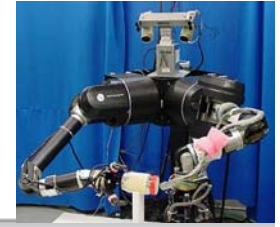


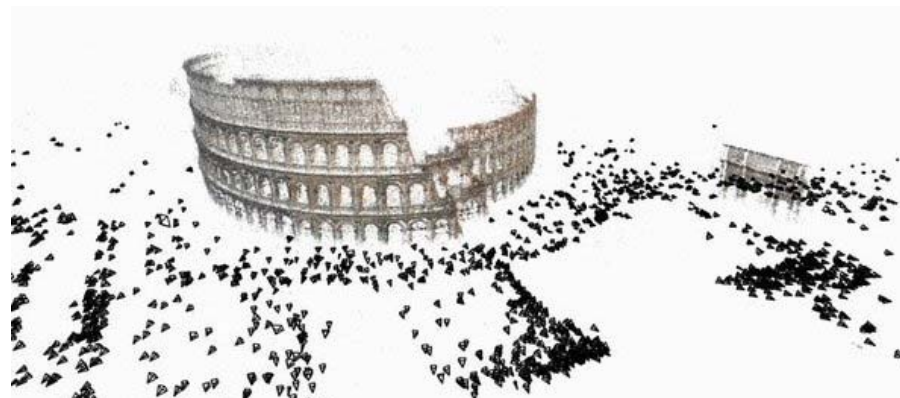
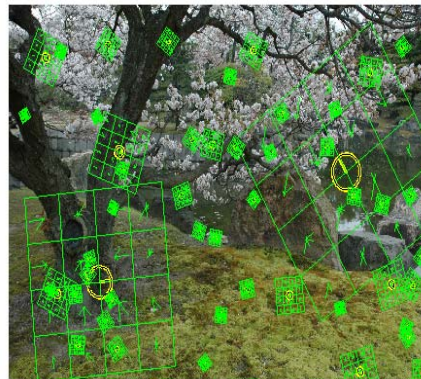
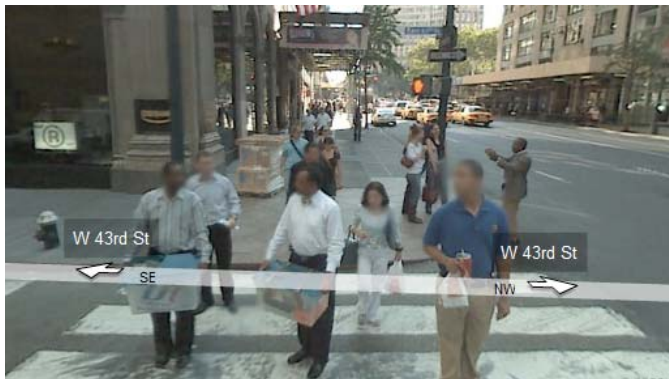
# Einführung in Visual Computing (EVC)

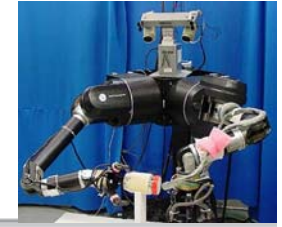
## Image Processing & Computer Vision



186.822 VU 5.0 6 ECTS

Robert Sablatnig



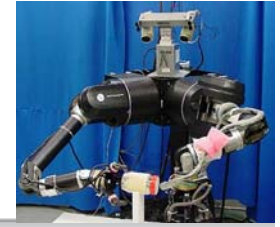


# EVC: Image Processing & Computer Vision

<http://www.caa.tuwien.ac.at/cvl/teaching/sommersemester/evc>

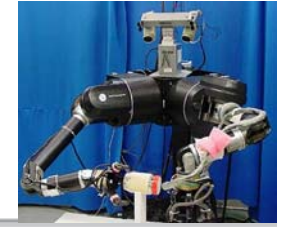
- Content:
  - What are the **basic concepts** of Image Processing and Computer Vision and how are they used in **applications**? The course answers these questions by describing the **creation** of **digital images** using digital cameras and the subsequent steps in order to derive **information kept in digital images automatically**.
  - A closer look is taken into **classical image processing** techniques like image **enhancement** and **compression**.
  - The next step consists in the development of **digital filters** and **segmentation** techniques in order to be able to extract specific information.
  - **Interest Points** Computational Photography, 3D and motion are further topics.
  - Application of **Algebra and Analysis** in reality

# Logistics



- Lectures: 13:00 - 15:00
- Instructors: Robert Sablatnig (VO) and Sebastian Zambanini (UE)
- Textbook: 4 A4 pages/lesson available in pdf at website
- Further Reading:
  - Richard Szeliski, Computer Vision: A Modern Approach  
<http://szeliski.org/Book/>
  - Sonka, Hlavac, Boyle: Image Processing, Analysis, and Machine Vision, 2nd Edition
- Webpage:  
<http://www.caa.tuwien.ac.at/cvl/teaching/sommersemester/evc>





# Readings

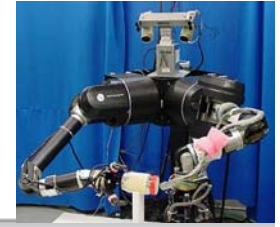
- Alfred Nischwitz, Max Fischer, Peter Haberäcker, Gudrun Socher, „*Computergrafik und Bildverarbeitung*“, Vieweg+Teubner Verlag, Springer Fachmedien Wiesbaden GmbH, 2011.
- Downloadbar (nur im TU Netz):

<http://link.springer.com/book/10.1007/978-3-8348-8300-1>





# Readings



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## Computergrafik und Bildverarbeitung

Band II: Bildverarbeitung

Authors: Alfred Nischwitz, Max Fischer, Peter Haberäcker, Gudrun Socher

ISBN: 978-3-8348-1712-9 (Print) 978-3-8348-8000-1 (Online)

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Table of contents (28 chapters)

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Book Chapter

Einleitung

Alfred Nischwitz, Max Fischer, Peter Haberäcker, Gudrun Socher

Other actions

About this Book

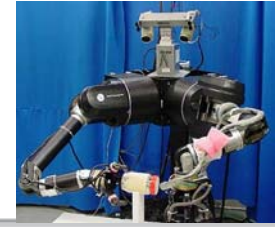
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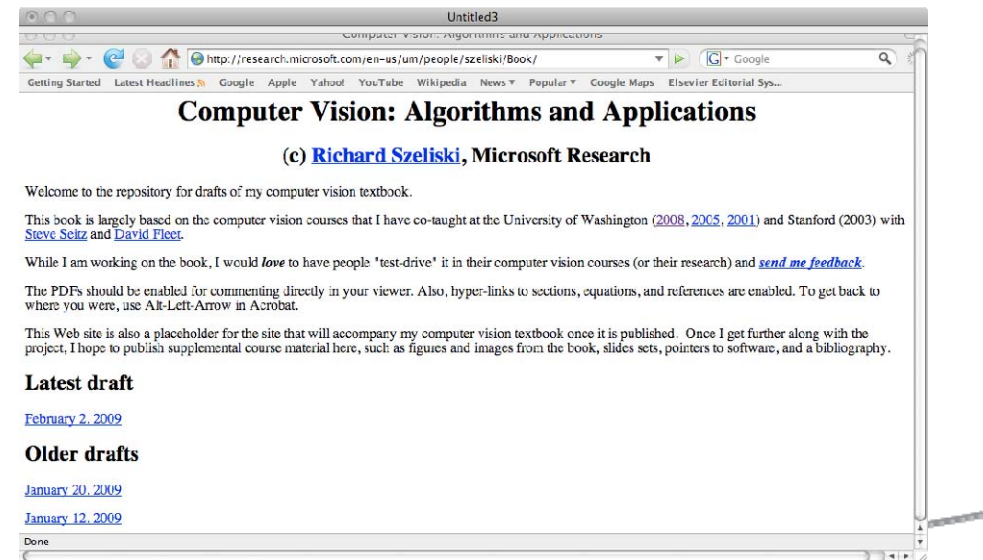
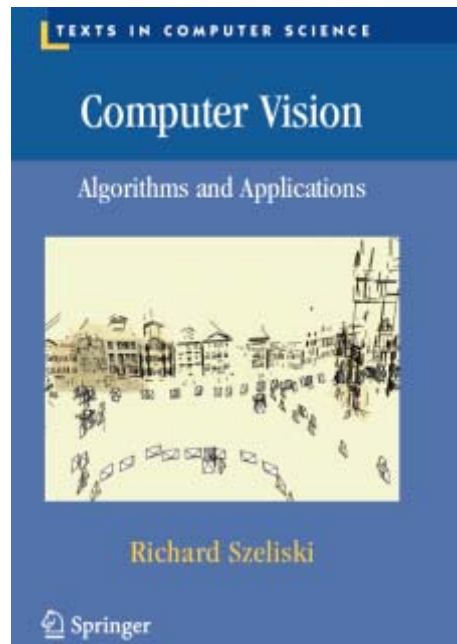
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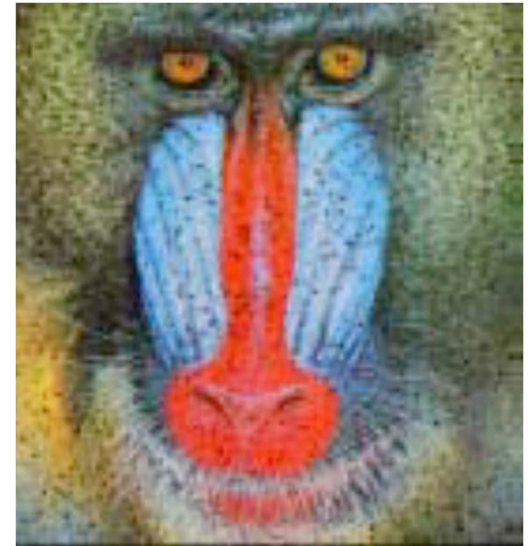
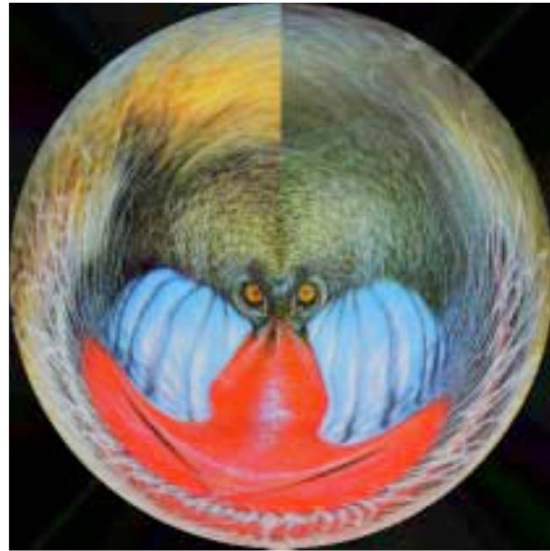
Computergrafik und Bildverarbeitung

# Readings

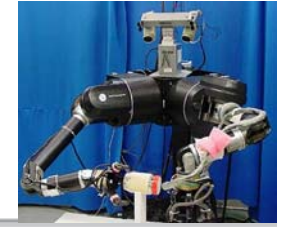


- Richard Szeliski, „Computer Vision: Algorithms and Applications“, Springer-Verlag London, 2011
- <http://link.springer.com/book/10.1007/978-1-84882-935-0>
- <http://szeliski.org/Book/>

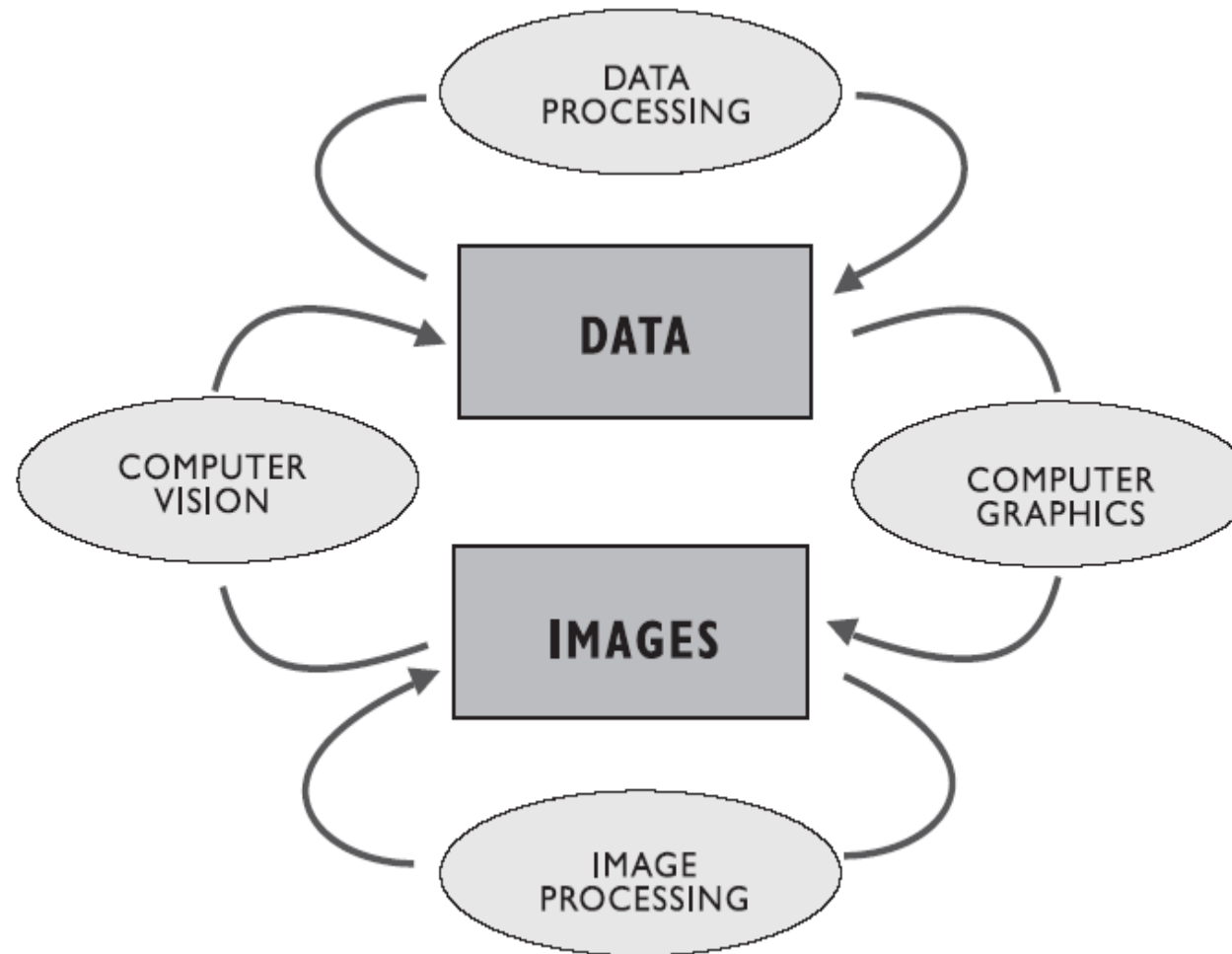




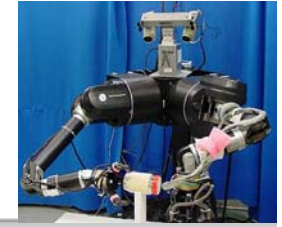
## Introduction: What is Image Processing?



