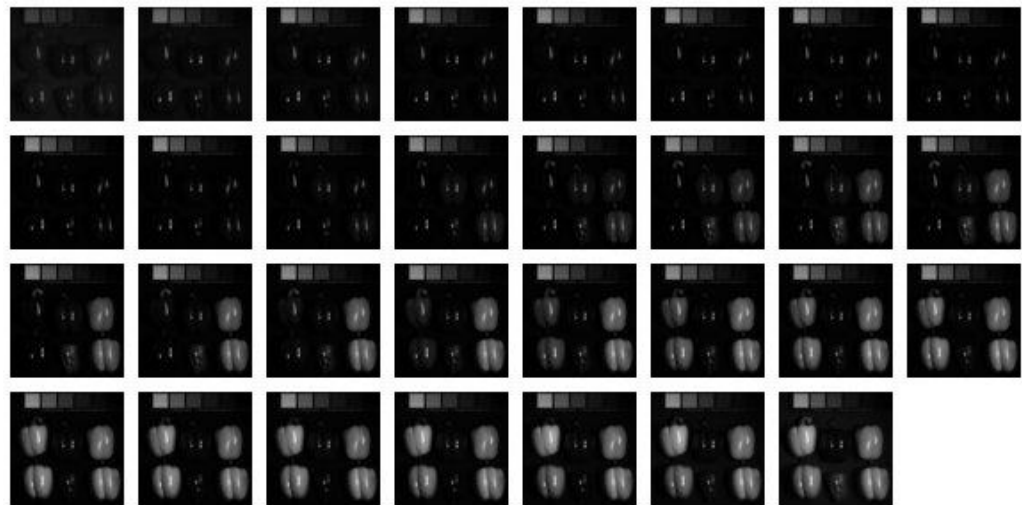
# Computer Vision Primer

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# Computer Vision Primer

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  - **2.5D and 3D**



Dataset by Johannes Schauer, Andreas Nüchter from the University of Würzburg, Germany



# Computer Vision Primer

- Computer Vision is about extracting information from images
- What information?
  - Content: object detection, face identification
  - Text: sign detection, text extraction
  - Movement: tracking, motion capturing
  - Geometry: multi-camera setups, shape extraction, SLAM
  - Medical imaging: segmentation, tumor detection
  - Quality control: find production errors
  - ...



# Image Processing on Grayscale and Distance Images



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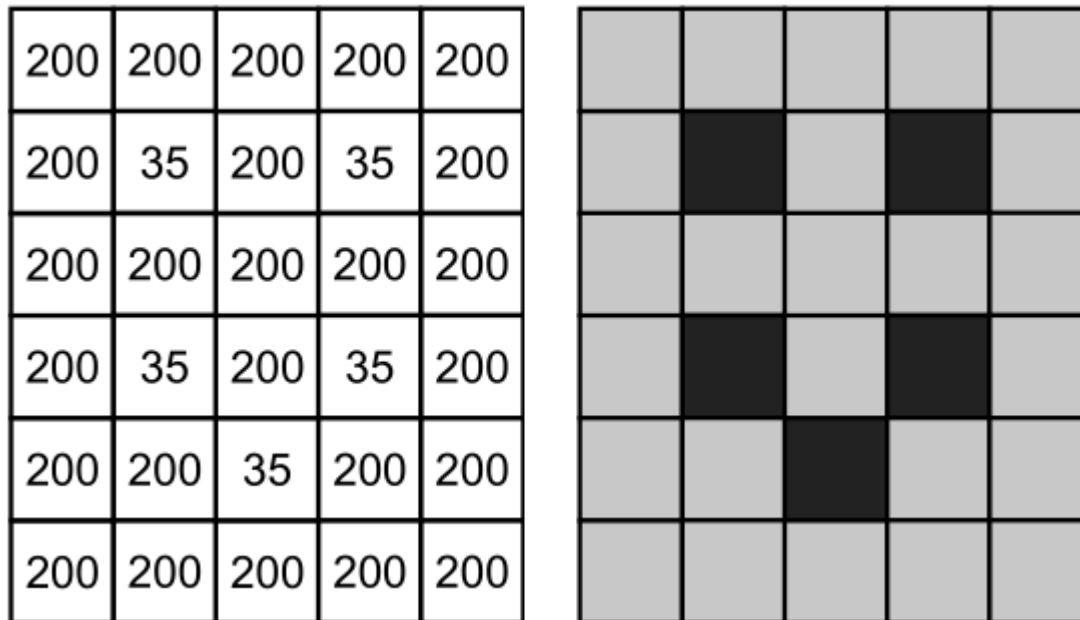
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# Image Formation



