

# **Sisteme de viziune in robotica**

**An2, Master Robotica - engleza**



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Image Processing and Pattern Recognition Research Center  
**(IPPRC)** <http://cv.utcluj.ro/>

## Lectures:

- **Bachelor:** [Procesarea imaginilor](#) / [Image Processing](#), Pattern recognition systems, Human-Computer Interaction
- **Master:** Artificial vision, Artificial vision for mobile robots, Human-Computer interfaces

## Research:

- Computer Vision based advanced driving assistance systems (ADAS)
- Computer Vision for industrial manufacturing
- Medical Imaging
- Automatic semantic image annotation



# References



R.C.Gonzales, R.E.Woods, Digital Image Processing-Second Edition, *Prentice Hall*, 2002.

E. Trucco, A. Verri, Introductory Techniques for 3-D Computer Vision, *Prentice Hall*, 1998.

Procesarea imaginilor (note de curs si indrumator de laborator) - <http://users.utcluj.ro/~tmarita/IPL>

Image processing (lecture & laboratory notes) - <http://users.utcluj.ro/~nedevski/IP/schedule.html>

Sergiu Nedevschi, Radu Dănescu, Florin Oniga, Tiberiu Marita, *Tehnici de viziune artificială aplicate în conducerea automată a autovehiculelor*, Editura U.T. Press, Cluj-Napoca, 2012.

S. Nedevschi, T. Marita, R. Danescu, F. Oniga, R. Brehar, I. Giosan, C. Vicaș, *Procesarea Imaginilor - Indrumator de laborator*, Editura U.T. Press, Cluj-Napoca, 2013.

S. Nedevschi, **T. Marita**, R. Danescu, F. Oniga, R. Brehar, I. Giosan, S. Bota, A. Ciurte, A. Vatavu, „*Image Processing - Laboratory Guide*”, UTPress Edition, 2016, ISBN 978-606-737-137-6, <http://biblioteca.utcluj.ro/carti-online.html>

R.C.Gonzales, R.E.Woods, S.L. Eddins, Digital Image Processing Using MATLAB, *Gatesmark Publishing*, 2nd Edition, 2009.

A. McAndrew, An Introduction to Digital Image Processing with MATLAB, Notes for SCM2511 Image Processing, 2004, School of Computer Science and Mathematics, Victoria University of Technology.

C. Solomon, T. Beckon, Fundamentals of digital image processing - a practical approach with examples in Matlab, *Wiley & Sons*, 2011.

Richard Szeliski, Computer Vision: Algorithms and Applications, Springer, 2010, <http://szeliski.org/Book>

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# Cuprins / Contents

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Introducere (introduction)

Modelul de reprezentare a imaginilor (image representation)

Procesul de formare/achizitie a imaginilor (image acquisition)

Modelul camerei (camera model)

Notiuni elementare de stereoviziune (stereovision basics)

Calibrarea camerelor (camera calibration)



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# Introducere / Introduction



# Introducere / Introduction



## What is Computer Vision?

Computer vision is the discipline that uses **statistical methods to disentangle data using models constructed with the aid of geometry, physics and learning theory.**

Computer vision relies on a solid understanding of cameras and of the physical process of image formation:

- to obtain simple inferences from individual pixel values and combine the information available in multiple images into a coherent whole
- impose some order on groups of pixels to separate them from each other or infer shape information, and recognize objects using geometric information.

## Computer Vision is also known as:

- analiza de imagini (*image analysis*)
- analiza scenei (*scene analysis*)
- interpretarea imaginilor (*image understanding*)



## Discipline conexe / Related disciplines

- Inteligenta artificiala (*artificial intelligence*)
- Robotica (*robotics*)
- Procesarea semnalelor (*signal processing*)
- Recunoasterea de forme (*pattern recognition*)
- Teoria controlului (*control theory*)
- Psihologia (*psychology*)
- Neurostiintele (*neuroscience*)

## Subdomenii / Subdomains

- Procesarea imaginilor (*image processing*)
- Recunoasterea formelor (*pattern recognition*)
- Fotogrametria (*photogrammetry*)
- .....



# Image processing

## Procesarea imaginilor (Image Processing)

Concerned with image properties and image-to-image transformations

Most computer vision algorithms require image processing

## Examples of image processing

- image enhancement (improving image quality through transforms, bring out detail that is obscured, highlight features of interest in an image)
- compression (compact representation of images for transmission)
- restoration (elimination of known degradations)
- feature extraction (locating specific image patterns like edges, corners)



# Computer vision



## Domenii de cercetare / Research domains

- Detectia de trasaturi (*Features Detection*)
- Reprezentarea conturilor (*Contour Representation*)
- Analiza imaginilor de profunzime (*Range image analysis*)
- Modelarea si reprezentarea formelor (*Shape modeling and representation*)
- Stereo viziunea (*Stereo vision*)
- Viziunea color (*Color vision*)
- Analiza miscarii (*Motion analysis*)
- Viziunea activa (*Active/Purpositive vision*)
- Invarianti (*Invariants*)
- Detectia obiectelor (*Objects detection*)
- Recunoastera obiectelor 3D (*3D object recognition*)
- Aritectura sistemelor de viziune (*Vision architectures*)



# Computer vision



## Domenii de aplicare / Application domains

- Inspectie industriala / controlul calitatii (*Industrial inspection/quality control*)
- Imginerie inversa (*Reverse engineering*)
- Supraveghere si securitate (*Surveillance and security*)
- Biometrica (ex. recunoasterea fetei) (*Biometrics (i.e. Face recognition)*)
- Recunoasterea gesturilor (*Gesture recognition*)
- Monitorizarea traficului (*Road monitoring*)
- Aplicatii spatiale (*Space applications*)
- Vehicule autonome (*Autonomous vehicles*)
- Realitate virtuala, teleprezenta si telerobotica (*Virtual reality, tele-presence, and tele-robotics*)
- Cartografiere automata, achizitie automata de modele (*Automated map making, model acquisition*)
- Analiza imaginilor medicale (*Medical image analysis*)
- Imagistica medicala (*Medical Imaging*)