# Computer Graphics vs. Computer Vision

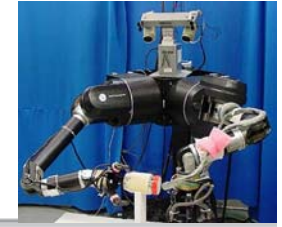






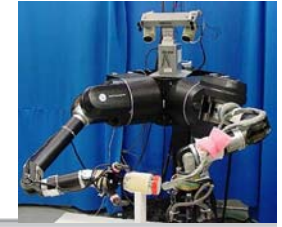
# Categorization

- **Image Processing**
  - *Manipulation of Image Data,*
  - Like removal of Noise, Correction of Sharpness on digital images.
- **Computer Vision**
  - *Generation of non-graphical Data* from images,
  - Like Character-and Text Recognition, Segmentation of images into „interesting“ parts, Detection of lines and corners.
- **Computer Graphics**
  - *Generation of Images* from non-graphical data,
  - like bar charts, 3d graphics „VR“ in real time, graphical outputs

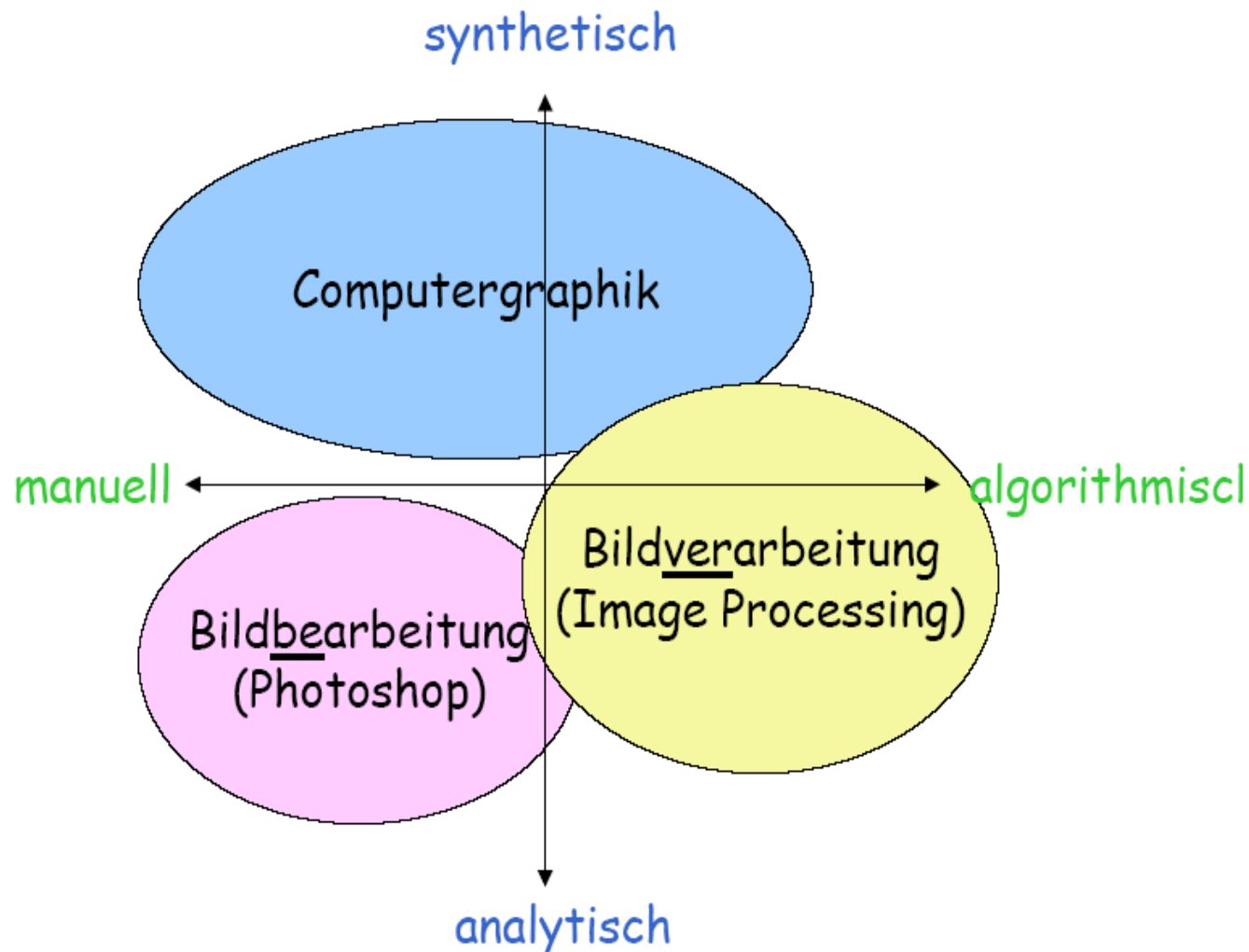


# Categorization

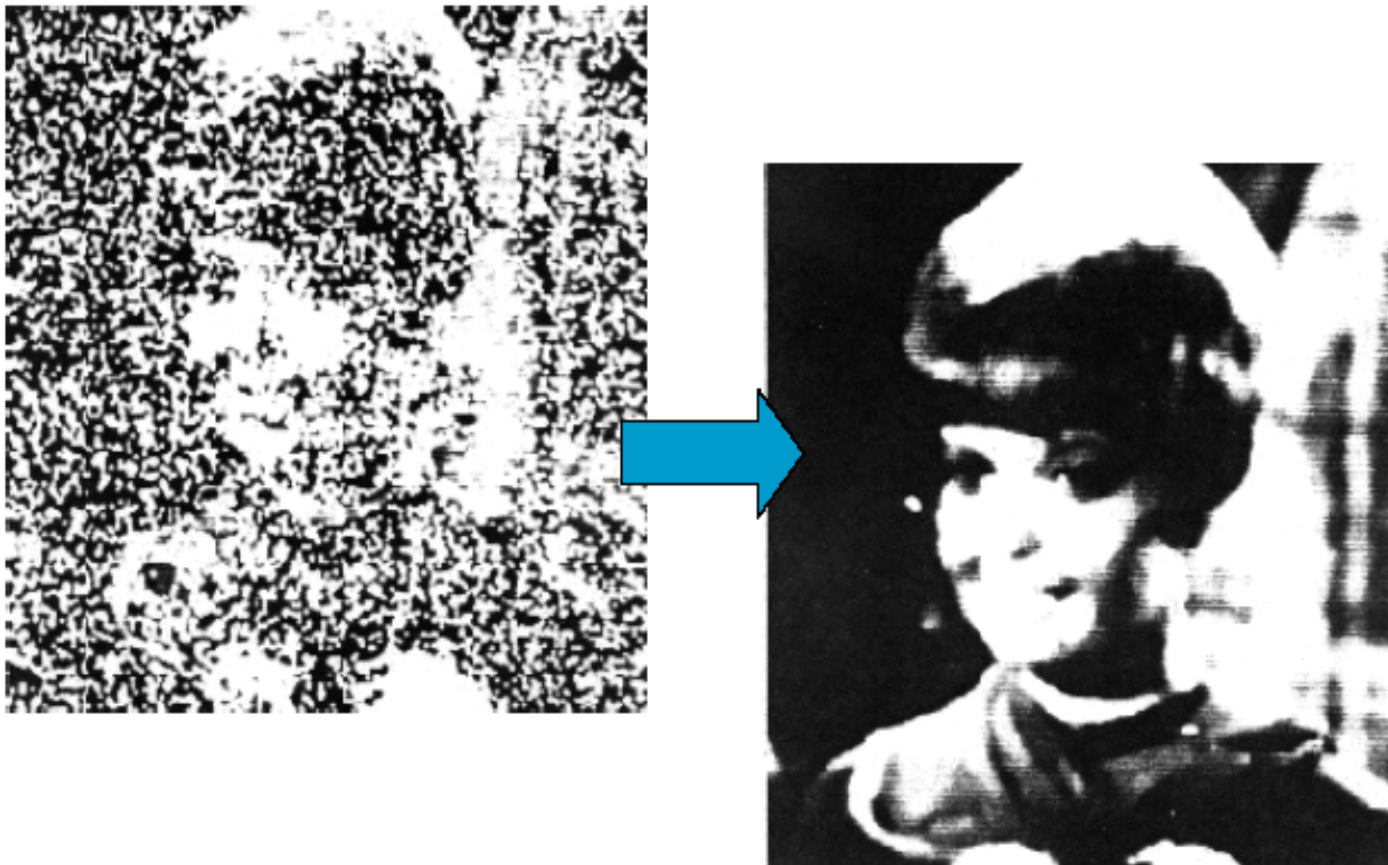
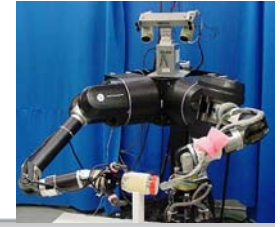
- ***Image Editing***: Manipulation of Images (e.g. Adobe Photoshop)
  - Visually
  - Interactive
  - User-defined parameters
- ***Image Processing***: Mathematical algorithmic processes
  - Image enhancement
  - Image transformation (geometric)
  - Image compression
  - Image segmentation



# Kategorisierung

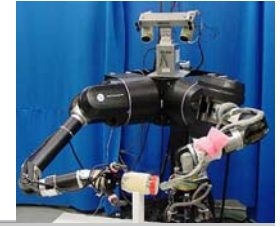


# Example Image Processing: Filter (Noise Removal)





# Example Image Processing: Image Enhancement

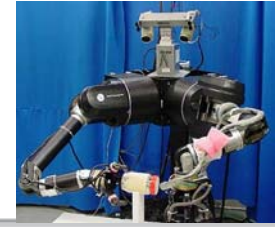


Original

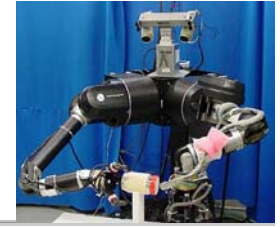


Automatic Enhancement

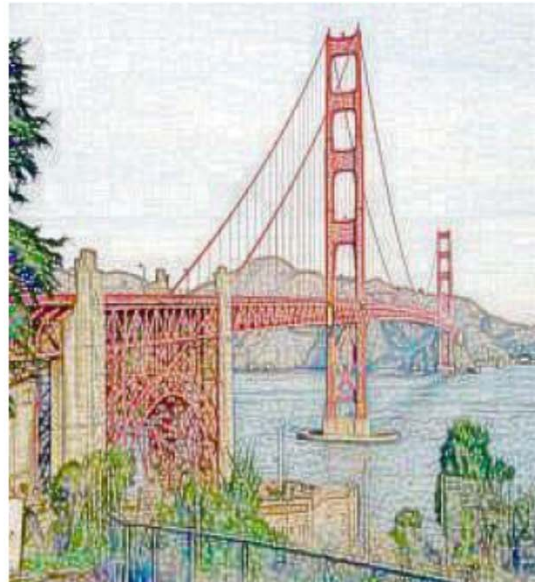
# Example: Image Restoration



# Example: Special Effects



Photo

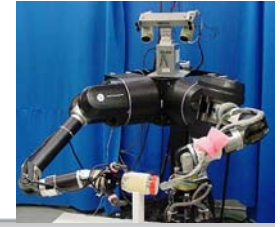


Simulated  
color pencils



Simulated  
oil painting

# Difference: Pattern Recognition – Image Processing?



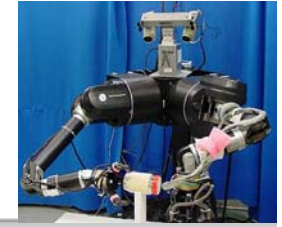
- **Pattern Recognition:**

- **Classification** of **Patterns** into a (finite) **number of** pre-defined **classes**
- like 2-dimensional patterns, **OCR**
- **Standard book:** Duda and Hart 1973, "Pattern Classification and Scene Analysis"

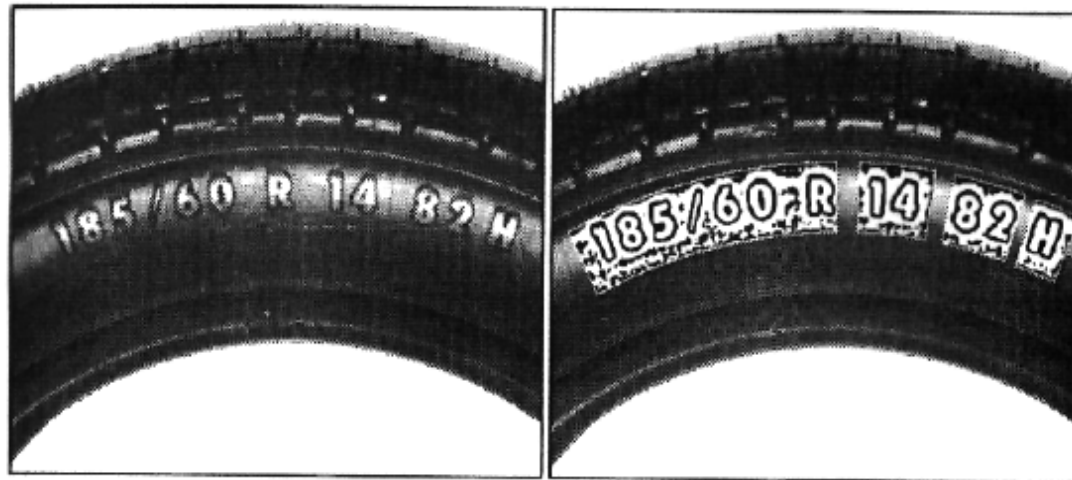
- **Image Processing:**

- **Processing** of an image to get a **new image** that is **better suited** for a specific **task**.
- Image **enhancement**, image **transformation**, image **compression**, image **segmentation**, image **restauration**...
- **Standard book:** Rosenfeld and Kak 1982, "Digital Picture Processing", 2nd Edition



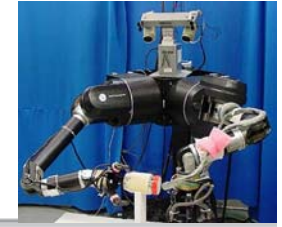


# Example: Pattern Recognition



Optical  
Character  
Recognition  
(OCR)

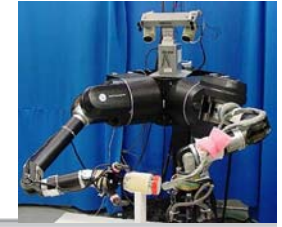




# Example: Pattern Recognition

## Fingerprint Recognition



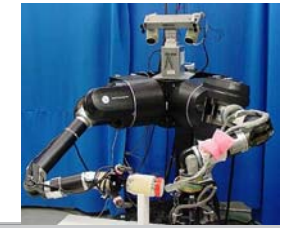


# Example: Pattern Recognition

## Face Recognition

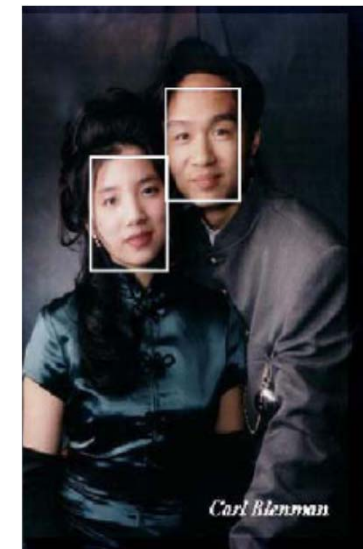
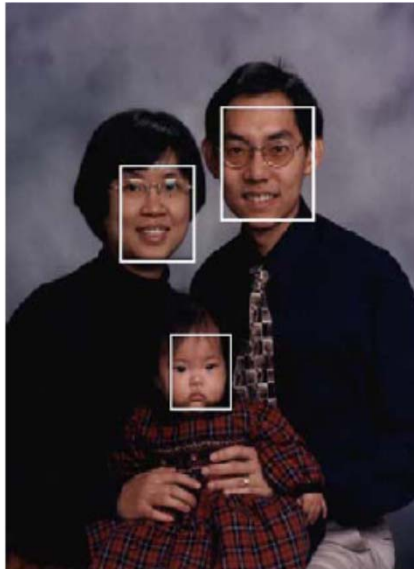