# Images

- Images can be represented as 2D-arrays of a certain type, e.g. byte for grayscale images.



Gray scale image

# Thresholding

- Simple operation that is used to separate regions of different „colors“
- Returns a mask of the same size as the image



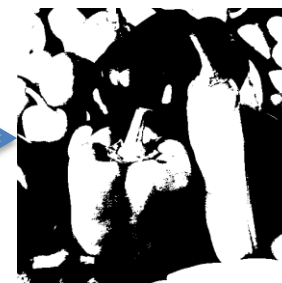
Input



Green channel

Threshold  
Value at  $(x,y) > t$

Example  $t = 150$



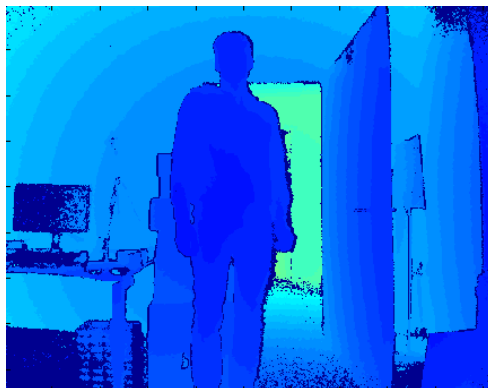
Resulting mask



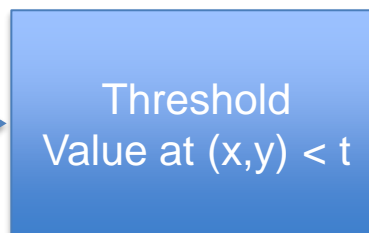
Green peppers

# Thresholding on Distance Images

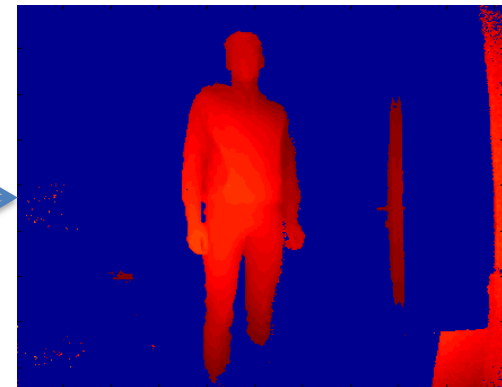
- Pixels contain distance information. „Color“ encodes the distance.
- Example: On distance images thresholding can be used to separate foreground from background



Distance image with person



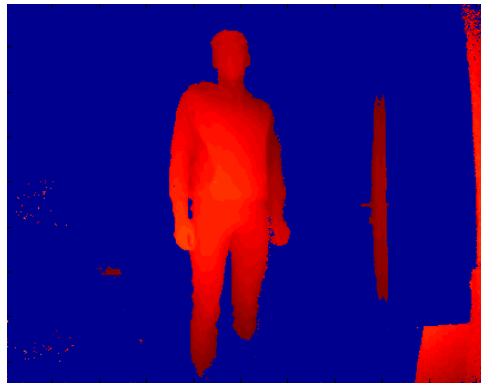
Example  $t = 1.85\text{m}$



Scene foreground

# Connected Components

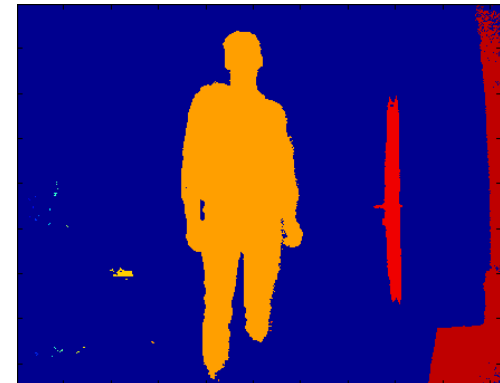
- Connected components are regions in an image that are connected
- A pixel is connected to another pixel if they are in the same neighborhood
- The neighborhood can be defined arbitrarily. Common neighborhoods are:
  - 4-connected neighborhood
  - 8-connected neighborhood