SVR

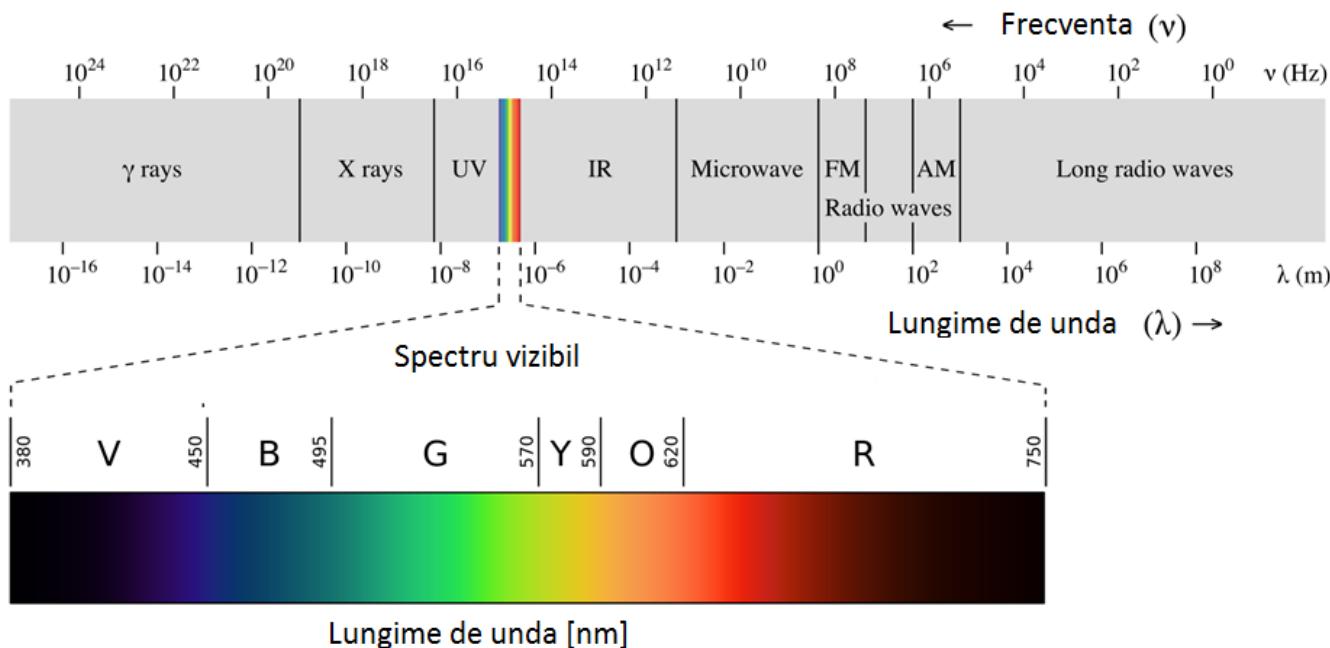


# Computer vision



## Date de intrare / input data

- Images captured with acquisition devices adapted for the whole spectrum of the electromagnetic waves
- Visible spectrum images (*visible light*) – most used / accessible
- Other sources of images: *infrared (IR)*, *acoustic / ultrasonic waves (US)*, *X ray images etc.*





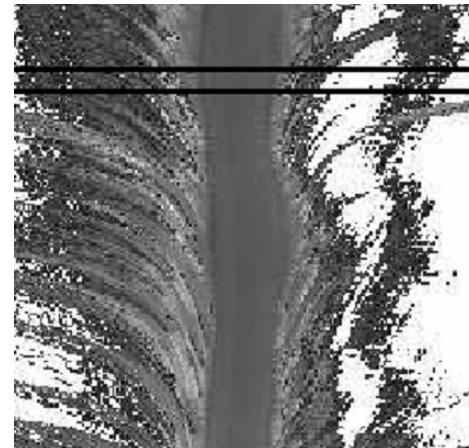
# Computer vision



## Date de intrare / *input data*



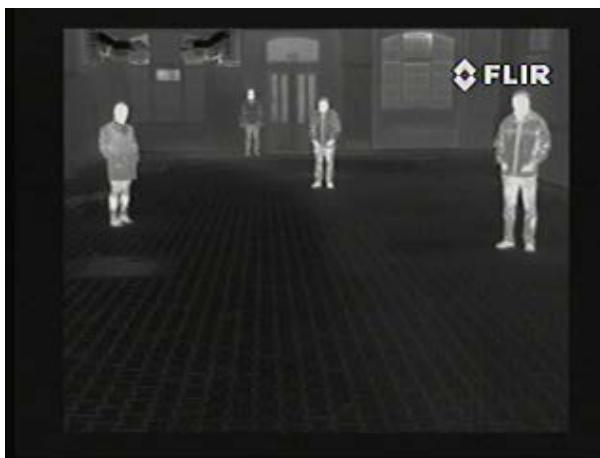
Visible spectra (380 – 750 nm)



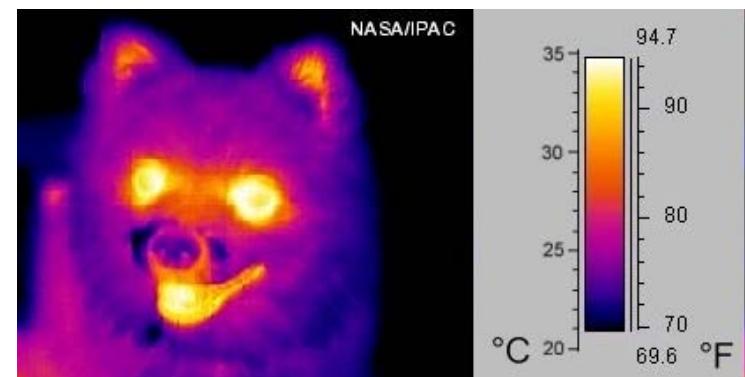
LiDAR RADAR reflectivity  
(NIR : 0.75 .. 1.4 $\mu$ m)



RADAR reflectivity  
24GHz (SRR) / 77 (LRR)



SWIR / Thermal (8-15 $\mu$ m)



LWIR / Thermal (heatmap)

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# Viziunea artificială



## Date de intrare / *input data*

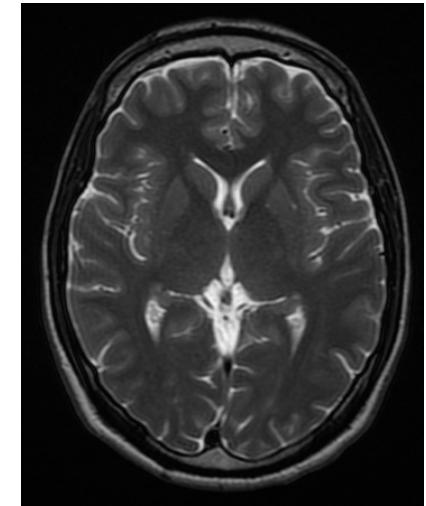
Other image sources: *acoustic waves (US), MRI, CT*



US 7–18 MHz: muscle, thyroid, ...  
US 1–6 MHz: liver, kidney, ...



X-ray (radiography)



MRI



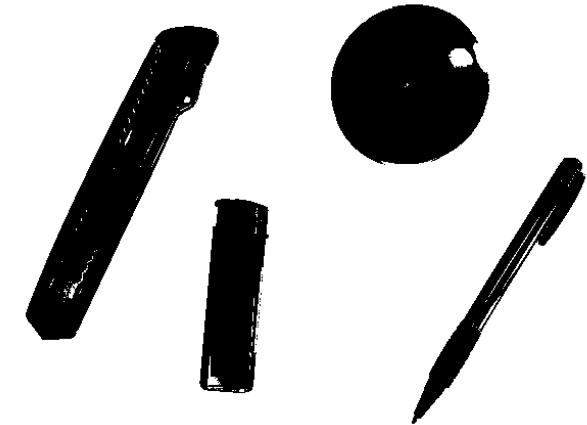
X-ray (CT slice)



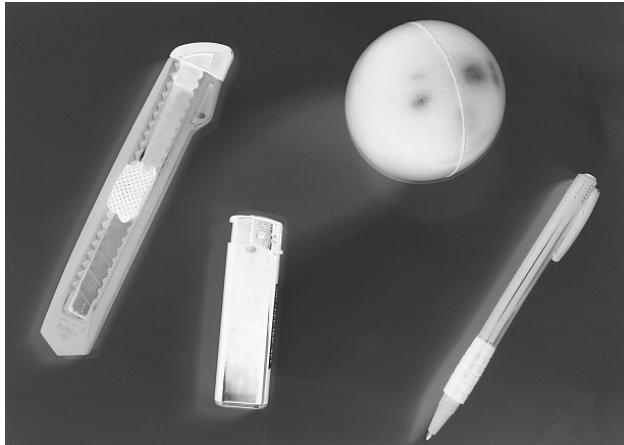
# Examples of simple processings



Color conversion: color -> grayscale -> binary image



Negative





# Examples of simple processings



Brightness and contrast change



Brightness ++



Source image



Brightness --



Contrast ++



Contrast --

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# Examples of simple processings