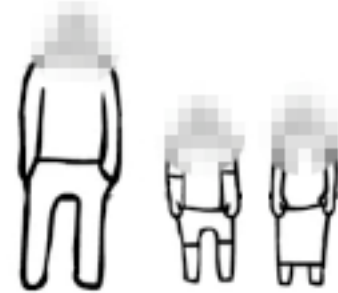
# Example: Computer Vision

- Face Detection





# Google Street View



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1504 broadway, nyc

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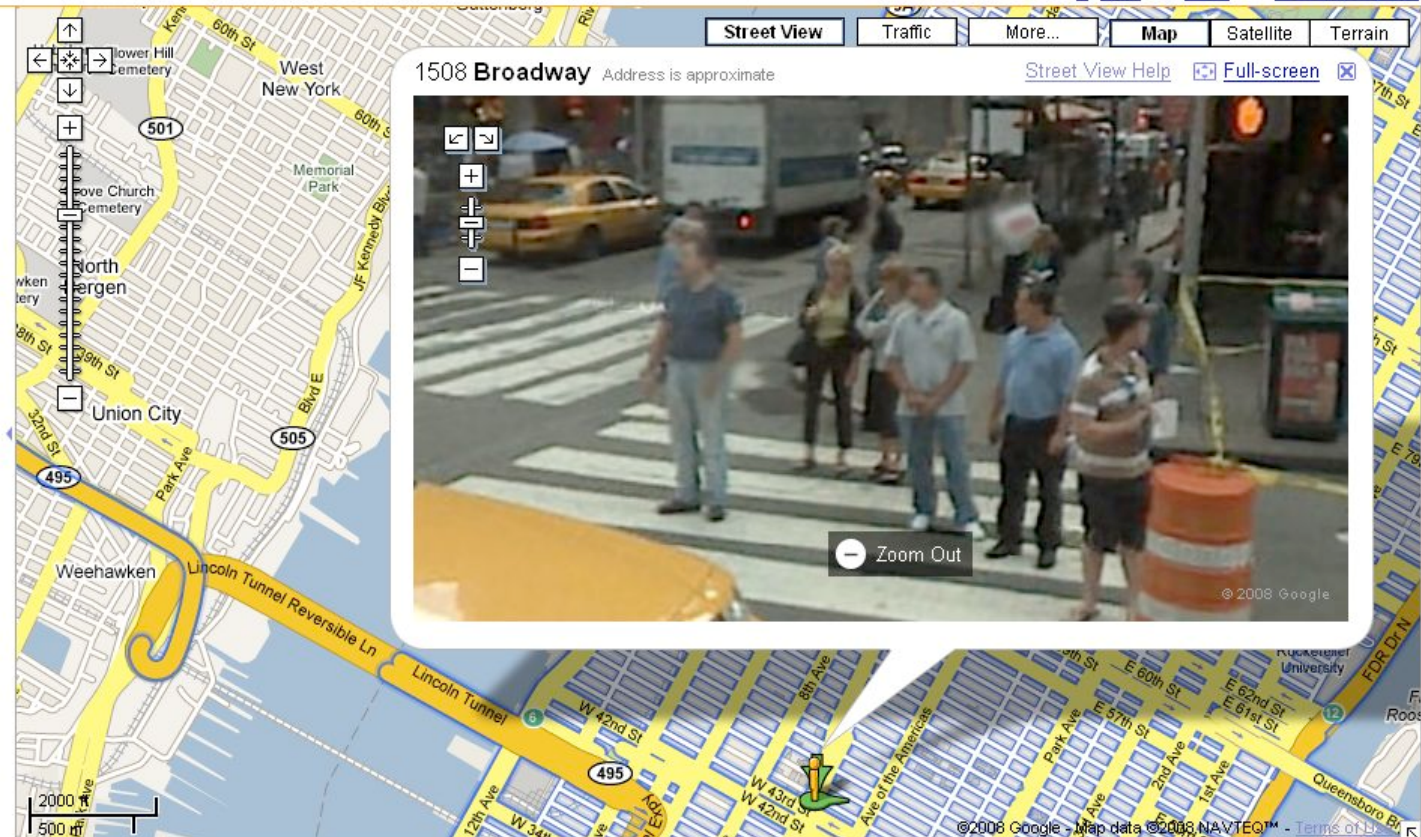
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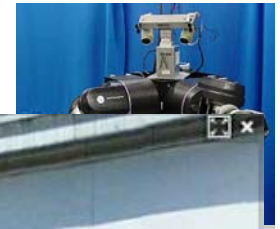
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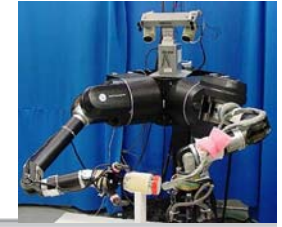


# Google Street View



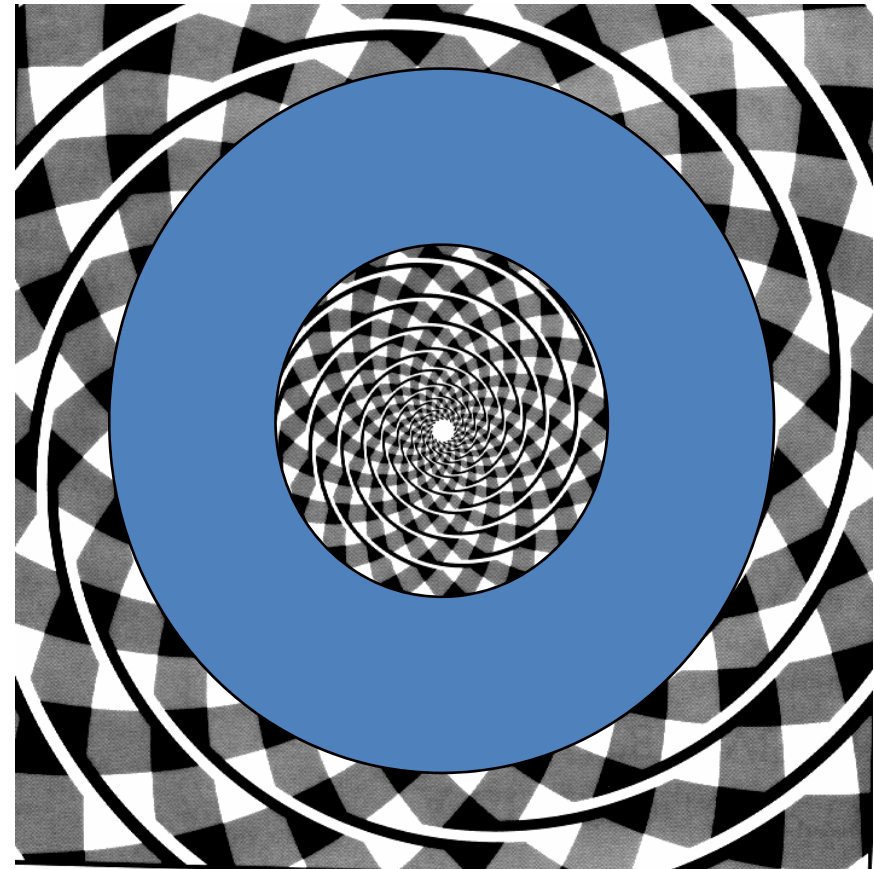
# Introduction: What is Computer Vision?

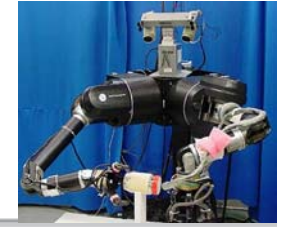
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# Computer Vision

- Vision is derived from **Human Vision** (Human Visual System)
- Humans „see“ in **3 Dimensions**  
=> Computer Vision has 3d components
- Evolution millions of years: Human visual system **not faultless**
- => if human visual system is not faultless how can we expect from a machine that it is?





# What is Computer Vision ?

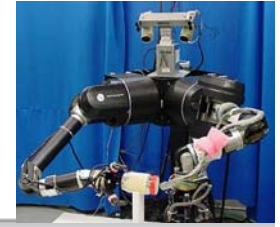
*"**Computer Vision** describes the **automatic deduction** of the structure and the properties of a (possible dynamic) **three-dimensional world** from either a **single** or **multiple two-dimensional images** of the world"*

- Vishvjit S. Nalwa: *A guided tour of computer vision*. Addison-Wesley 1993

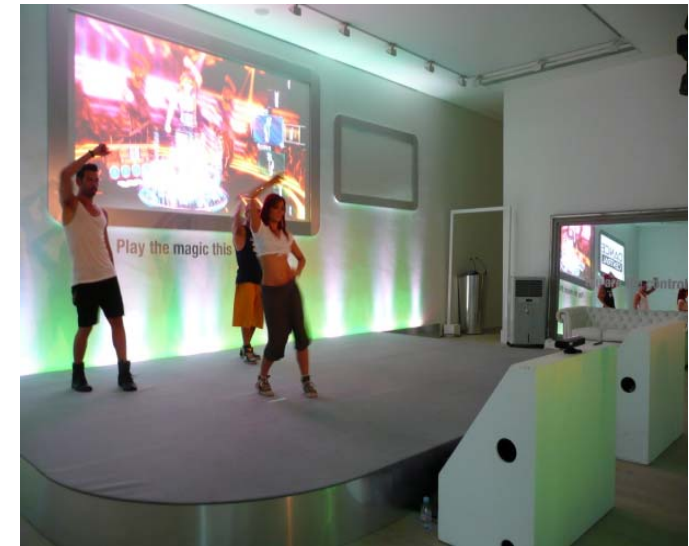
- Images: Color or Grayscale
- Camera: Fixed or movable



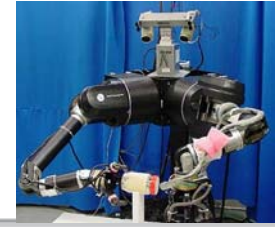
# Computer Vision – Industry Related



- Computer Vision is an **exciting new research area** that studies how to make computers efficiently **perceive, process,** and **understand** visual data such as images and videos. The ultimate goal is for computers to emulate the **striking perceptual capability of human eyes and brains**, or even to **surpass and assist** the human in certain ways. – *Microsoft Research*

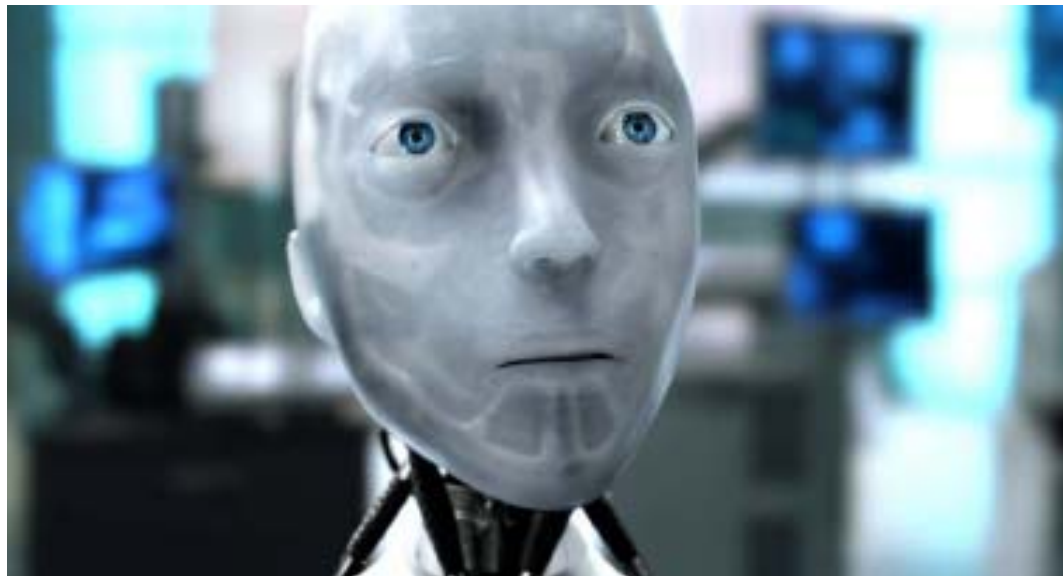


# Computer Vision

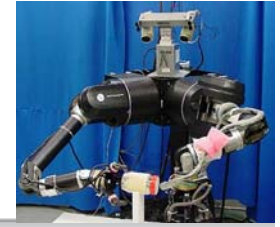


At least three goals:

1. Understand biological visual systems
2. ***Build machines that see***
3. Understand fundamental processes of seeing



# Computer Vision

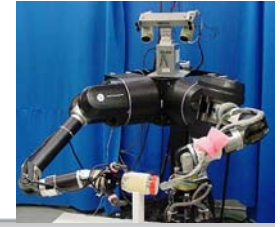


We still do not know:

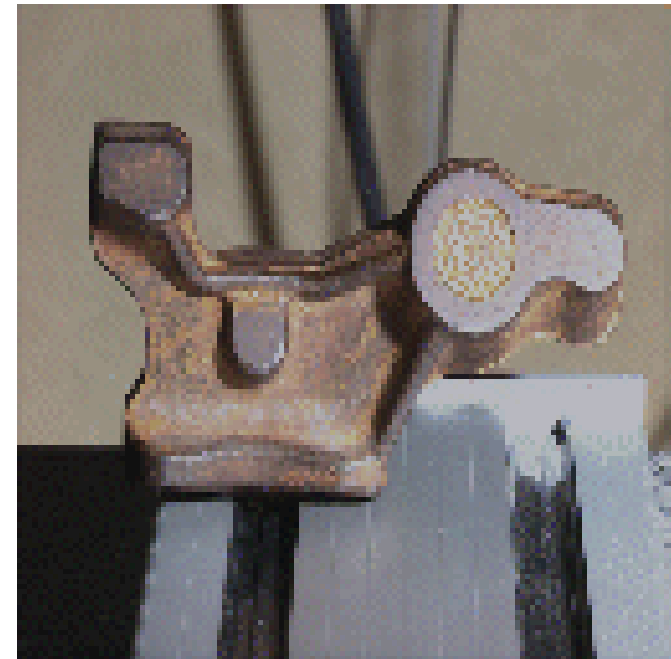
- Is vision a well organized process with fundamental principles or
- A bag of tricks?



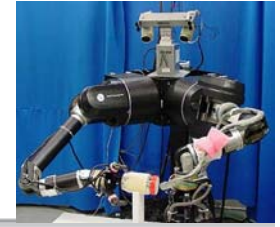
# Goals and Applications of Computer Vision



- It is *not the goal* of Computer Vision to develop a *robot* that is *similar to humans* [Whitney86]
- Goal is to *surpass and assist humans*
- Applications:
  - Automation (Assembly line)
  - Inspection (Measuring of Parts)
  - Remote Sensing (Maps)
  - Human - Computer Interfaces
  - Systems for Disabled
  - Many more.....