Input image



Mask image

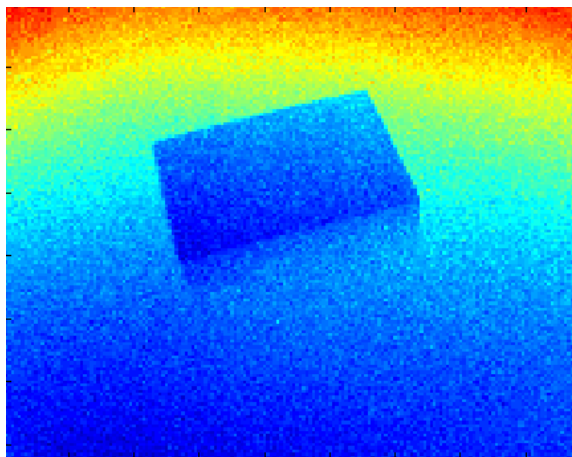


Connected Components

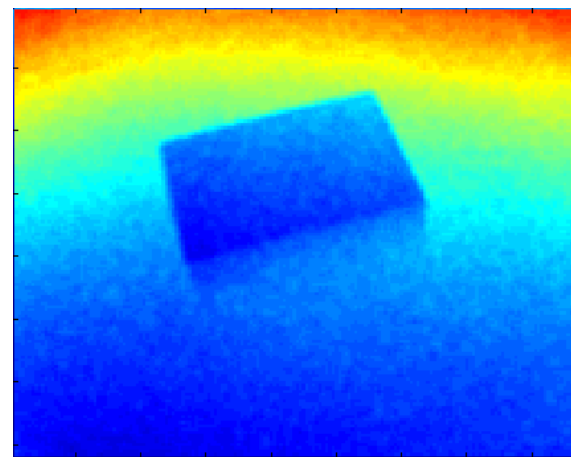
## Smoothing: Mean Filter

- Smooths the image by averaging pixel values within a certain window
- Commonly represented as a convolution
- A simple example is a 3x3 mean filter

$$I' = I * H = I * \frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$



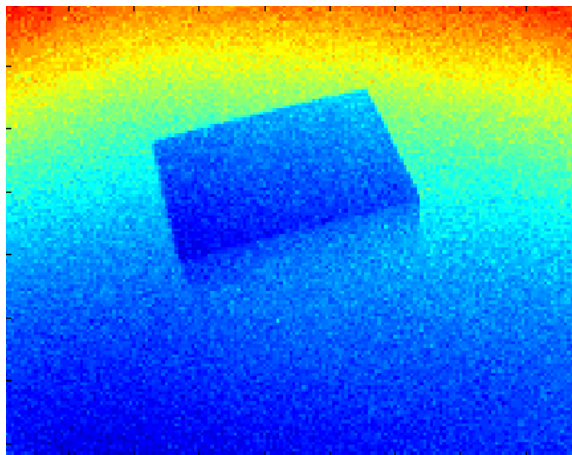
Distance image with a box



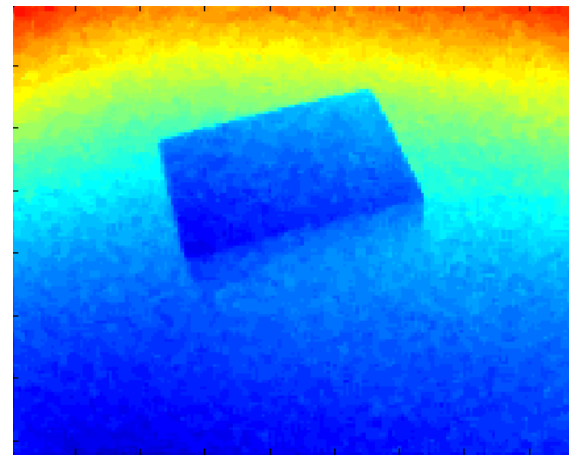
Distance image after mean filtering

## Smoothing: Median Filter

- Sorts all pixel values within a certain window and uses the median of the sorted list as new pixel value
  - No convolution – nonlinear filter
  - Popular to remove salt-and-pepper noise



