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# Computer Vision - Lecture 1

## Introduction

19.10.2016

Computer Vision WS 16/17

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## Organization

- **Lecturer**
  - Prof. Bastian Leibe ([leibe@vision.rwth-aachen.de](mailto:leibe@vision.rwth-aachen.de))
- **Teaching Assistant**
  - Stefan Breuers ([breuers@vision.rwth-aachen.de](mailto:breuers@vision.rwth-aachen.de))
- **Course webpage**
  - <http://www.vision.rwth-aachen.de/courses/>  
→ Computer Vision
  - Slides will be made available on the webpage
  - There is also an L2P electronic repository
- **Please subscribe to the lecture on the Campus system!**
  - Important to get email announcements and L2P access!

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## Language

- **Official course language will be English**
  - If at least one English-speaking student is present.
  - If not... you can choose.
- **However...**
  - Please tell me when I'm talking too fast or when I should repeat something in German for better understanding!
  - You may at any time ask questions in German!
  - You may turn in your exercises in German.
  - You may answer exam questions in German.

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## Organization

- **Structure: 3V (lecture) + 1Ü (exercises)**
  - 6 ECTS credits
  - Part of the area "Applied Computer Science"
- **Place & Time**
  - **Lecture:** Mon 10:15 - 11:45 UMIC 025
  - **Lecture/Exercises:** Wed 10:15 - 11:45 UMIC 025
- **Exam**
  - Written exam
  - Dates will be communicated soon

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## Exercises and Demos

- **Exercises**
  - Typically 1 exercise sheet every 2 weeks (Matlab based)
  - Hands-on experience with the algorithms from the lecture.
  - Send in your solutions the night before the exercise class.
  - No admission requirement to qualify for the exam this year!
- **Teams are encouraged!**
  - You can form teams of up to 3 people for the exercises.
  - Each team should only turn in one solution.
  - But list the names of all team members in the submission.

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## Course Webpage

Course Schedule

Date	Title	Content	Material
Wed, 2016-10-19	Introduction	Why vision? Applications, Challenges, Image Formation	
Mon, 2016-10-24	Exercise 1	Intro Matlab	
Wed, 2016-10-26	Image Processing I	Binary Images, Thresholding, Morphology, Connected Components, Region Descriptors	
Mon, 2016-10-31	Image Processing II	Linear Filters, Gaussian Smoothing, Median Filter	<b>Monday: Matlab tutorial</b>
Wed, 2016-11-02	Edge Detection	Multi-scale Representations, Image Derivatives, Edge Detection	
Mon, 2016-11-07	Structure Extraction	Chamfer Matching, Line Fitting, Hough Transform, Gen. Hough Transform	
Wed, 2016-11-09	Segmentation I	Segmentation as Clustering, k-means, EM, Mean Shift	
Mon, 2016-11-14	Exercise 2	Thresholding, Morphology, Derivatives, Edges	
Wed, 2016-11-16	Segmentation II	Segmentation as Energy Minimization, (Markov Random Fields, Graph Cuts)	
Mon, 2016-11-21	Recognition I	Global Descriptors, Histograms, Histogram Comparison, Multidim. Histograms	
Wed, 2016-11-23	Categorization I	Sliding Window-based Object Detection, SVM, HOG	

<http://www.vision.rwth-aachen.de/courses/>


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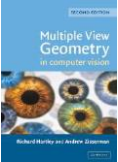
## Textbooks

- No single textbook for the class.
- Basic material is covered in the following two books.



D. Forsyth, J. Ponce  
Computer Vision - A Modern Approach  
Prentice Hall, 2002

(available in the library's "Handapparat")



R. Hartley, A. Zisserman  
Multiple View Geometry in Computer Vision  
2nd Ed., Cambridge Univ. Press, 2004

- Additional material will be given out for some topics.
  - Tutorials and deeper introductions.
  - Application papers

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## How to Find Us

- Office:
  - UMIC Research Centre
  - Mies-van-der-Rohe-Strasse 15, room 124
- Office hours
  - If you have questions to the lecture, come to us.
  - My regular office hours will be announced (additional slots are available upon request)
  - Send us an email before to confirm a time slot.

*Questions are welcome!*

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## Topics of Today's Lecture

- What is computer vision?
- What does it mean to see and how do we do it?
- How can we make this computational?

- First Topic: Image Formation
  - Details in Forsyth & Ponce, chapter 1.

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## Why Computer Vision?