Noise reduction

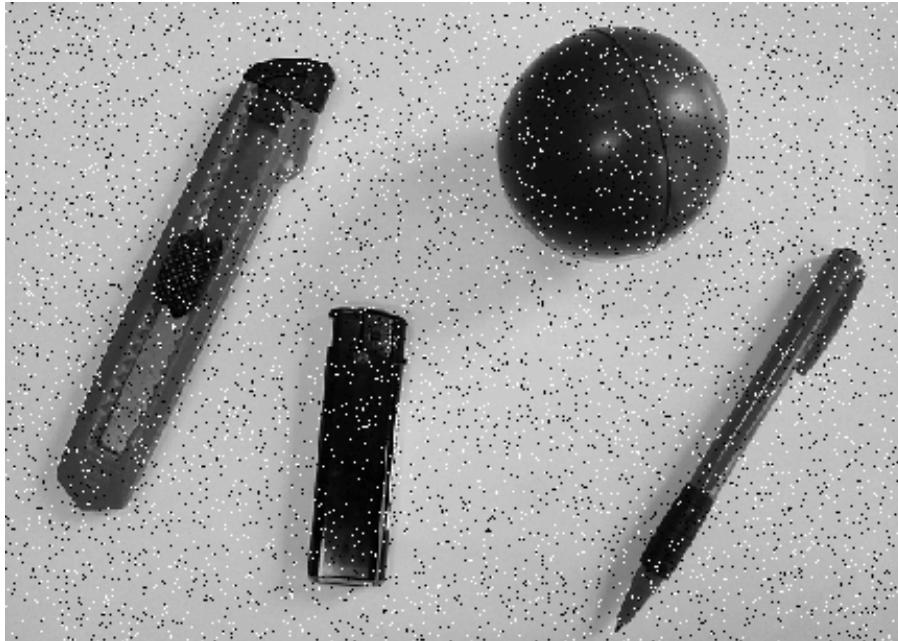


Image corrupted by  
Salt&Pepper noise



Filtered image (median filter)



# Examples of simple processings



Noise reduction

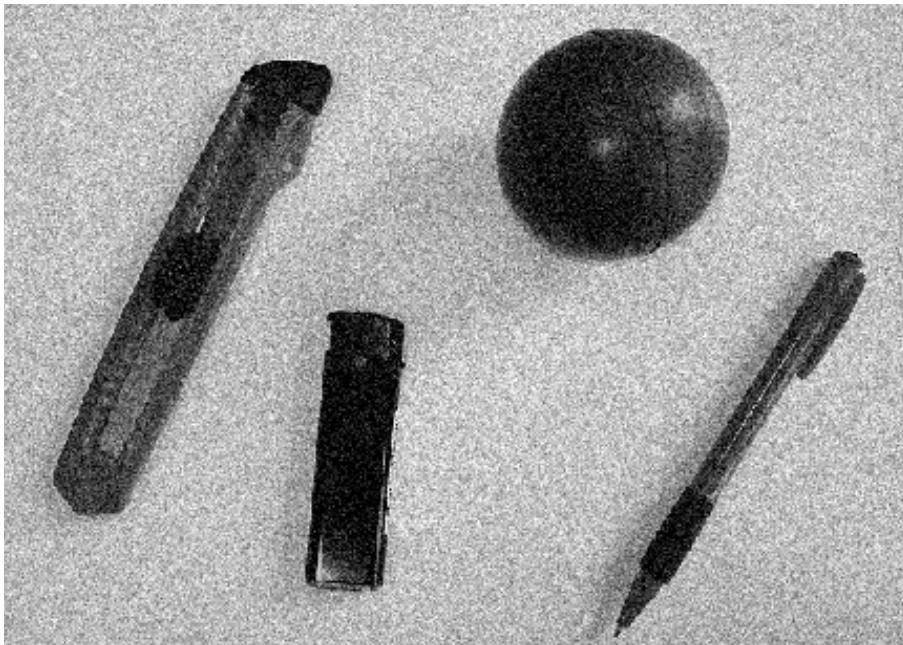
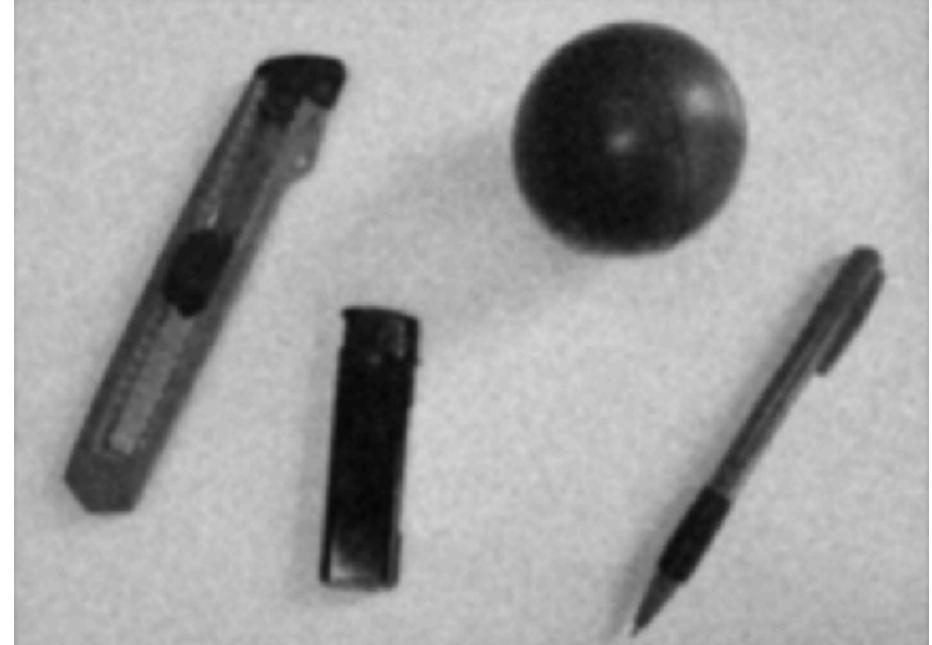