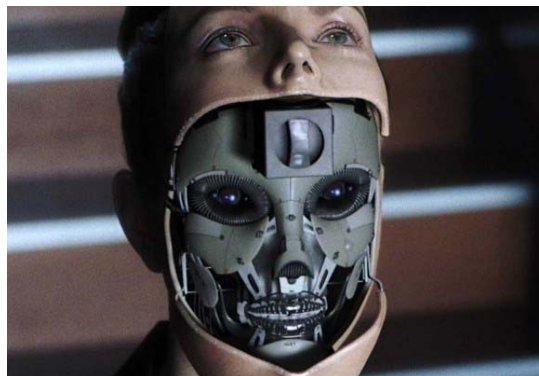
# Computer Vision vs. Human Vision



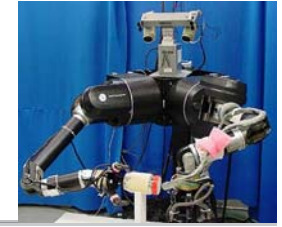
- Why not **simply copy human vision** researched by neurophysiologists, psychologists, and psychophysics?



- Eye** research is **finished** – **Human Vision** research is **not**!
- Seeing is **not only a process within the eye** – eye is only **producing images** formed to “impressions” by the brain
- => **Beginning** of Computer Vision in the area of **Artificial Intelligence**

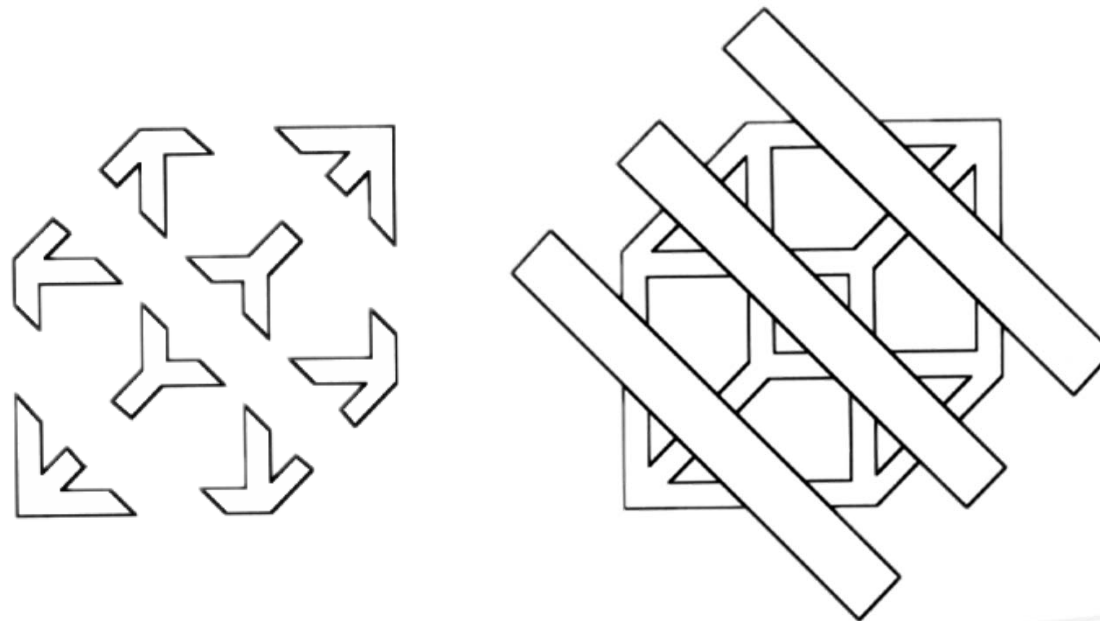


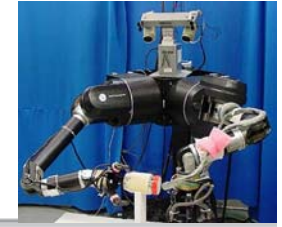




# Computer Vision vs. Seeing

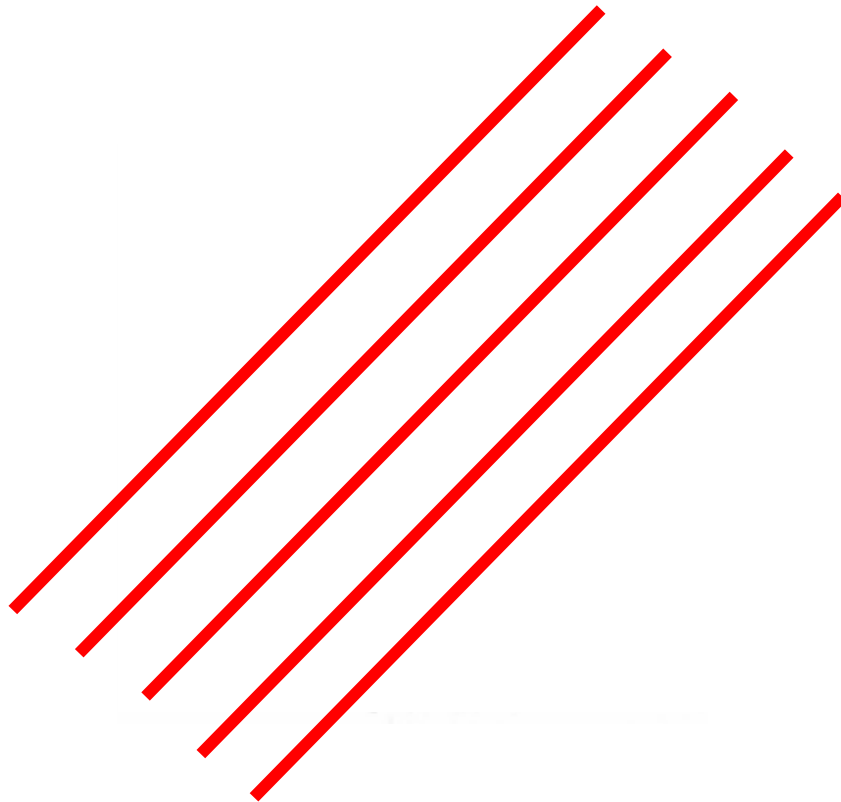
- Seeing has adapted itself to environment and therefore not faultless!
- Is Seeing an integral part of intelligence?
- Do we see reality – or what we want to see?
- **Is Seeing and Thinking separable?**



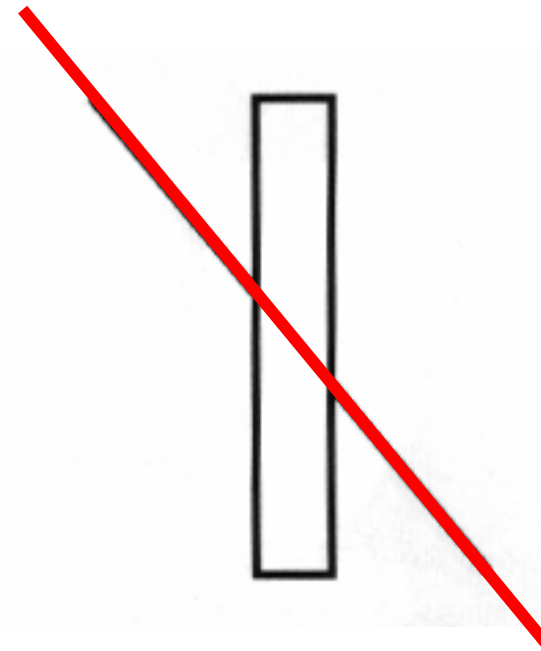


# It's Just An Illusion: Visual Illusions

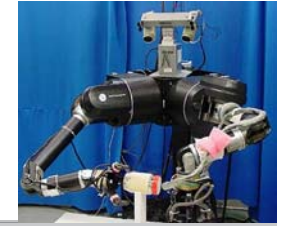
- Classical optical illusions



Zöllner Illusion (1860)

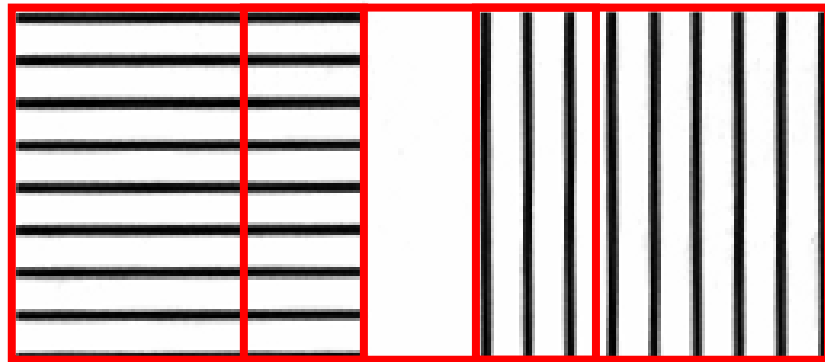


Poggendorf Illusion (1860)

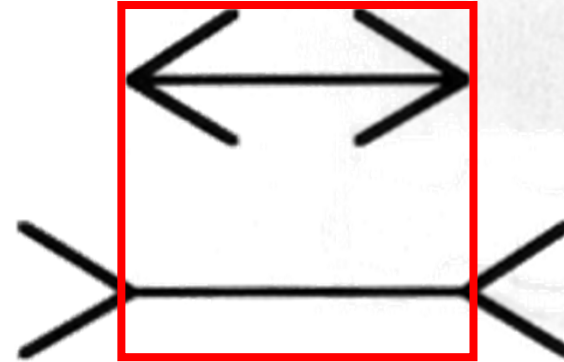


# Visual Illusions

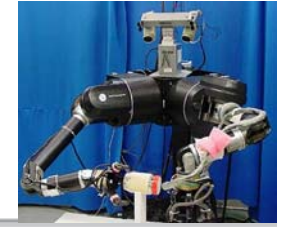
- Classical optical illusions



Helmholtz Squares (1866)

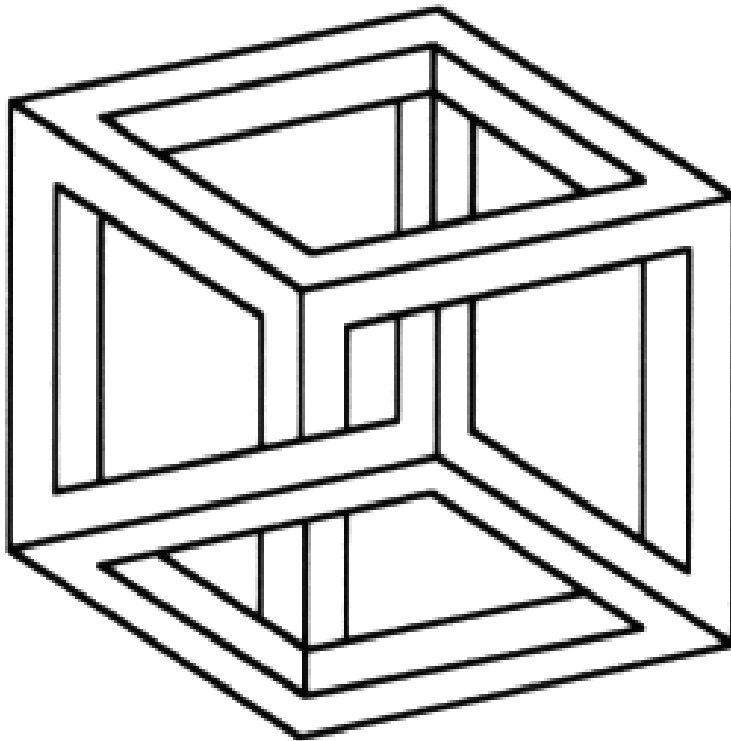


Müller-Lyer Illusion (1860)

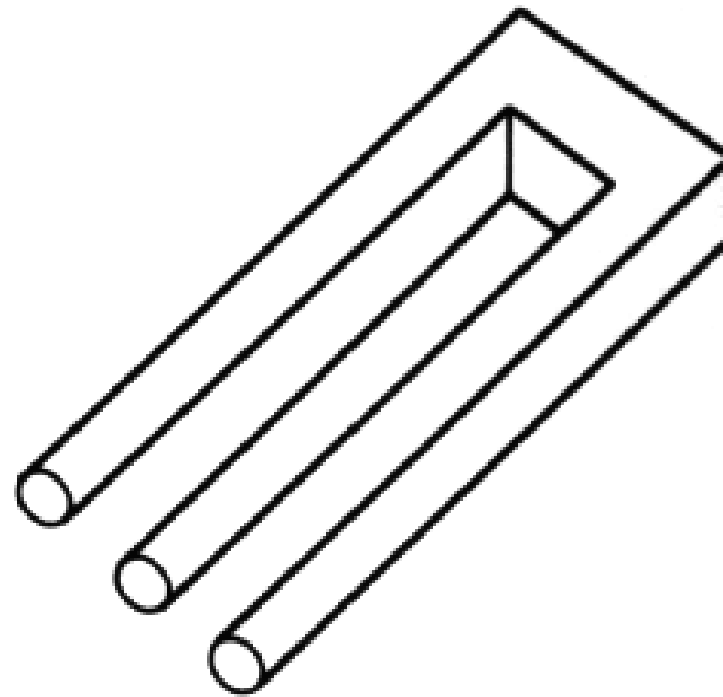


# Visual Illusions

- Non existing 3D objects:

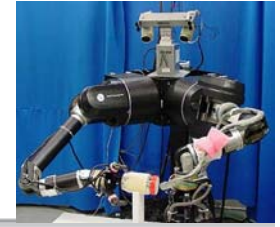


Escher Cube



Two-Pronged Trident

# Perspective Illusions by Julian Beever



- <http://www.julianbeever.net/>

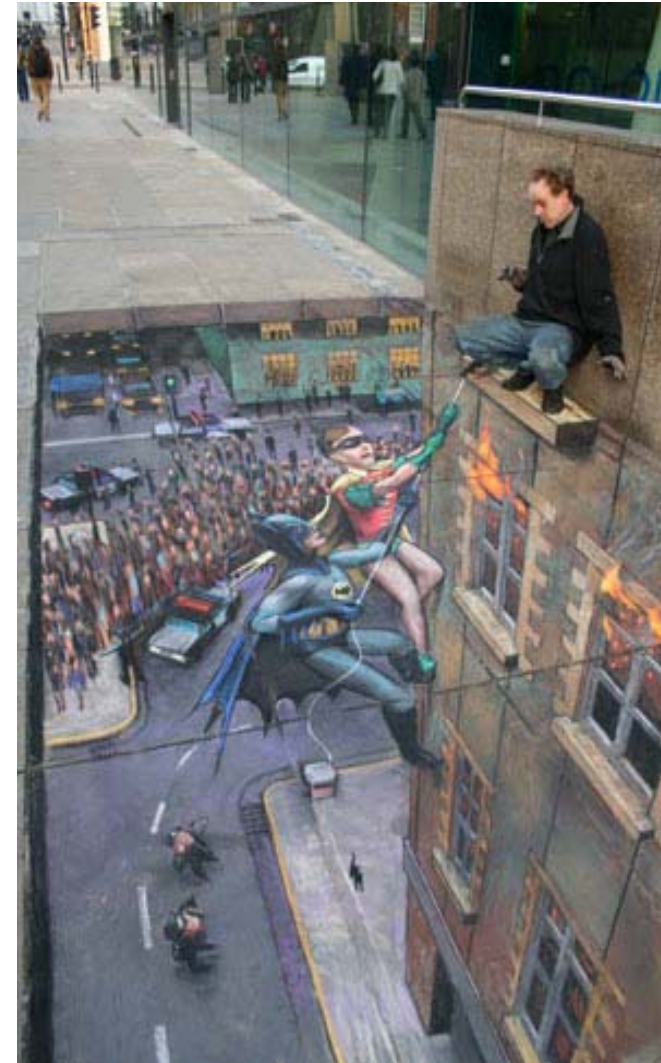
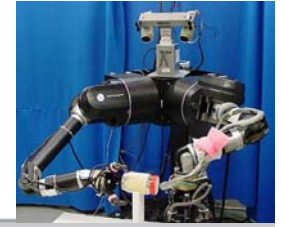