Cameras are all around us...



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## Images and video are everywhere...



Personal photo albums



Movies, news, sports

Internet services





Surveillance and security



Mobile and consumer applications



Medical and scientific images

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## What is Computer Vision?


- Goal of Computer Vision
  - Enable a machine to "understand" images and videos
- Automatic understanding
  - Computing properties of the 3D world from visual data (*measurement*)
  - Algorithms and representations to allow a machine to recognize objects, people, scenes, and activities. (*perception and interpretation*)

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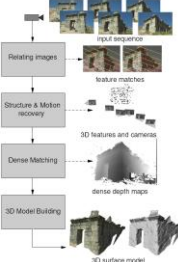
## Vision for Measurement

**Real-time stereo**




Pollefeys et al.

**Structure from motion**



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**Multi-view stereo for community photo collections**

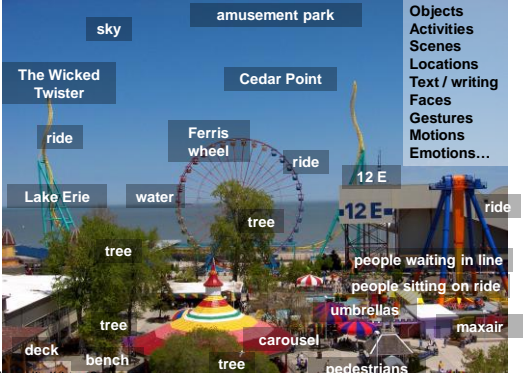


Goesele et al.

Slide credit: Svetlana Lazebnik

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## Vision for Perception, Interpretation



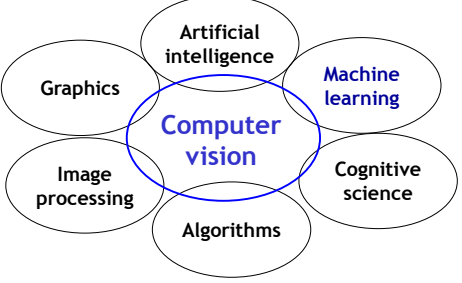
**Objects**

- Activities
- Scenes
- Locations
- Text / writing
- Faces
- Gestures
- Motions
- Emotions...

Slide credit: Svetlana Lazebnik

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## Related Disciplines



Slide credit: Svetlana Lazebnik

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## Directions to Computer Vision

- **Science**
  - Foundations of perception. How do WE see?
- **Engineering**
  - How do we build systems that perceive the world?
- **Many applications**
  - Medical imaging, surveillance, entertainment, graphics, ...

Slide credit: Svetlana Lazebnik

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## Applications: Faces and Digital Cameras



Setting camera focus via face detection




Camera waits for everyone to smile to take a photo [Canon]




Slide credit: Kristen Grauman, Rob Fergus

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## Segmentation



- **Automatic background removal from images**
  - Functionality is included in Microsoft Office 2010...



Slide credit: Svetlana Lazebnik

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## Matching

- Stitch your photos together to create panoramas

AUTOSTITCH Available on the iPhone App Store

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## Applications: Vision for Mobile Phones

Google Goggles in Action  
Click the icons below to see the different ways Google Goggles can be used

- Take photos of objects as queries for visual search

Slide credit: Svetlana Lazebnik

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## Applications: Vision-based Interfaces

KINECT for XBOX 360

Games (Microsoft Kinect)

Assistive technology systems  
Camera Mouse  
Boston College

Slide adapted from Kristen Grauman

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## Applications: Medical & Neuroimaging

Image guided surgery  
MIT AI Vision Group

fMRI data  
Golland et al.

Slide credit: Kristen Grauman

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## Applications: Visual Special Effects

The Matrix

MoCap for Pirates of the Caribbean, Industrial Light and Magic  
(Source: S. Seitz)

Slide adapted from Svetlana Lazebnik, Kristen Grauman

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## Applications: Safety & Security

Autonomous robots

Driver assistance

Monitoring pools (Poseidon)

Pedestrian detection [MERL, Viola et al.]

Surveillance

Slide credit: Kristen Grauman

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## Ok, Let's Do It - Any Obstacles?

- 1966: Seymour Papert directs an undergraduate student to solve "the problem of computer vision" as a summer project.

MASSACHUSETTS INSTITUTE OF TECHNOLOGY  
PROJECT MAC

Artificial Intelligence Group      July 7, 1966  
Vision Memo. No. 105.