Image corrupted by Gaussian noise



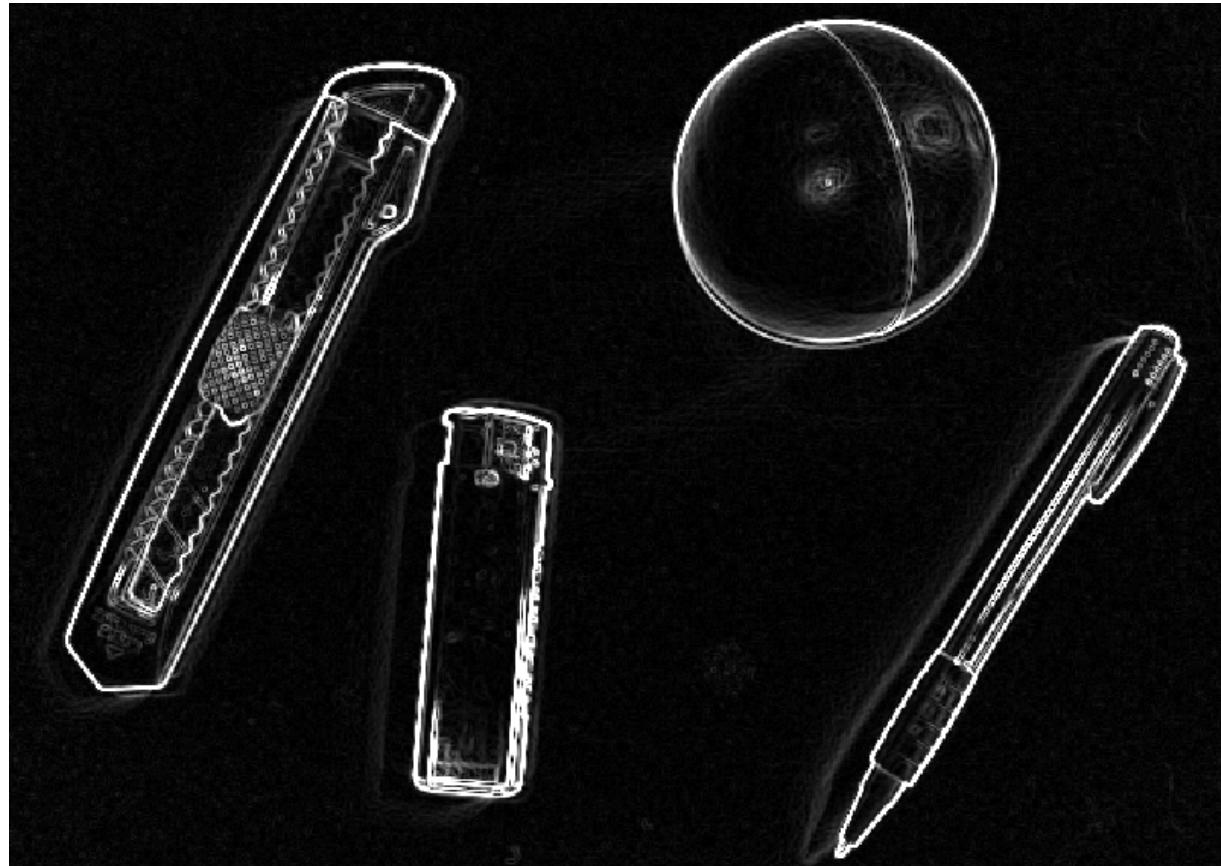
Filtered image (median filter)



# Examples of simple processings



First order derivative (image gradient)