Distance image with a box

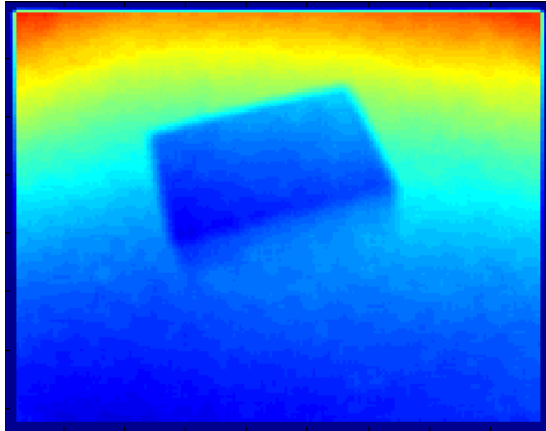


Distance image after median filtering

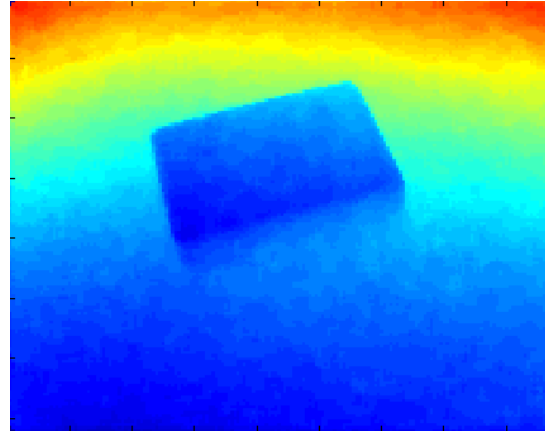


# Smoothing: Mean vs. Median Filtering

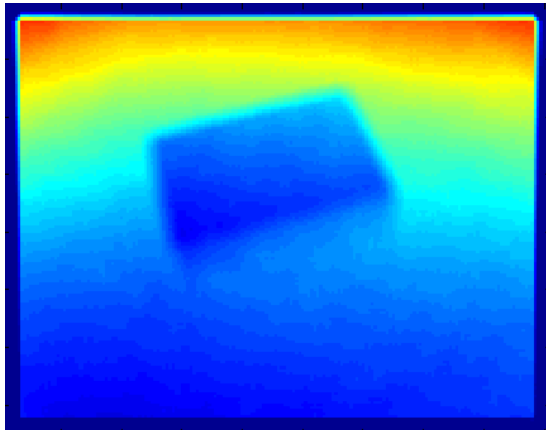
Mean 5x5



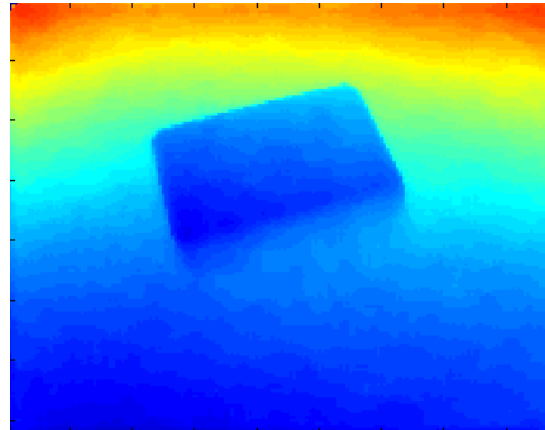
Median 5x5



Mean 7x7



Median 7x7



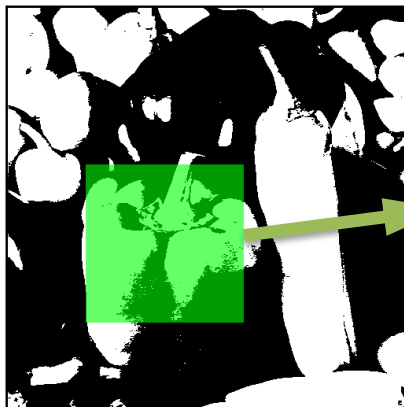


# Smoothing

- There exist more smoothing filters and algorithms out of which some are based on convolutions while others are not.
  - Gaussian smoothing
  - Bilateral filtering
  - Guided filtering
  - ...

## Morphological Operators

- Morphological operators typically work on binary images (e.g. masks)
- Analyzes pixels within a certain window/structuring element  $B$
- Basic operators are: erosion, dilation, opening and closing
- Erosion  $\ominus$ : a pixel is 1 if all pixels in  $B$  are 1 in the input image
- Dilation  $\oplus$ : a pixel is 1 if at least one of the pixels in  $B$  is 1.



Green color mask



Input



Erosion (3x3)



Dilation (3x3)

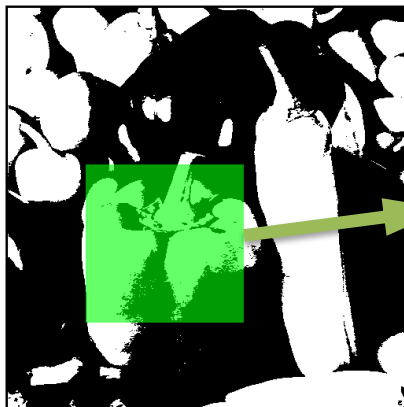