**THE SUMMER VISION PROJECT**  
Seymour Papert

The summer vision project is an attempt to use our summer students effectively in the construction of a significant part of a visual system. The particular task was chosen partly because it can be segmented into sub-problems which will allow individuals to work independently and yet participate in the construction of a system complex enough to be a real landmark in the development of "pattern recognition".

- Obviously, computer vision was too difficult for that...


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## Challenges: Many Nuisance Parameters




Illumination




Object pose




Clutter



Occlusions



Intra-class appearance



Viewpoint

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## Challenges: Intra-Category Variation








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## Challenges: Complexity

- Thousands to millions of pixels in an image
- 3,000-30,000 human recognizable object categories
- 30+ degrees of freedom in the pose of articulated objects (humans)
- Billions of images indexed by Google Image Search
- 18 billion+ prints produced from digital camera images in 2004
- 295.5 million camera phones sold in 2005
- About half of the cerebral cortex in primates is devoted to processing visual information [Felleman and van Essen 1991].

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## So, Should We Give Up?

- NO! Very active research area with exciting progress!














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## Things Are Starting to Work...




Computer Vision in realistic scenarios is becoming feasible!

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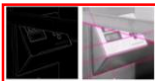
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**Course Outline**

- Image Processing Basics
- Segmentation
- Local Features & Matching
- Object Recognition and Categorization
- 3D Reconstruction
- Motion and Optical Flow

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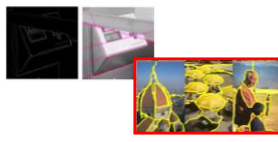
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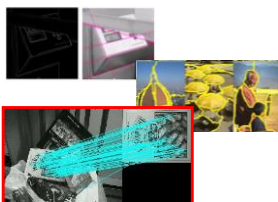
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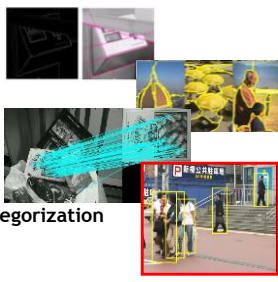
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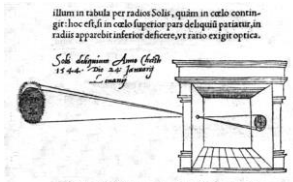
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## Camera Obscura

- Around 1519, Leonardo da Vinci (1452 - 1519)

- “When images of illuminated objects ... penetrate through a small hole into a very dark room ... you will see [on the opposite wall] these objects in their proper form and color, reduced in size ... in a reversed position owing to the intersection of the rays”



illum in tabula per radios Solis, quam in celo contingit: hoc eff. in celo superior pars deliquit partitur, an radius appareret inferior deficeret, vt ratio exigit optica.

Sole deliquit Anno 1544. 2da die Januarij L. noster

Sic nos exag. Anno .1544. Lunam eclisum Solis obseruauimus, inuenimusq. deficere paulo plus q. des.

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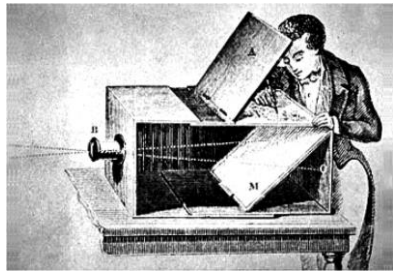
40

Slide credit: Bernd Schiele

Source: [http://www.acmi.net.au/AIC/CAMERA\\_OBSCURA.html](http://www.acmi.net.au/AIC/CAMERA_OBSCURA.html)

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## Camera Obscura



- Used by artists (e.g. Vermeer 17th century) and scientists

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Slide credit: Bernd Schiele

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## Camera Obscura



Jetty at Margate England, 1898.

An attraction in the late 19<sup>th</sup> century

LOCATED IN CENTRAL PARIS  
is the  
PERFECT LIVING PICTURE  
OF ALL  
SUBSCRIBING OBJECTS  
A Special Appliance to  
Gentlemen, Messieurs, Dames, &c.

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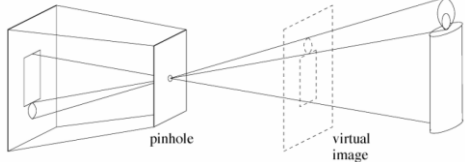
Adapted from R. Durstswahn

Source: <http://brighthouse.com/cosite/collection2.html>

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## Pinhole Camera

- (Simple) standard and abstract model today
  - Box with a small hole in it
  - Works in practice



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Source: Forsyth & Ponce

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## Pinhole Size / Aperture

- Pinhole too big - many directions are averaged, blurring the image
- Pinhole too small - diffraction effects blur the image
- Generally, pinhole cameras are *dark*, because a very small set of rays from a particular point hits the screen.