***Babyfood...***



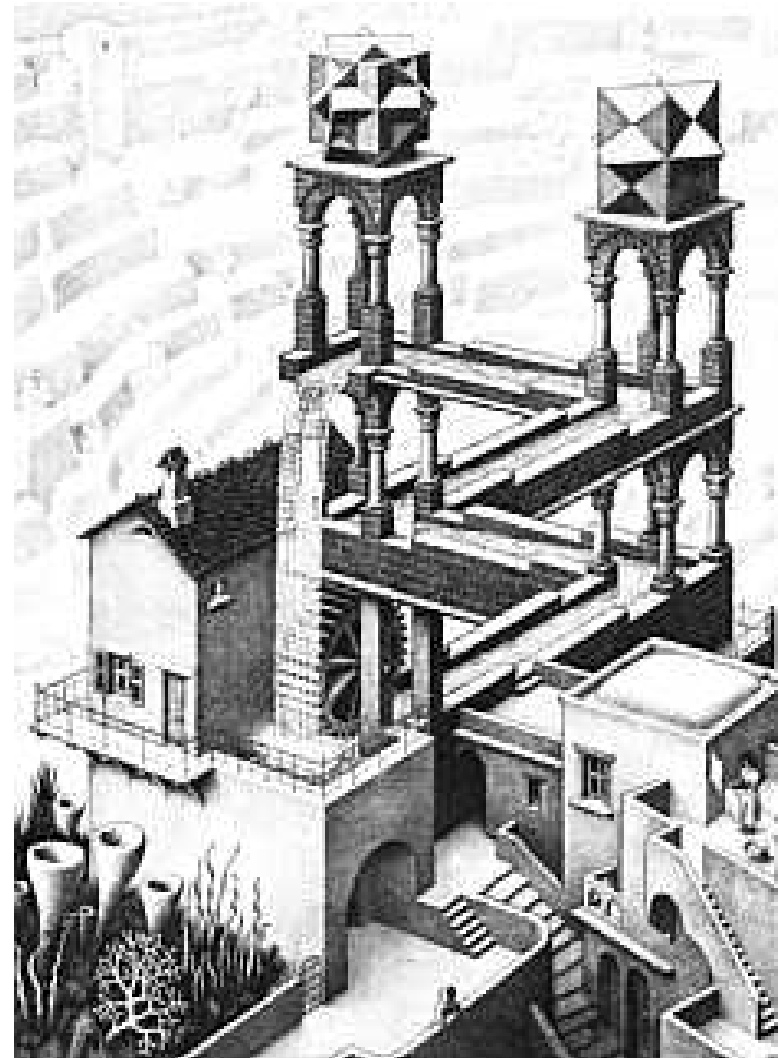
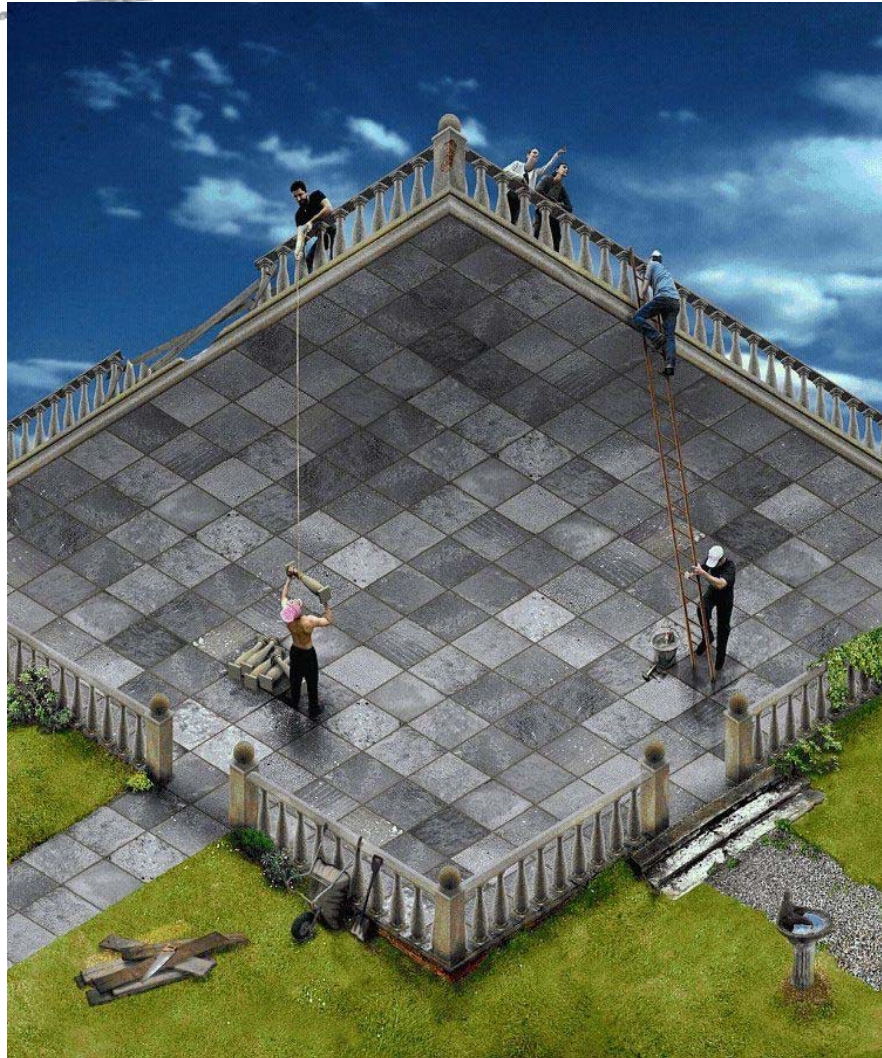
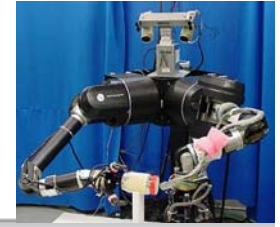
***Make Poverty History***



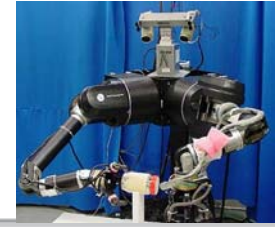




# M.C. Escher



# Ambiguous Interpretations

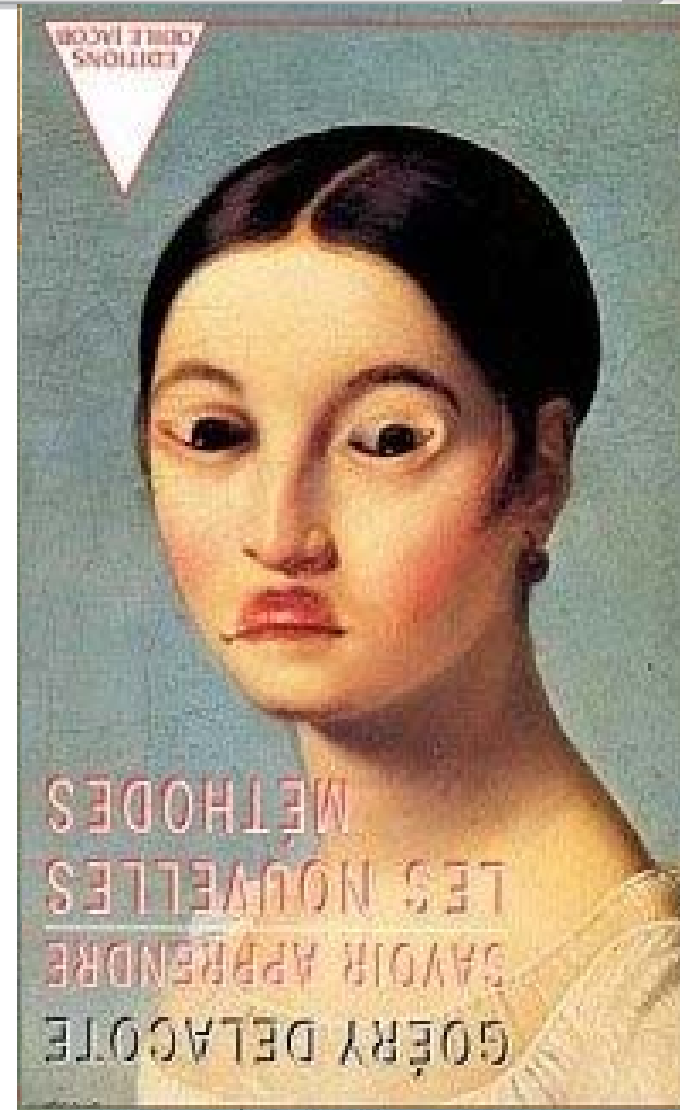
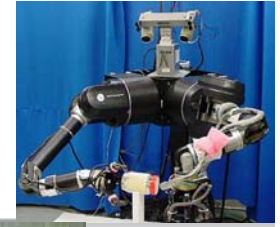


Amerindian vs. Inuit



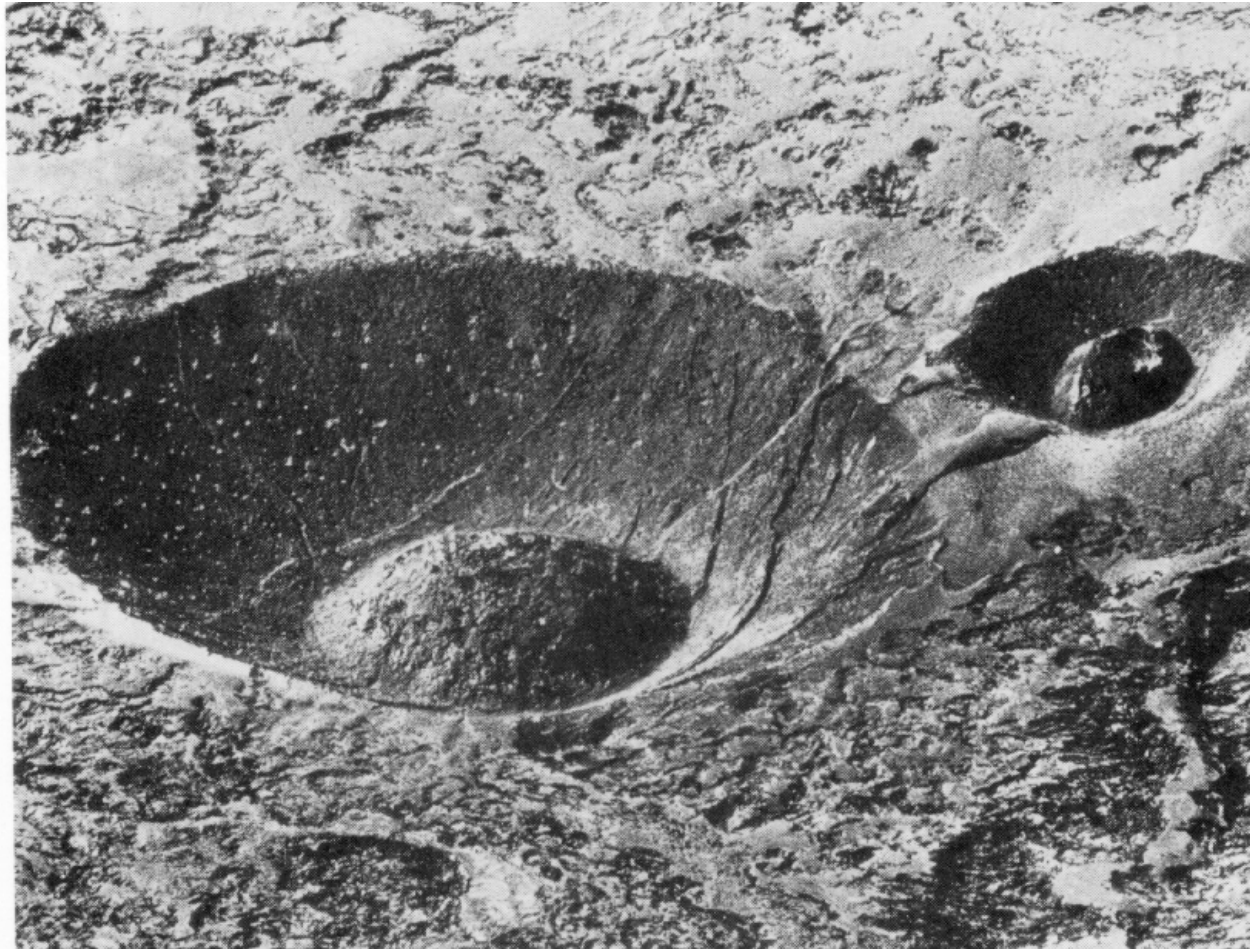
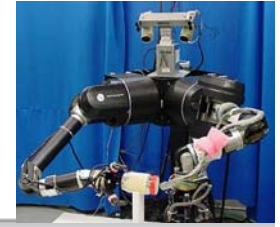
Young/Old Lady

# Rotary Effects



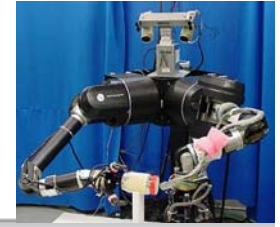


Are these phenomena caused by manipulation of the visual system by unreal images?

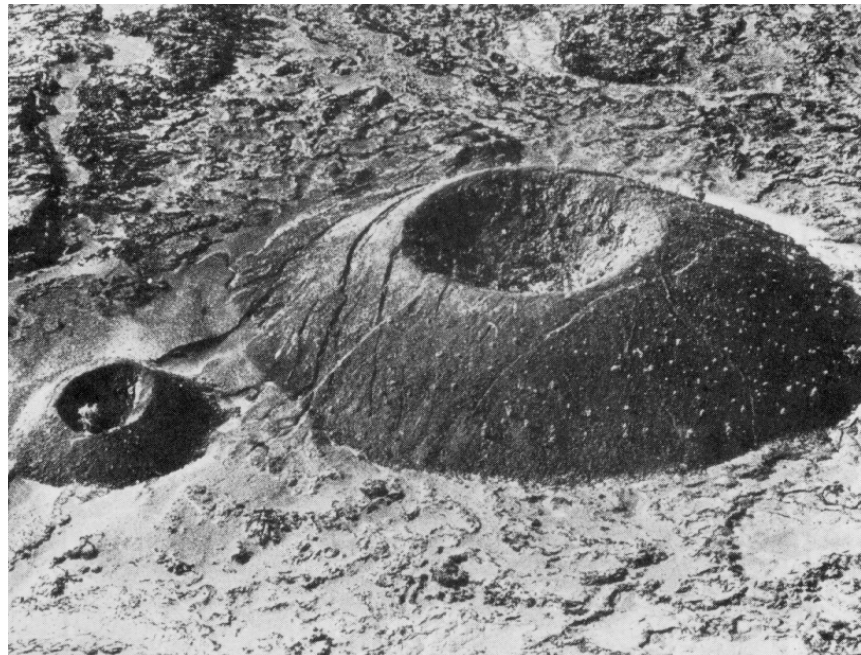


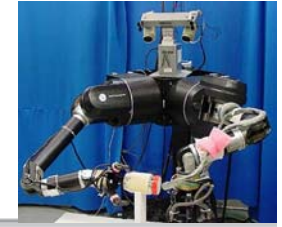


# Are these Phenomena caused by Manipulation of the Visual System by Unreal Images?



Every image is an **image of an object**, which is understandable only to those who **know about its origins** and are able to **create a corresponding image in their imagination** (Helmholtz, 1910)