## Morphological Operators

- Opening is obtained by eroding the input first and applying dilation on the result:

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

- Closing is obtained by applying dilation first and erosion on the result:

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



Green color mask



Input



Opening (3x3)



Closing (3x3)

## Morphological Operators



(a)



(b)



(c)



(d)



(e)

<http://szeliski.org/Book/>

- (a) Input image
- (b) Dilation (5x5)
- (c) Erosion (5x5)
- (d) Opening (5x5)
- (e) Closing (5x5)

## Further Reading

There exist different filters for a multitude of tasks

- Edge detection (Sobel, Scharr, Canny)
- Second order derivatives (Laplacian of Gaussian)
- Corner detectors [Harris88]
- Circle detectors [Loy03]
- ...



Edges: Sobel



Edges: Canny

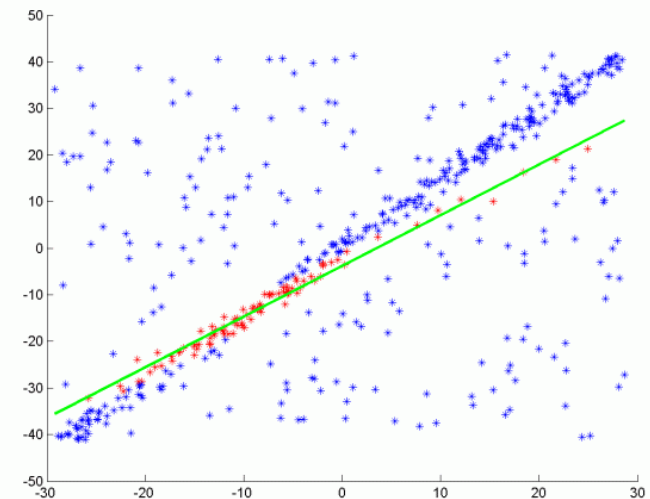


Corners: Harris

# Optimization with RANSAC

- RANdOm Sampling And Consensus is a simple optimization strategy for noisy data
- Assumes that a data set contains inliers and outliers (noisy samples)
- Can be used for all kinds of models: lines, planes, rotations, projection matrices, ...