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Source: Forsyth & Ponce

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## The Reason for Lenses

- Keep the image in sharp focus while gathering light from a large area

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Source: Forsyth & Ponce  
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## The Thin Lens

$$\frac{1}{z'} - \frac{1}{z} = \frac{1}{f}$$

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Source: Forsyth & Ponce  
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## Focus and Depth of Field

Thin lens: scene points at distinct depths come in focus at different image planes.  
(Real camera lens systems have greater depth of field.)

- Depth of field: distance between image planes where blur is tolerable

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Source: Shapiro & Stockman  
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## Focus and Depth of Field

- How does the aperture affect the depth of field?

object image

Flower images from Wikipedia [http://en.wikipedia.org/wiki/Depth\\_of\\_field](http://en.wikipedia.org/wiki/Depth_of_field) Slide from S. Seitz<sup>48</sup>

- A smaller aperture increases the range in which the object is approximately in focus

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## Application: Depth from (De-)Focus

Images from same point of view, different camera parameters

3D Shape / depth estimates

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Slide credit: Kristen Grauman  
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[files from H. Jin and P. Favaro, 2002]

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## Field of View

- Angular measure of the portion of 3D space seen by the camera

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Slide credit: Kristen Grauman  
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Images from [http://en.wikipedia.org/wiki/Angle\\_of\\_view](http://en.wikipedia.org/wiki/Angle_of_view)



**Field of View Depends on Focal Length**

- As  $f$  gets smaller, image becomes more *wide angle*
  - More world points project onto the finite image plane
- As  $f$  gets larger, image becomes more *telescopic*
  - Smaller part of the world projects onto the finite image plane

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B. Leibe from R. Duraiswami

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**Digital Images**

- Film is replaced by a sensor array
- Current technology: arrays of *charge coupled devices* (CCD)
- Discretize* the image into pixels
- Quantize* light intensities into pixel values.

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Image source: Michael Black

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**Resolution**

- Sensor: size of real world scene element that images to a single pixel
- Image: number of pixels
- Influences what analysis is feasible, affects best representation choice

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Slide credit: Kristen Grauman

B. Leibe (figs from Efros et al., Mori et al.)

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**Color Sensing in Digital Cameras**

Bayer grid

Estimate missing components from neighboring values (demosaicing)

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Source: Steve Seitz

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**Grayscale Image**

- Problem of Computer Vision
  - How can we recognize fruits from an array of (gray-scale) numbers?
  - How can we perceive depth from an array of (gray-scale) numbers?
  - ...

	x =	58	59	60	61	62	63	64	65	66	67	68	69	70
y = 41	210	209	204	202	197	247	143	71	64	80	84	54	54	
42	206	196	235	197	155	210	207	58	63	58	53	53	61	61
43	201	207	192	201	188	213	156	89	65	57	55	52	58	
44	216	208	211	193	202	207	208	57	69	60	55	77	48	
47	221	206	211	194	196	197	220	56	63	60	55	46	67	58
46	209	214	224	189	184	182	204	173	64	60	59	51	62	58
47	204	212	213	208	191	190	191	214	69	62	66	76	51	49
48	214	215	215	207	208	180	172	188	69	72	55	49	56	52
49	209	205	214	205	204	187	196	86	62	68	87	57	60	48
50	208	209	205	203	202	186	174	195	149	71	63	55	55	45
51	207	210	211	199	217	184	183	177	209	60	62	44	52	52
52	208	205	209	200	197	194	183	187	187	239	58	68	61	51
53	204	206	200	200	195	203	188	190	183	221	75	61	56	49
54	200	203	199	200	189	187	183	193	194	122	63	58	64	66
55	205	210	202	203	199	187	196	181	173	186	105	62	57	64

- How do we humans do it? How can we make a computer do it?

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Slide credit: Michael Black

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**Next Lectures**

- First few lectures: low-level vision
  - Binary image processing
  - Filtering operations
  - Edge and structure extraction
  - Color
  - Segmentation and grouping
- Next week: Binary image processing

- Monday 24.10.: *Exercise 1*
  - Intro Matlab, basic image operations

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*Questions ?*