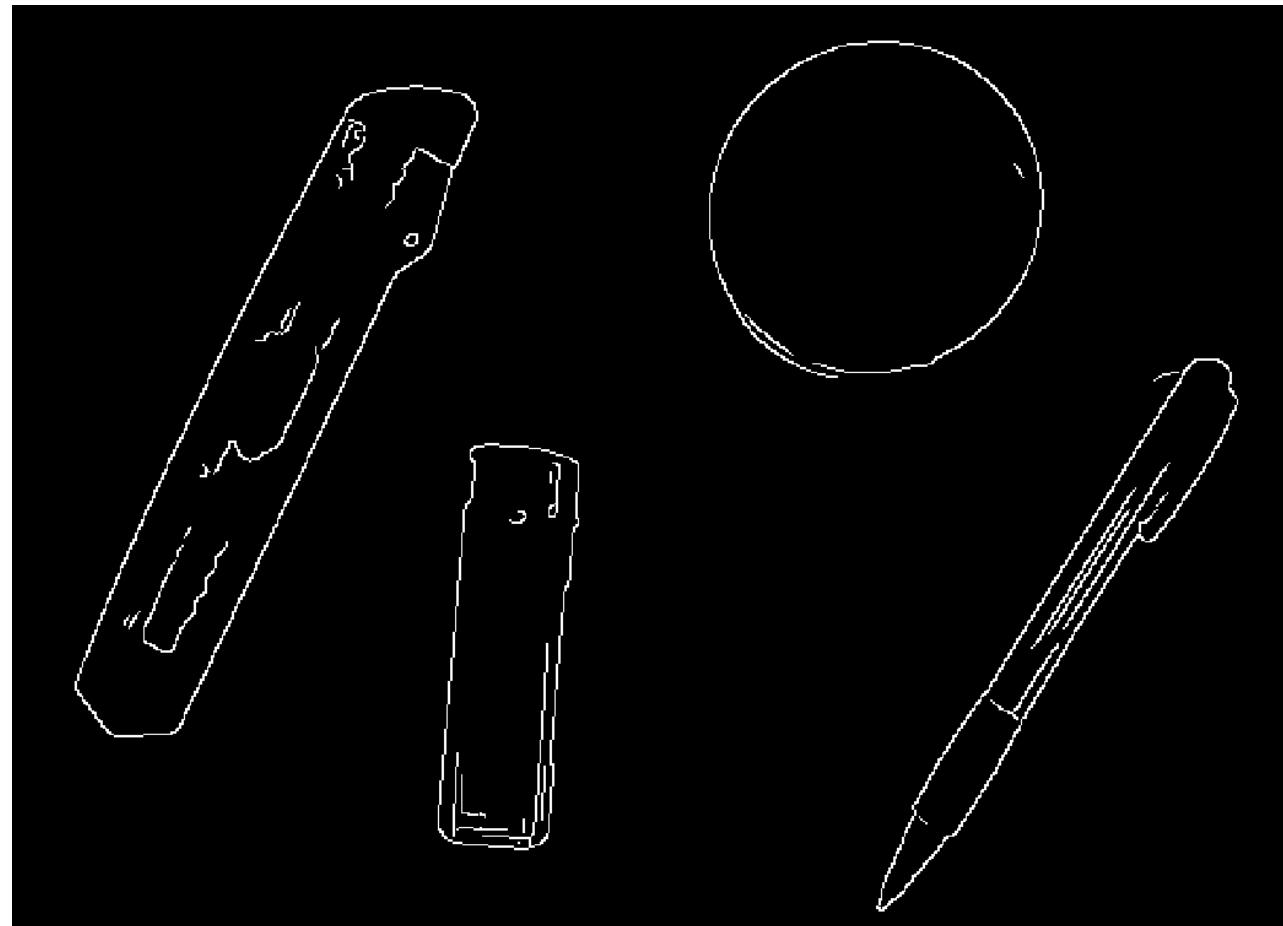
Gradient magnitude



# Examples of simple processings



Edge detection



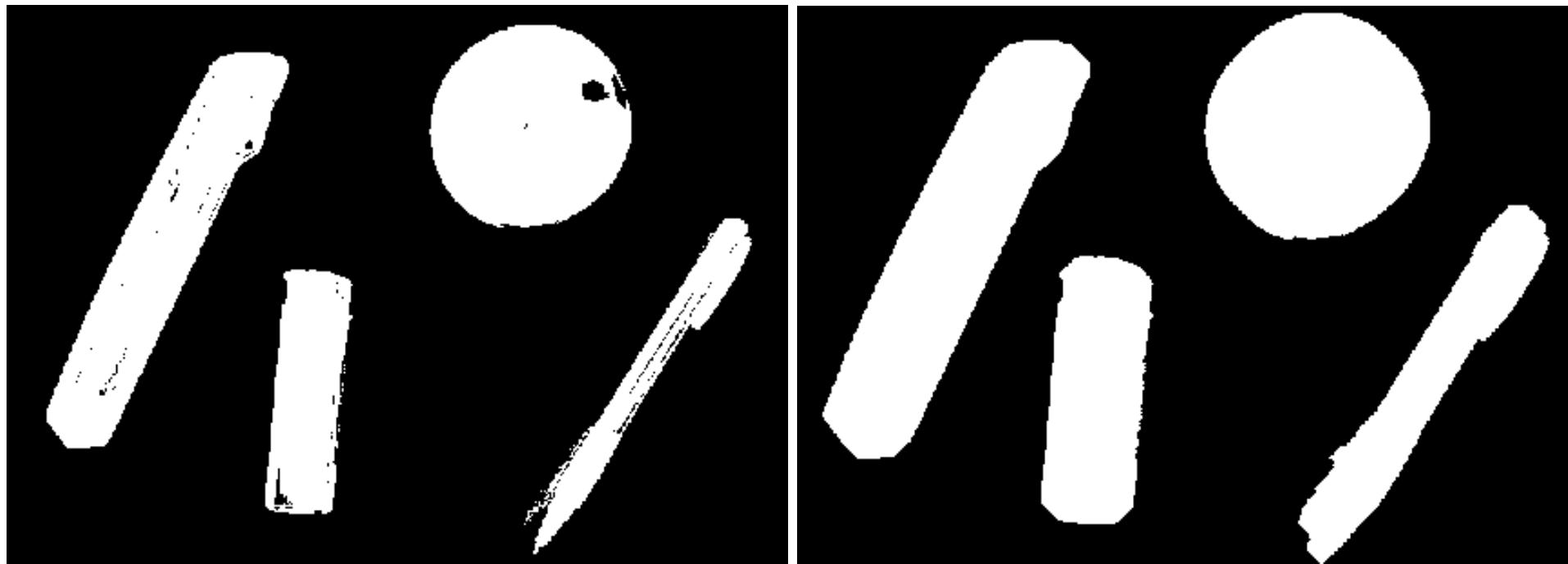
Canny edge detection method



# Examples of simple processings



Morphological operations: dilation

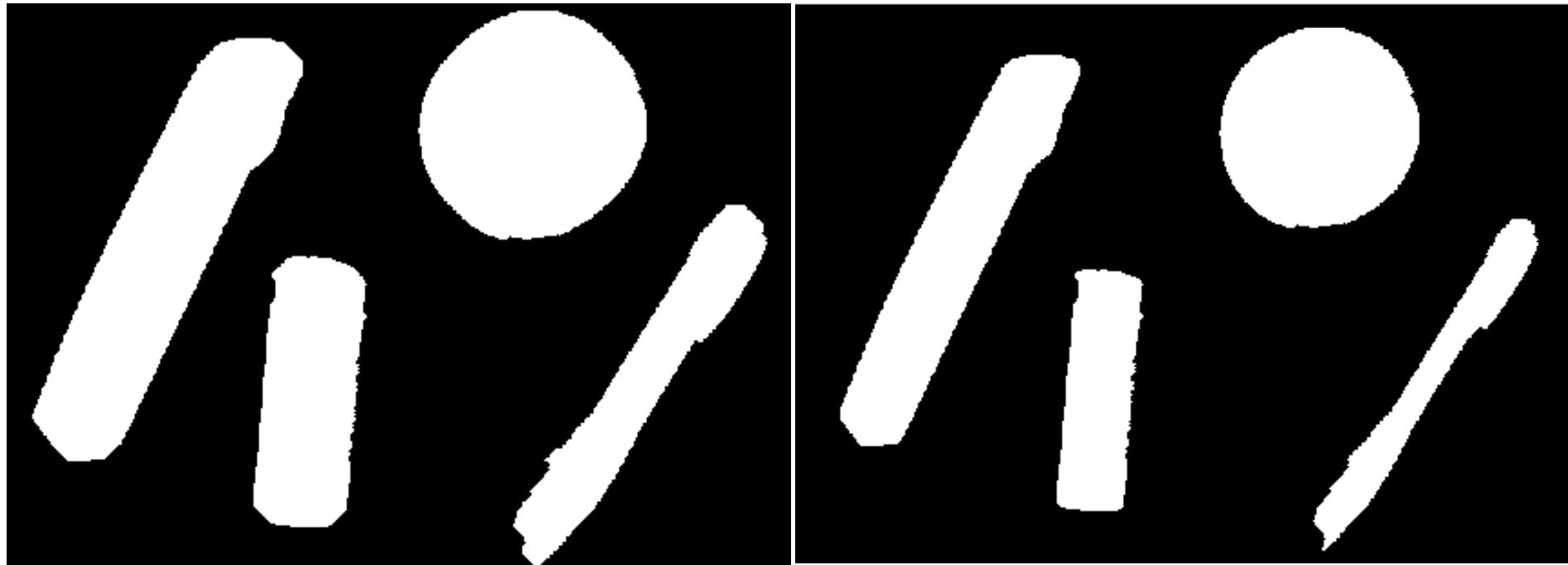




# Examples of simple processings



Morphological operations: erozion

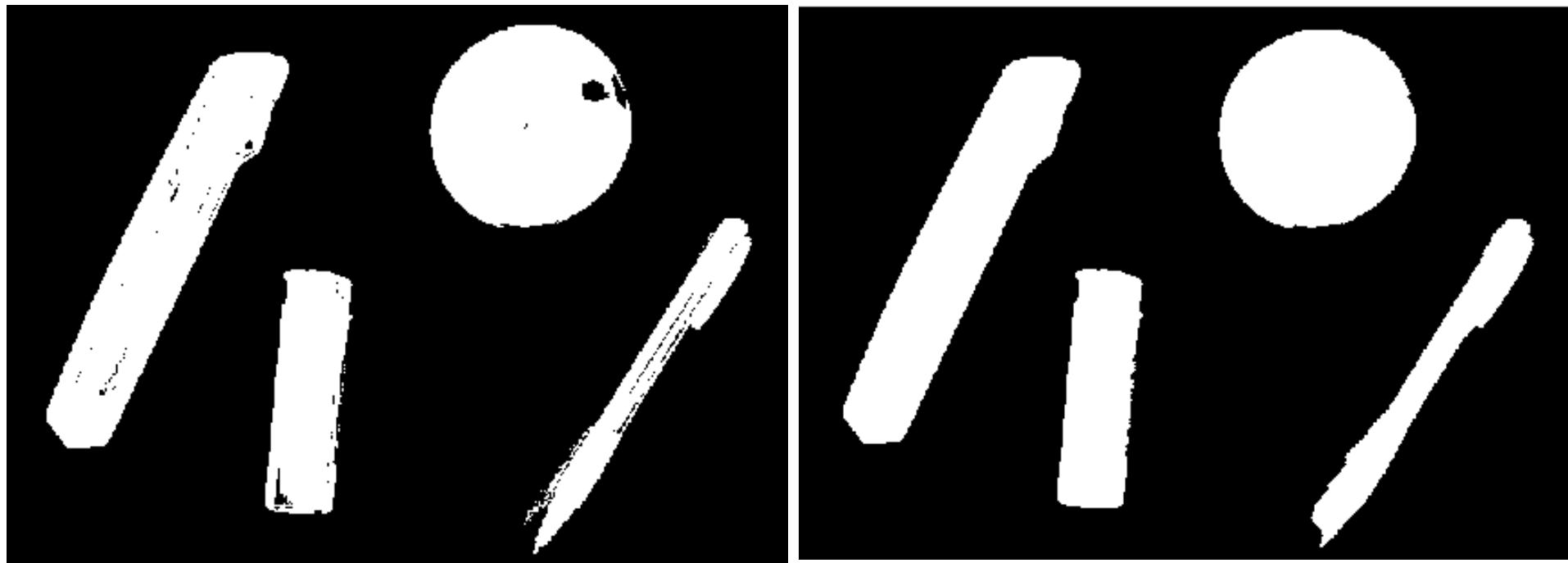




# Examples of simple processings



Closing (dilation + erosion): hole filling (preserves area)