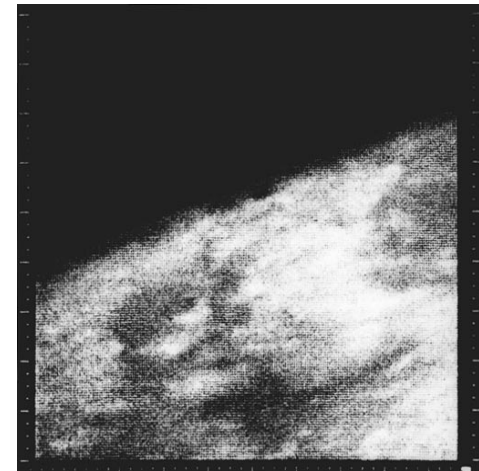
# History

- Serious attempts to create computer vision systems have now a history of 40-50 years.
- First digital image 1964 (Mariner 4)
- Focus on Sensors → Digital Image Processing
- Analysis Focus → **Computer Vision**

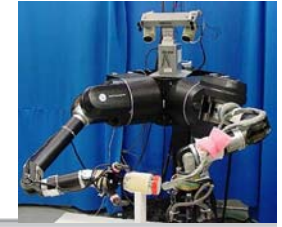


Source: NASA

**Mariner 4:** First the first close-up image ever taken of Mars 1964



Source: NASA

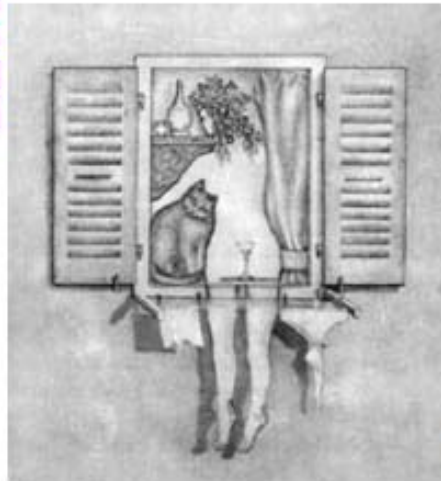


# Computer Vision

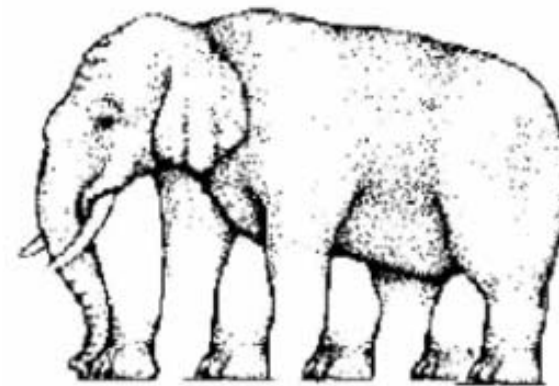
The systems today are still exceedingly limited in their performance → **considerable room for improvement**



Where are chairs?

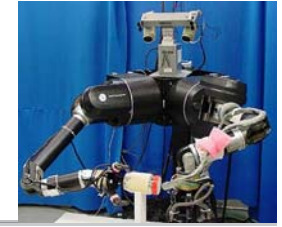


Two interpretations?



How many feet?





# Future Challenges of Computer Vision

- Where do the innovations come from?

- 1. Hardware



Wavi Xtion



Kinect



- 2. Algorithms/Software



GigaPan

Microsoft

Research

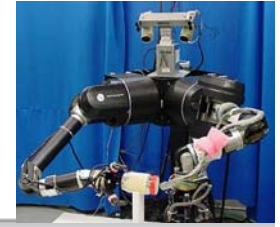


<http://www.gigapixel.com>

CLAUSS



# Hardware

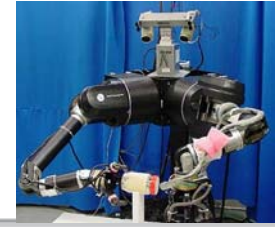


- **First time that HW is no longer a real limitation !!**

- Processing
- Image Resolution
- Storage
- Internet
- Mobile Devices
- Networks of cameras

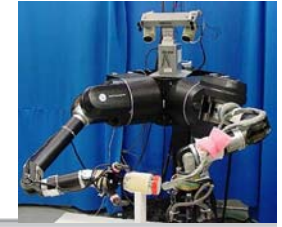


# Processing



- Moore's Law still holds!
- Multi-core CPUs
- Highly Parallel → GPUs (+ Software eg. Cuda)

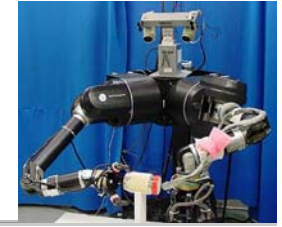




# Processing

- What to expect:
  - Image Processing (Feature Extraction) will be instantaneous
  - Real-time Libs: Basic algorithms (IPP, Cuda ...)
  - Real time vision (cf. Real time Rendering)
- Parallelization (GPU implementation) is a feature of an algorithm

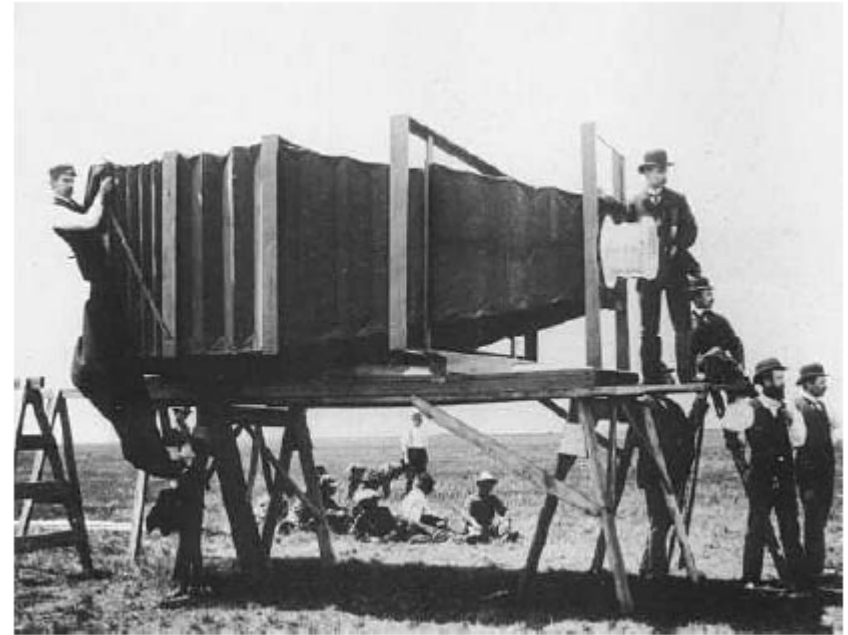




# Resolution

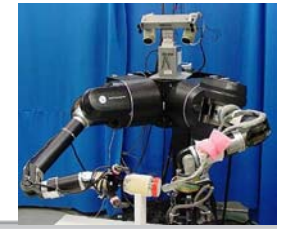
Ever growing resolution:

- 1975:  $100 \times 100 = 0.01$  MP
- 2009:  $13.280 \times 9.184$  Pixel = 120 MP
- 2014: UltraCam Eagle
  - $20,010 \times 13,080 = 260$  MP
  - 842 MB/Image
  - frame rate  $< 1.8$  sec. per frame



1900 Chicago & Alton Railroad Train (photograph a train), \$5000

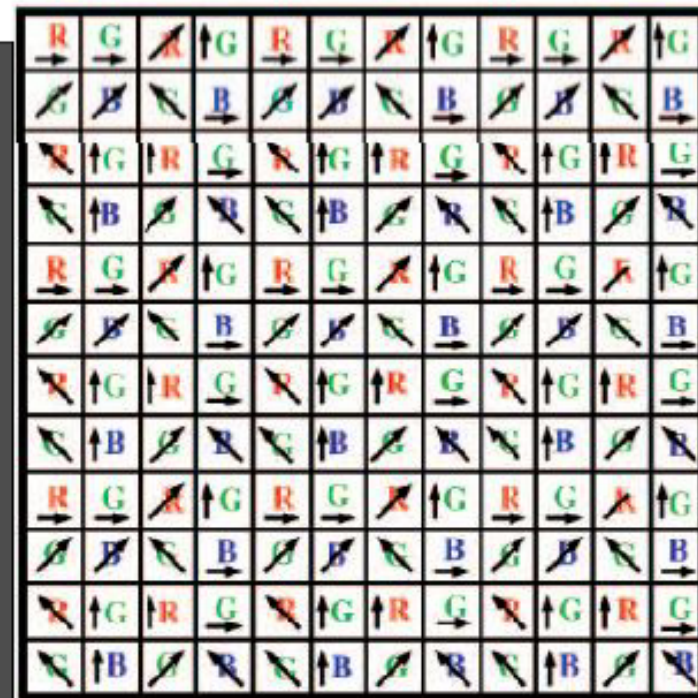




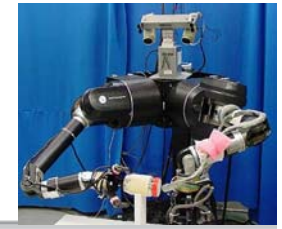
# What can we do with that?

## Assorted Pixels (Nayar)

Intensity-and-color-and-polarization mosaic:





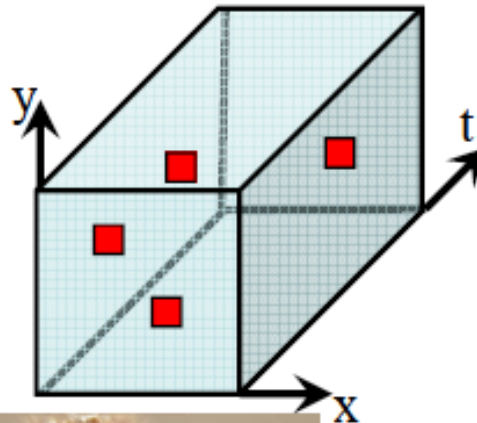


# Some Questions to Tackle

- How/What shall we sample in space, time, wavelengths, polarization, ....?



Hundley: Time Space Mixtures



Agrawala et al.,  
Digital Photomontage



(b)

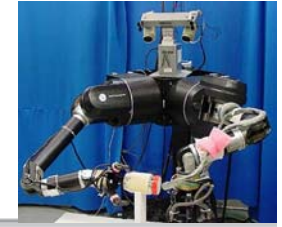


(c)



(d)

Freeman 2003



# Some Questions to Tackle

Optimal sampling strategies in 3D/4D ...

- No constraints of view-points
- Multiple Images → **Redundancy**
- Control the illumination of each pixel

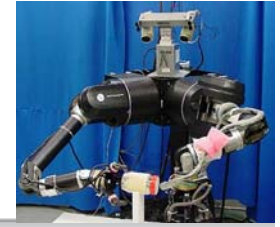


Image Fulgurator,  
Julius Bismarck



- How real are images?

# Storage



- We have huge disks and we fill them
- A color VGA image ~1 MB
- Every 10 second 1 image
  - 8.4 GB a day
  - 240 TB a Life

**HD**



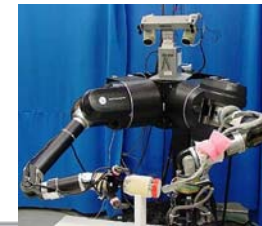
**1280x960 Video**

- Can we index that? → **Algorithms**



Life Logs with  
wearable webcam

# Internet



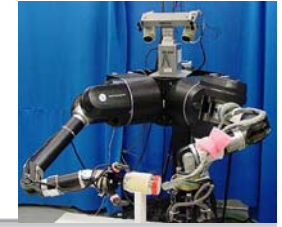
## Huge repository of images

- Flickr:
  - Aug. 2011 ~ 6 Billion Photos On-line
  - 4.5 million photo added per day
- YouTube:
  - 65.000 new Videos a day
  - 1 trillion video [playbacks](#)
  - 20% of Internet Traffic
- Facebook:
  - 600 Million users
  - 3 Billion photos added per month

**What can we do with these images?**

[Source: Internet 2011 in numbers](#)



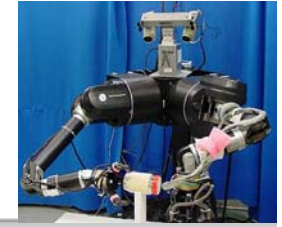


# What is Vision?

- What does it mean, to see? “to know what is where by looking”.
- How to discover from images what is present in the world, where things are, what actions are taking place.

from Marr, 1982





# The Importance of Images

- Some images are more important than others
- 100 million \$



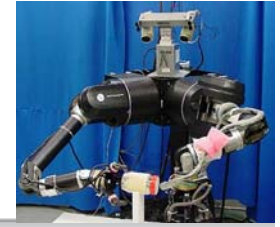
“Dora Maar au Chat”  
Pablo Picasso, 1941

---

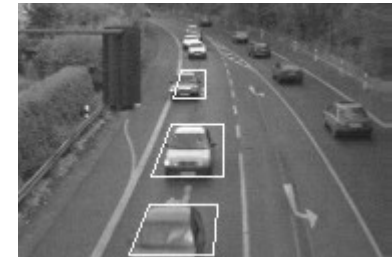
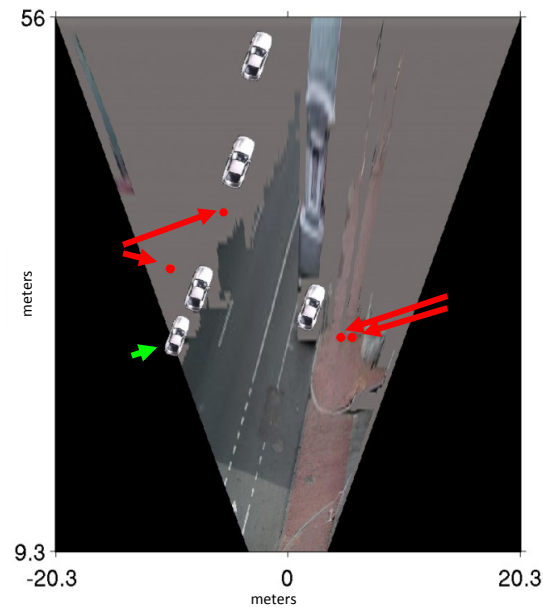
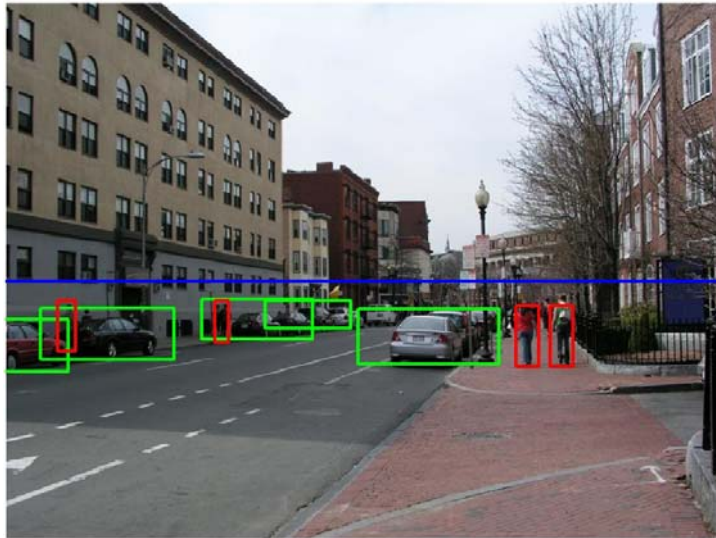
Where is now Computer Vision?  
(only a few examples)