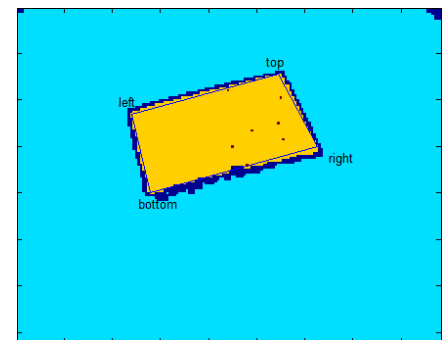
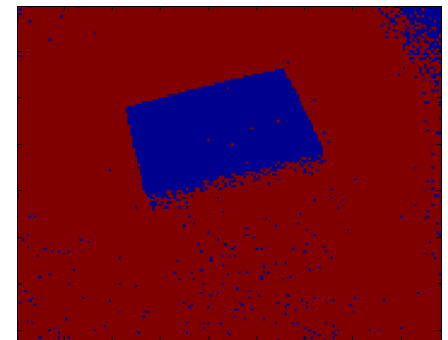
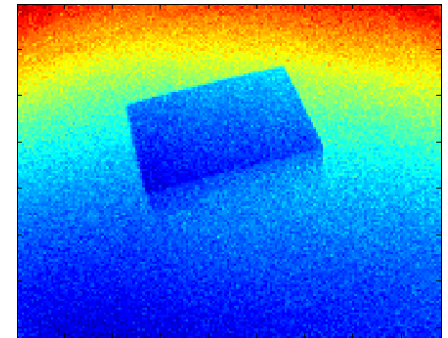
```
max_inliers = 0
best_model = null
while (i < N) {
    samples = minimal_sample(k, all_points)
    model = estimate_model(samples)
    n_inliers = computeInliers(all_points, model)
    if (n_inliers > max_inliers) {
        best_model = model
        max_inliers = n_inliers
    }
}
```



<https://de.wikipedia.org/wiki/RANSAC-Algorithmus>

## Exercise 1: Box Detection

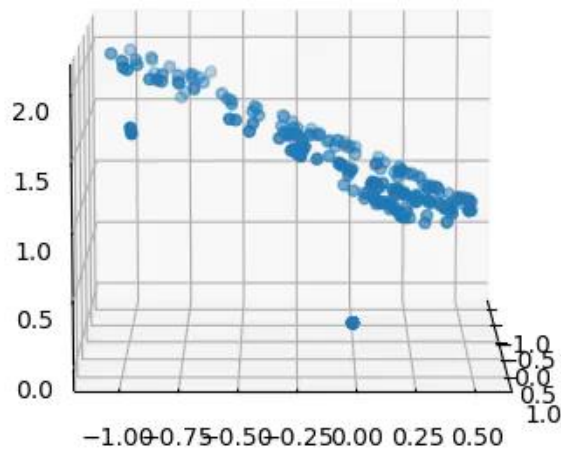
- What you get
  - A distance image of a simple box on the floor
  - And its corresponding point cloud
- Your goal is to
  - Find the floor plane
  - Find the box
  - Estimate the size of the box
- ...with the tools you have learned today



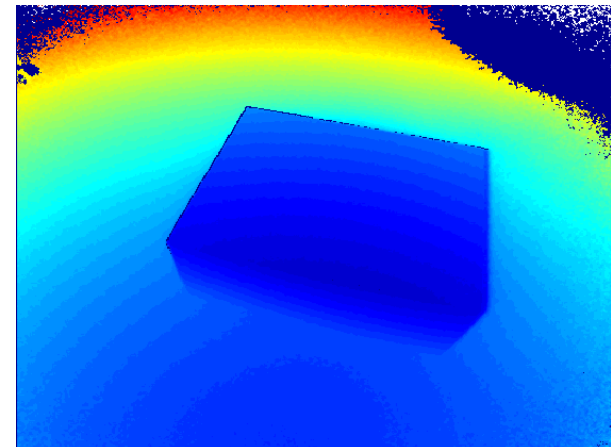


## Exercise 1: Box Detection

Point cloud



Distance image





# Questions?



## References

- [Harris88] C. Harris and M. Stephens (1988). "*A combined corner and edge detector*", 1988
- [Loy03] G. Loy, „*Fast radial symmetry for detecting points of interest*,“ 2003