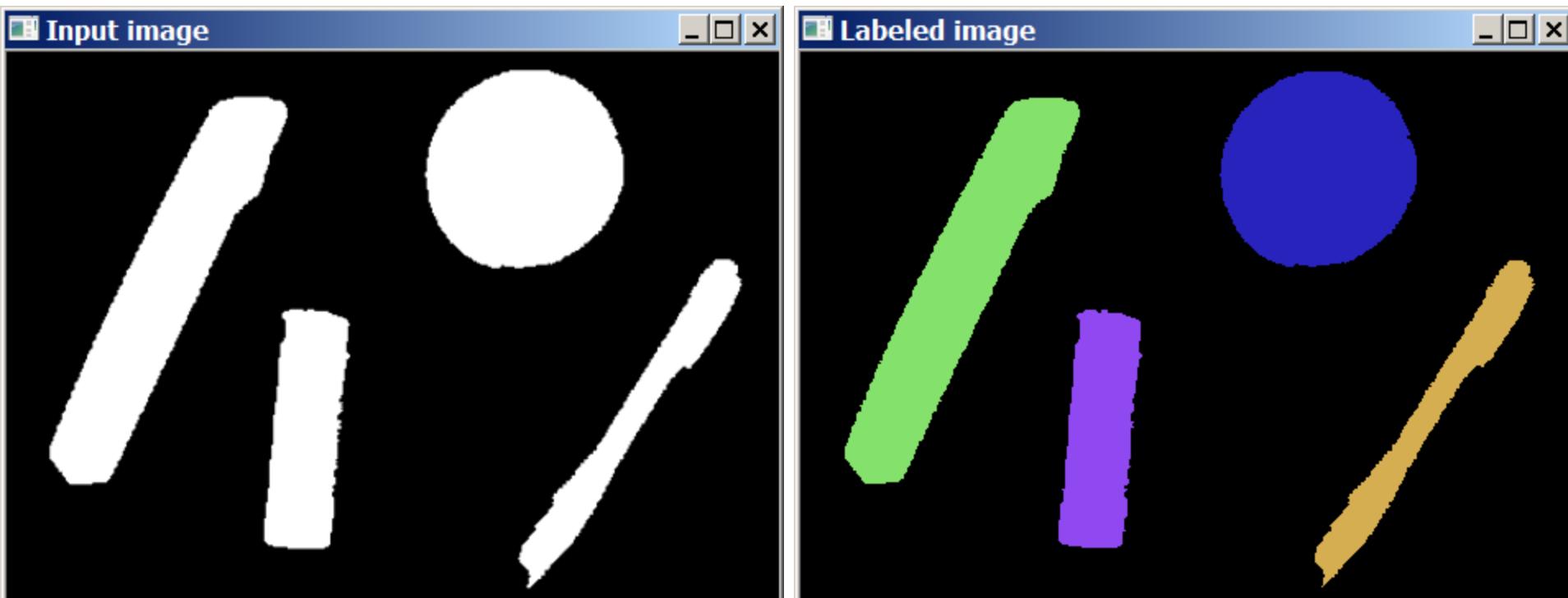




# Examples of simple processings



## Objects labeling

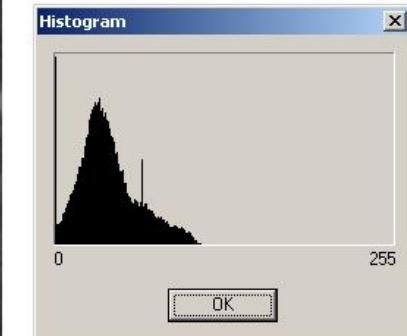
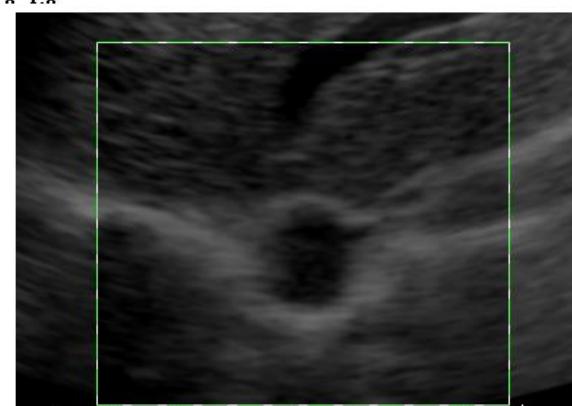
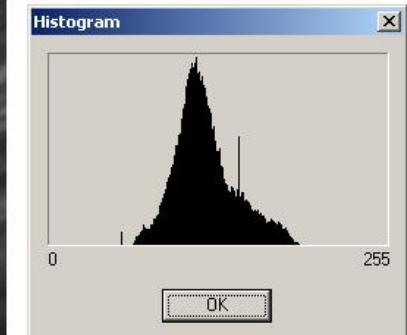
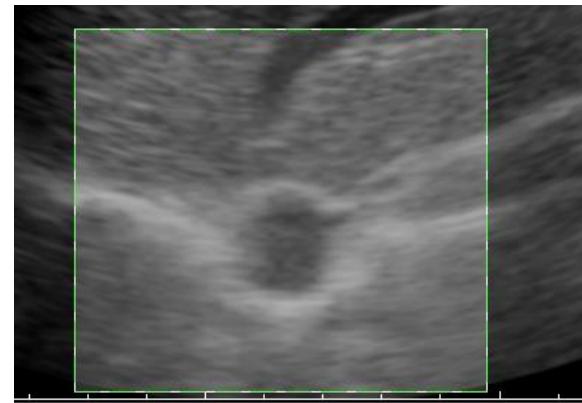
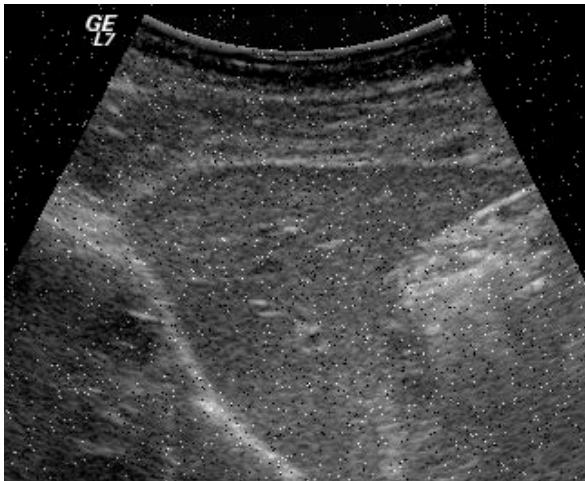




# Examples of simple processings



Image enhancement (medical images)