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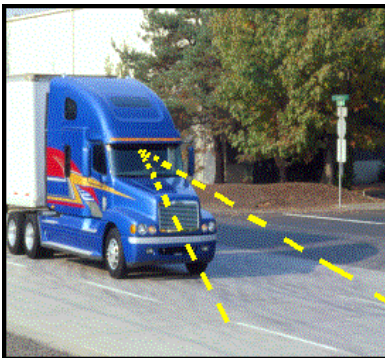
# Assisted Driving



## Pedestrian and car detection



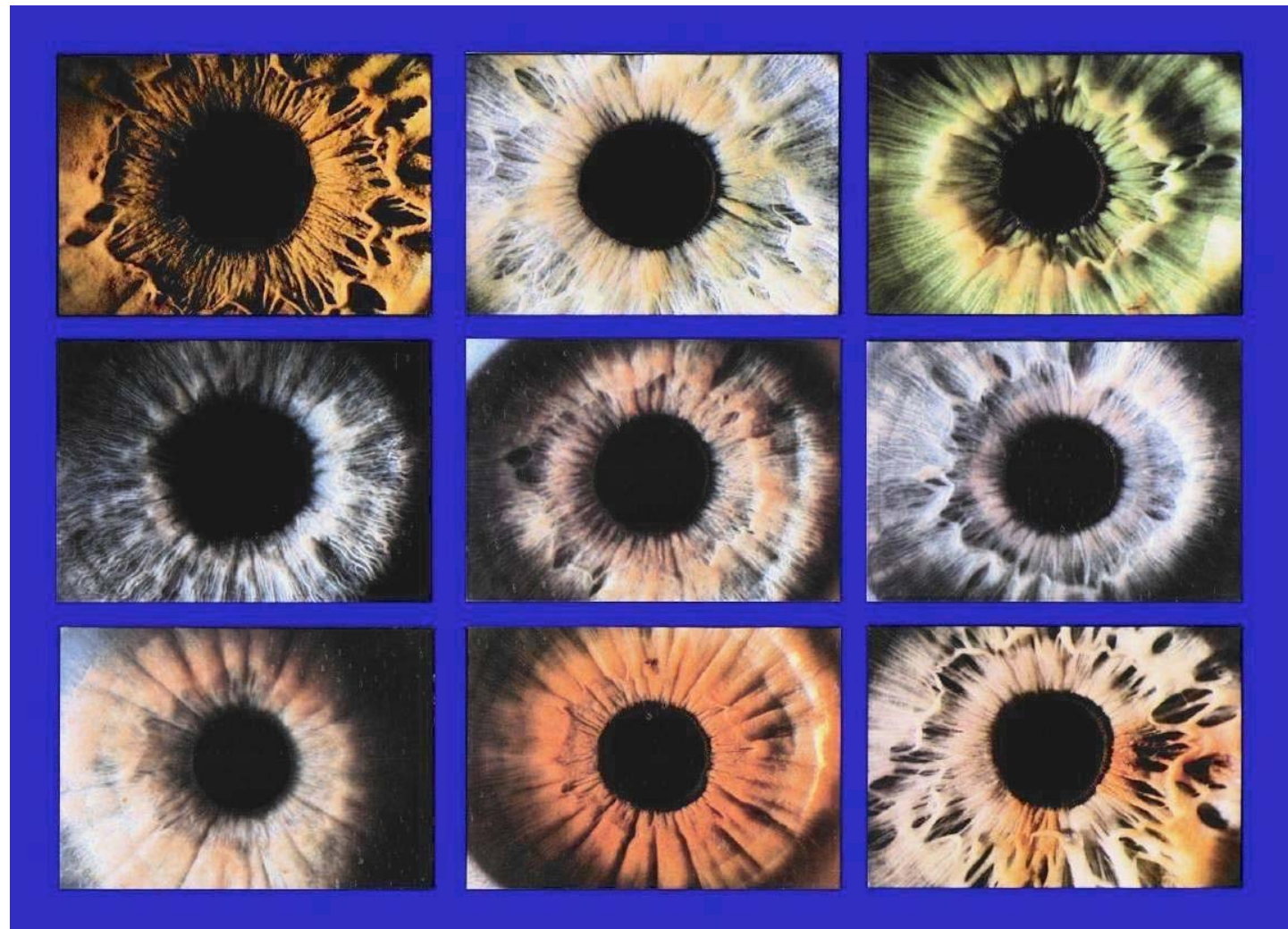
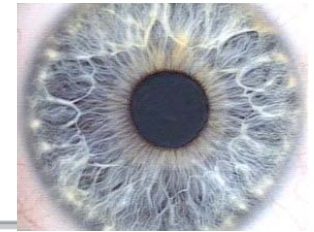
## Lane detection



- Collision warning systems with adaptive cruise control
- Lane departure warning systems
- Rear object detection systems



# Iris Recognition

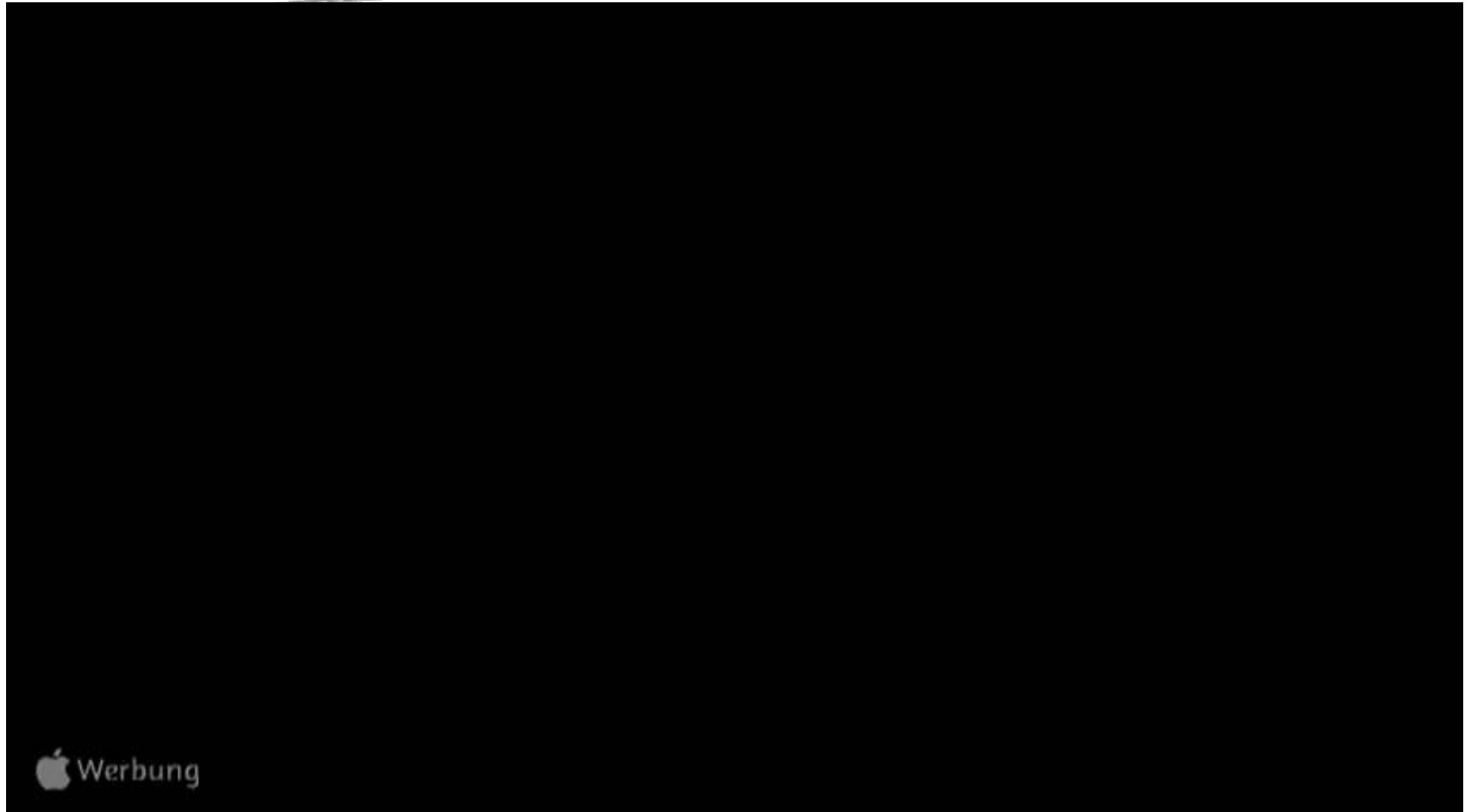
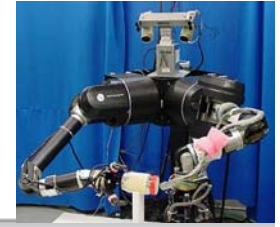


JOHN DAUGMAN

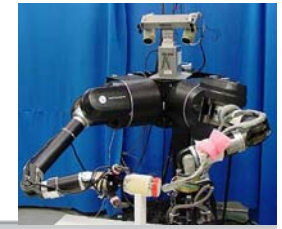
<http://www.cl.cam.ac.uk/~jgd1000/iriscollage.jpg>



# Image Stitching



Apple Werbung



# Image Stitching



(a) Image 1



(b) Image 2



(c) SIFT matches 1



(d) SIFT matches 2



(g) Images aligned according to a homography

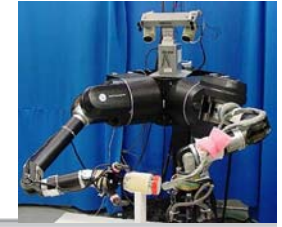


(e) RANSAC inliers 1



(f) RANSAC inliers 2

Brown, Lowe, 2007

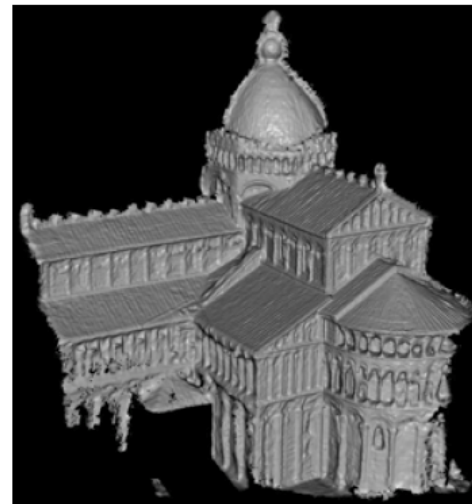


# Photo Tourism

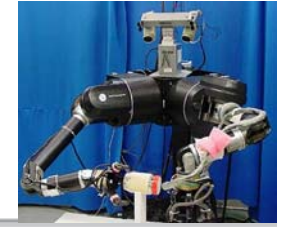
## PhotoSynth



Snavely et al. 2006



(Goesele et al. 2007).



# Finding Paths through the World's Photos

## Finding Paths Through the World's Photos

Noah Snavely  
Rahul Garg  
Steven M. Seitz

*University of Washington*

Richard Szeliski

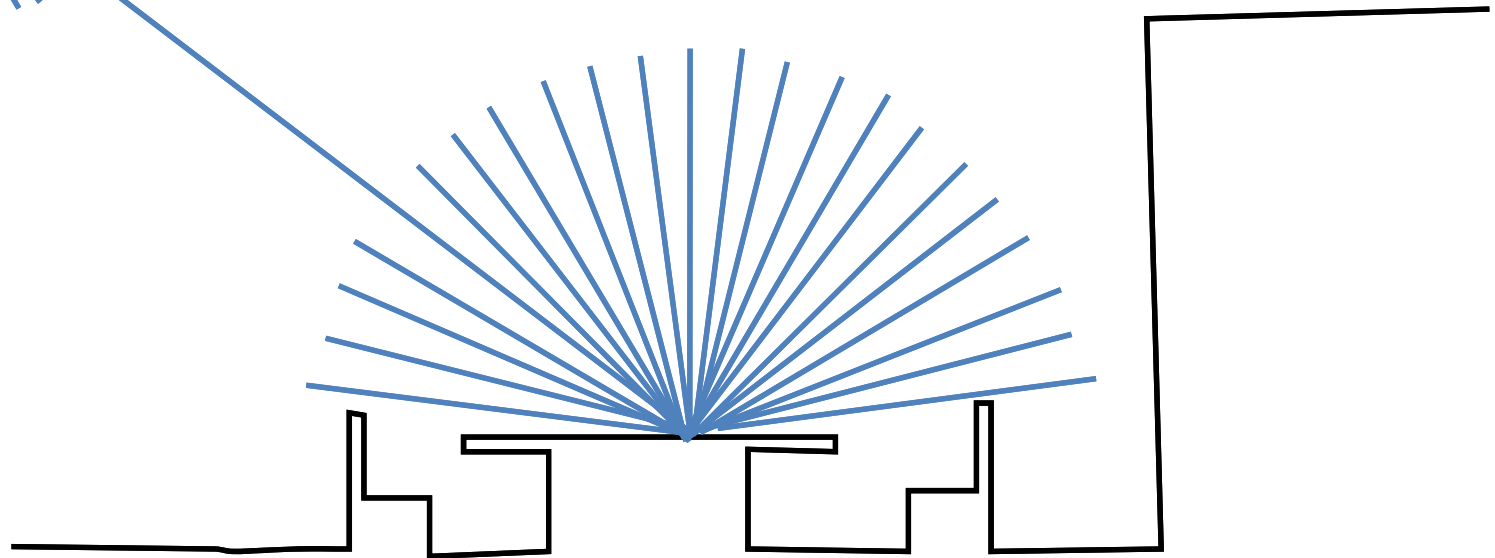
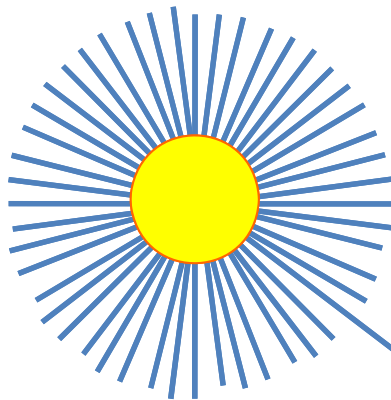
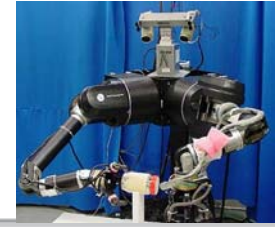
*Microsoft Research*