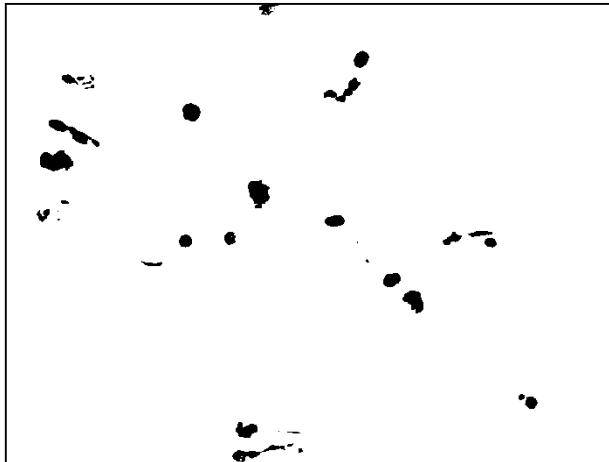
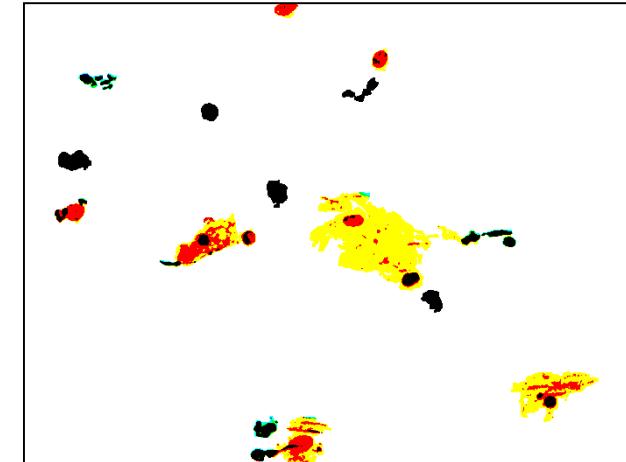
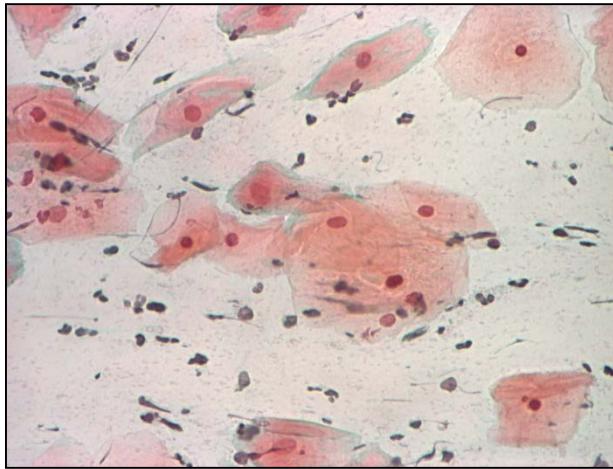




# Examples of applications



## Image segmentation (medical images)



Features

The features extracted from the abnormal nuclei found in the image are:

Nucleus	Entropy	Homogeneity	Coarseness	Busyness	Fractal dimension	No. clusters	No. colors
0	2.53647	0.450885	0.0131579	0.661315	1.96163	20	2441
1	2.57566	0.404834	0.0227273	0.611727	4.71926	12	1027
2	2.78164	0.438416	0.013245	0.660755	2.14959	19	2436
3	2.47713	0.454494	0.0168067	0.639943	4.65406	16	1230
4	2.51205	0.435782	0.016	0.644344	2.2737	16	1548
5	2.48444	0.442439	0.018018	0.633624	4.3415	12	1310

The execution times for the operation mentioned below are:

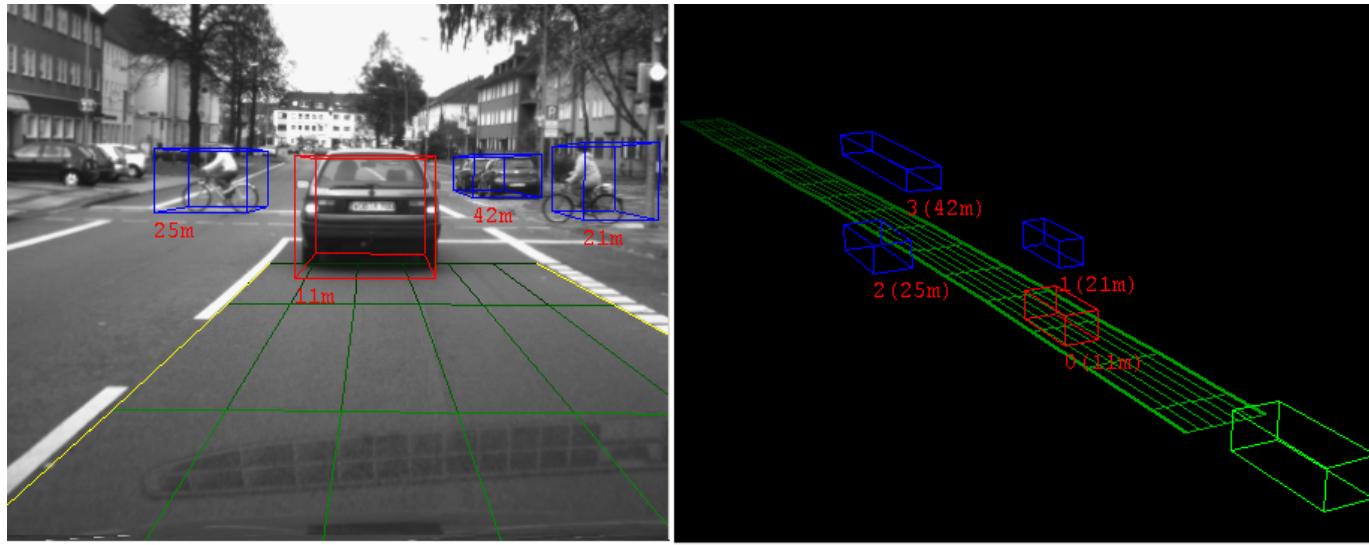
Operation	Time elapsed
KSW on RGB	00:00:735
KSW and Minimum Error	00:04:422
MultiSpace thresholding	00:02:156
HMT	00:00:390
Texture-related features	00:13:750



# Examples of applications



Objects detection and road modeling in automotive scenarios



Object Attributes											
Obj ID	Points	XMin	XMax	YMin	YMax	ZMin	ZMax	TrackingID	SpeedX	SpeedZ	
0	0	-1232	367	-1366	33	11980	15980	1	0.2	-0.9	
1	459	3600	5020	-1716	-229	21720	26260				
2	312	-5440	-3340	-1685	-220	25320	30120				
3	366	2940	5420	-1707	-146	42660	56840				

Units

Lane Width	3548.7	mm
Horizontal Curvature	-8.28237e-007	rad/mm
H. Curv. Variation	0	rad/mm^2
Vertical Curvature	0	rad/mm
V. Curv. Variation	0	rad/mm^2
Lateral Offset	-226.14	mm
Pitch Angle	-0.155341	tan(Ang)
Roll Angle	-0.0736862	tan(Ang)
Yaw Angle	0.466067	tan(Ang)



# Examples of applications



Object Attributes

ObjID	Points	XMin	XMax	YMin	YMax	ZMin	ZMax	TrackingID	SpeedX	SpeedZ	
0	77	2397	4197	-1702	-317	70012	74012	379	-0.1	119.7	
1	41	2168	4068	-1920	-558	138265	148765	382	0.9	147.7	

Left Image [1:1] (634,226,[70],[GM: 2])

Lane Width 3374.18  
Horizontal Curvature -1.00887e-009  
H. Curv. Variation -4.75497e-014  
Vertical Curvature -4.73984e-009  
V. Curv. Variation -1.20098e-016  
Lateral Offset 171.427  
Pitch Angle 0.210692  
Roll Angle -0.622455  
Yaw Angle 0.0690208

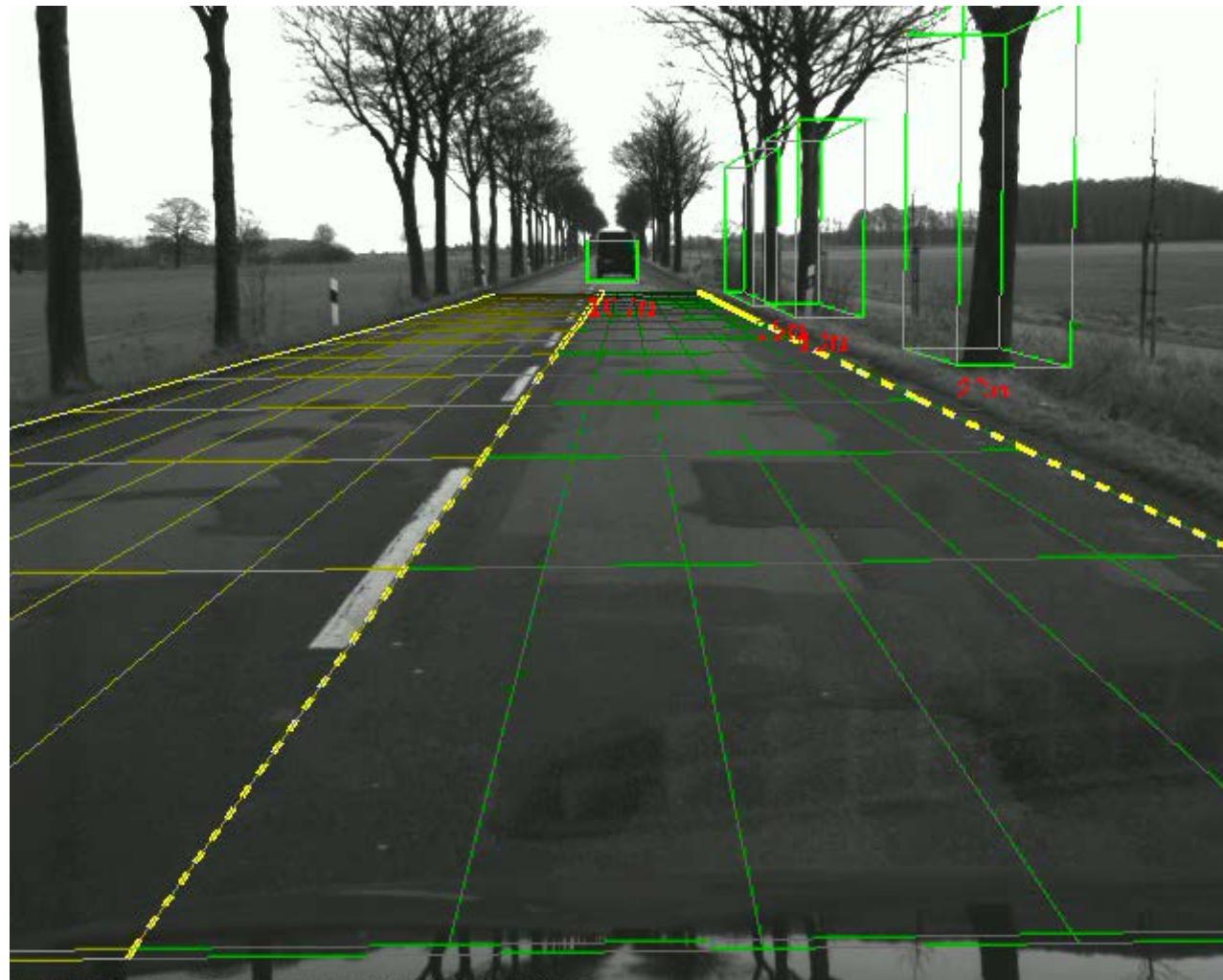
View Points

View:	Top	Side	Front	FreeLook
Points:	3597	Objects:	2 (Tracking)	
	-43520 (X:55886, Z:145350)	58239		
	164761			
	-6407			

SVI Napoca apartment



# Examples of applications

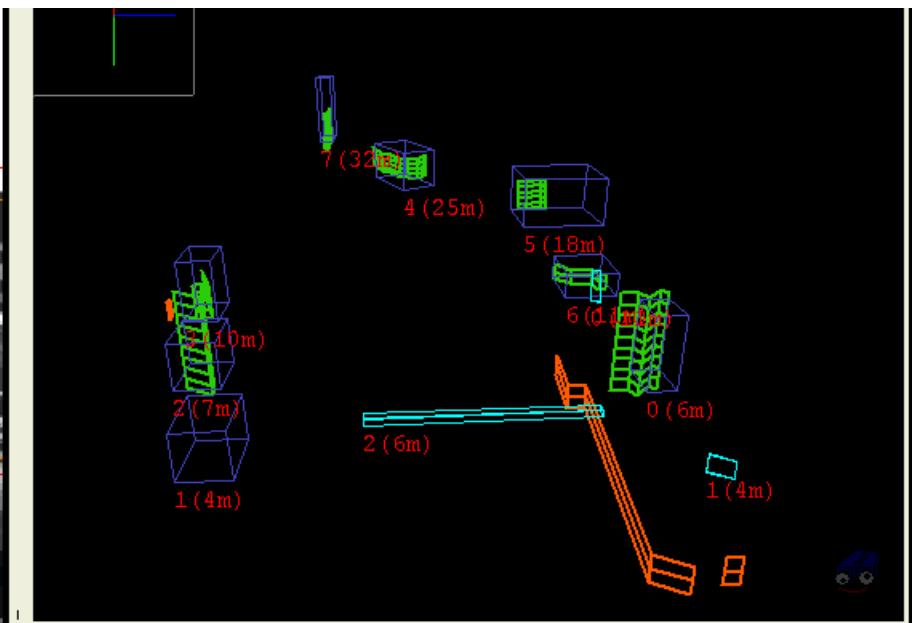
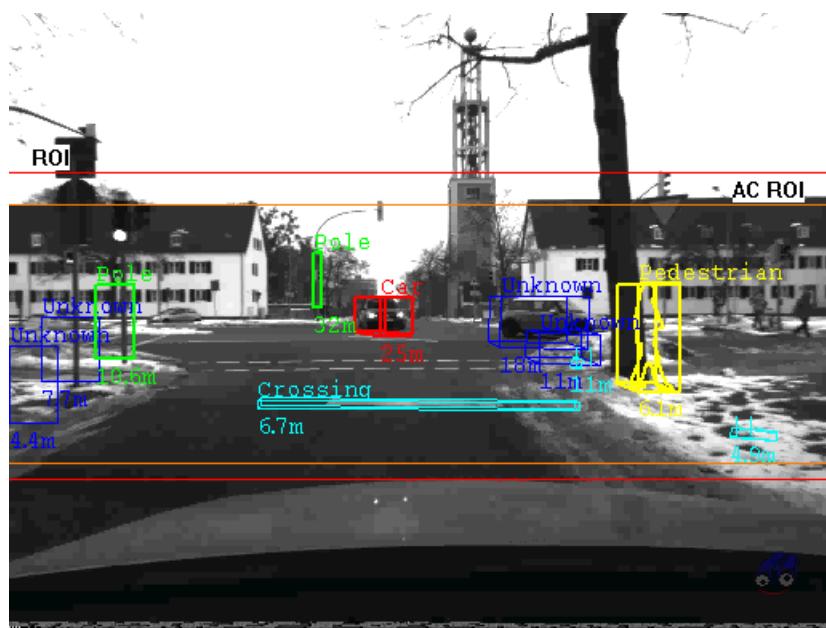




# Examples of applications



Objects detection and road modeling in automotive scenarios





# Examples of applications

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Perceptual interfaces – HCI /Human Computer Interaction)

Pranav Mistry at TED; The Sixth Sense

[http://www.ted.com/talks/pranav\\_mistry\\_the\\_thrilling\\_potential\\_of\\_sixthsense\\_technology.html](http://www.ted.com/talks/pranav_mistry_the_thrilling_potential_of_sixthsense_technology.html)