SIGGRAPH 2008

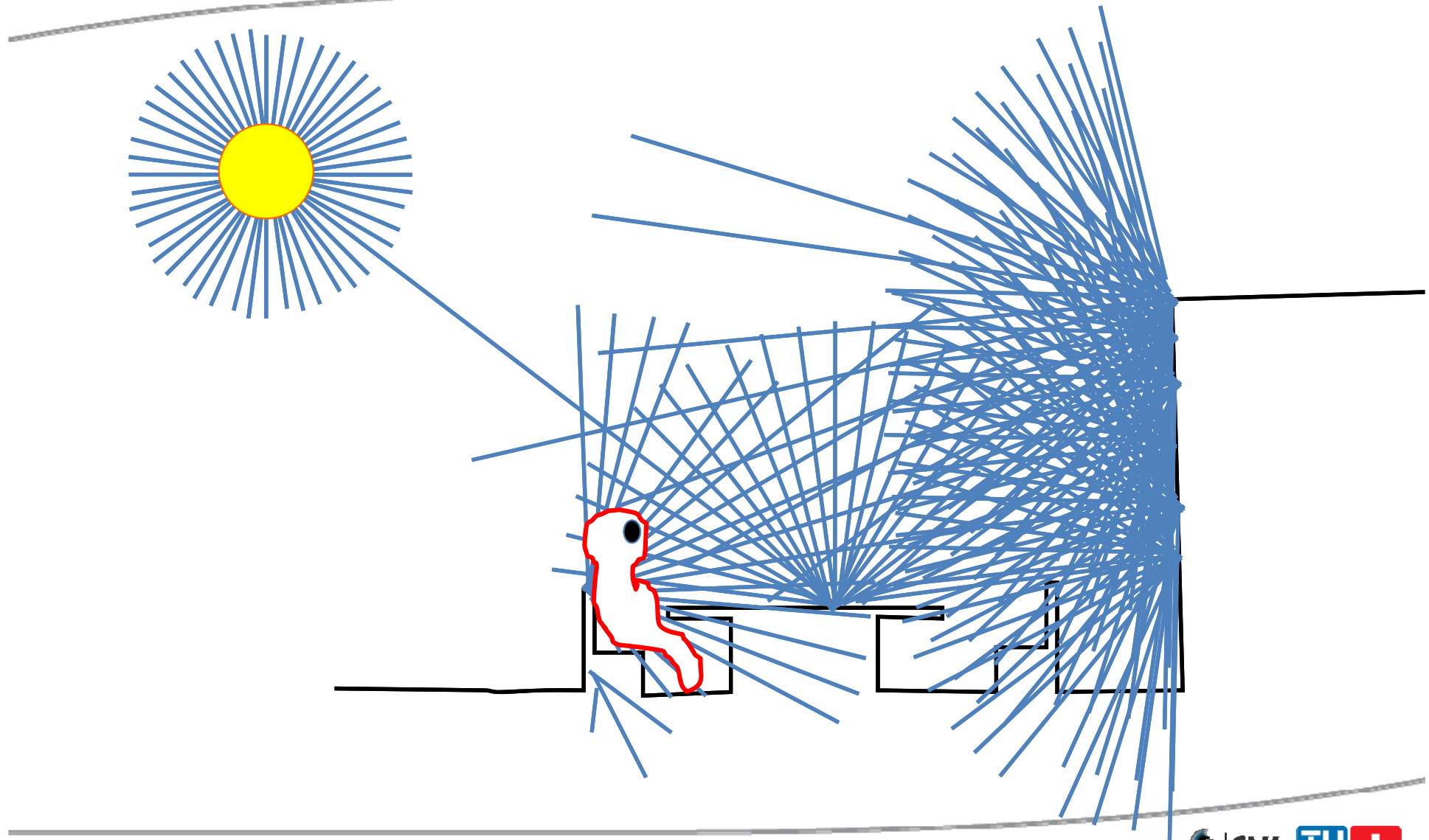
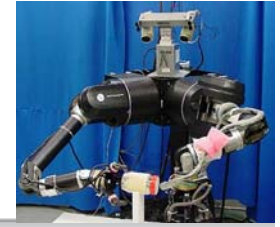


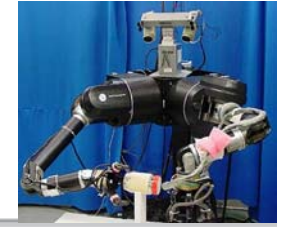
# Why is Vision hard – The Plenoptic Function

# The Structure of Ambient Light



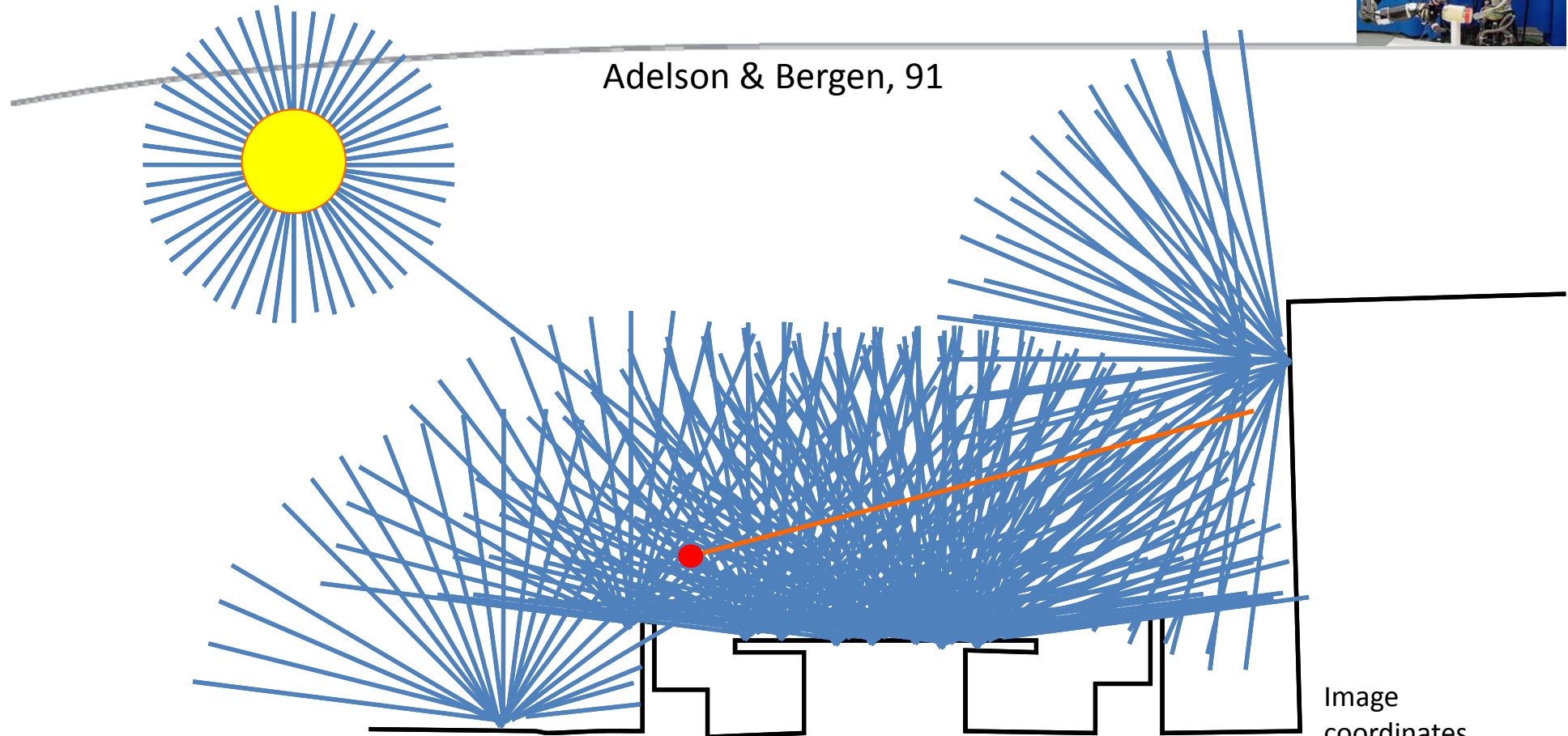
# The Structure of Ambient Light





# The Plenoptic Function

Adelson & Bergen, 91



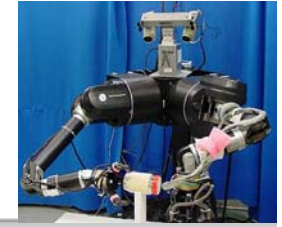
The intensity  $P$  can be parameterized as:

$$P(\theta, \phi, \lambda, t, V_x, V_y, V_z)$$

“The complete set of all convergence points constitutes the permanent possibilities of vision.”

Gibson

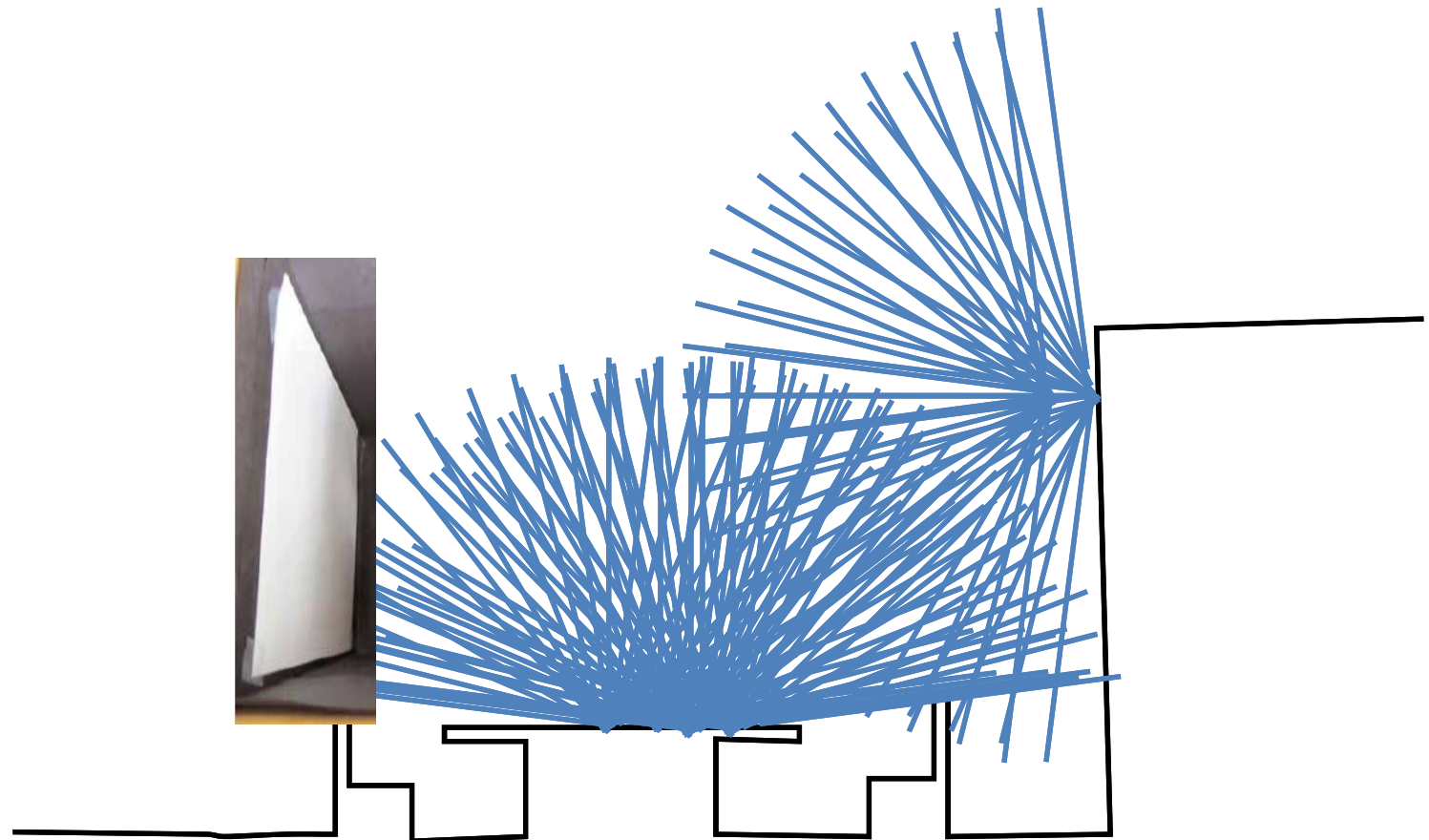
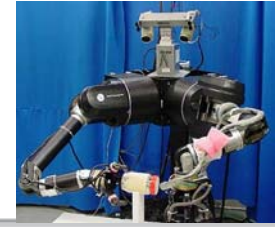




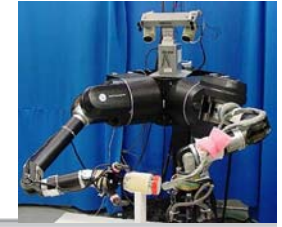
# Measuring the Plenoptic Function

- “The significance of the plenoptic function is this: The world is **made of 3D objects**, but these objects **do not communicate their properties** directly to an observer. Rather, the objects **fill the space** around them with the **pattern of light rays** that constitutes the plenoptic function, and the **observer takes samples** from this function.” Adelson & Bergen 91.

# Measuring the Plenoptic Function

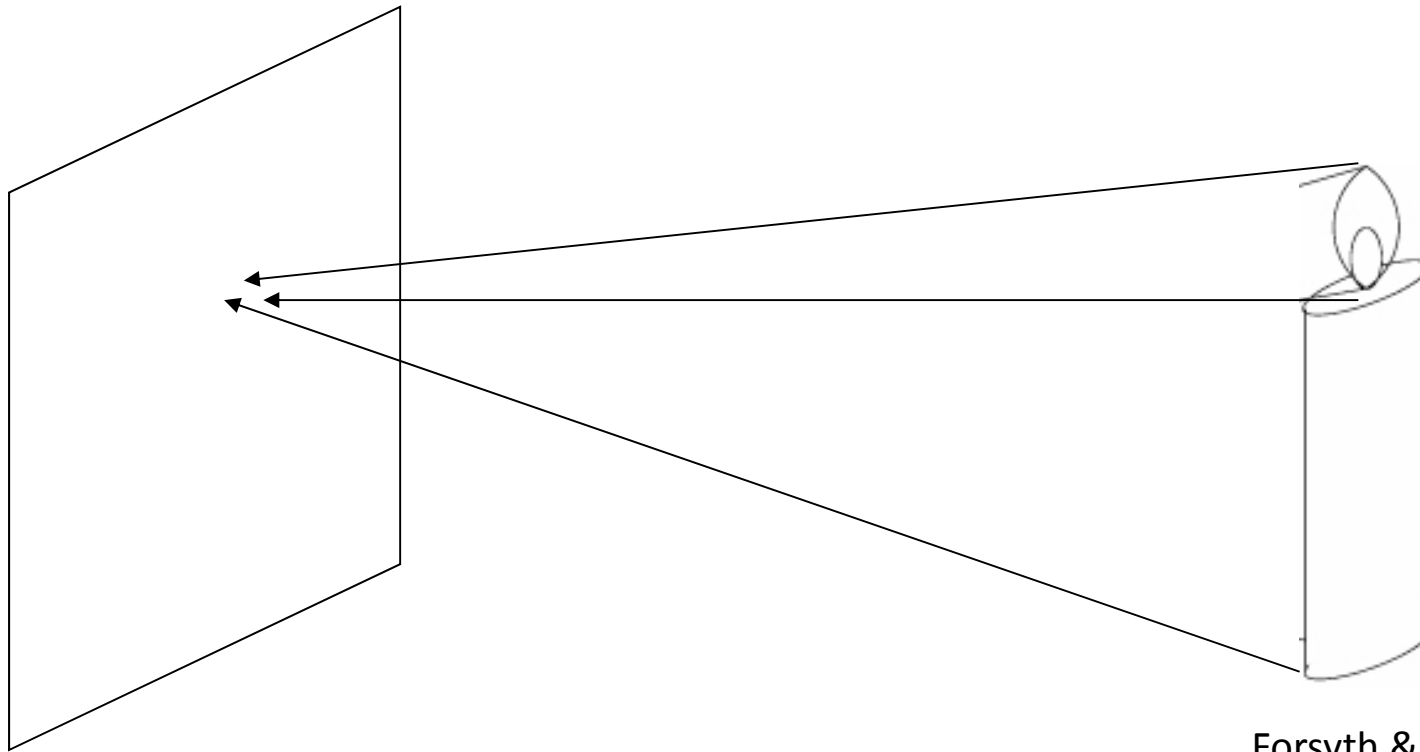


Why is there no picture appearing on the paper?



# Measuring the Plenoptic Function

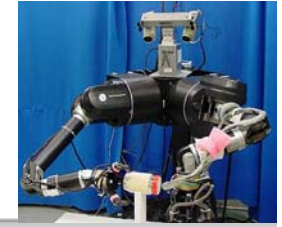
- Light rays from many different parts of the scene strike the same point on the paper.



Forsyth & Ponce

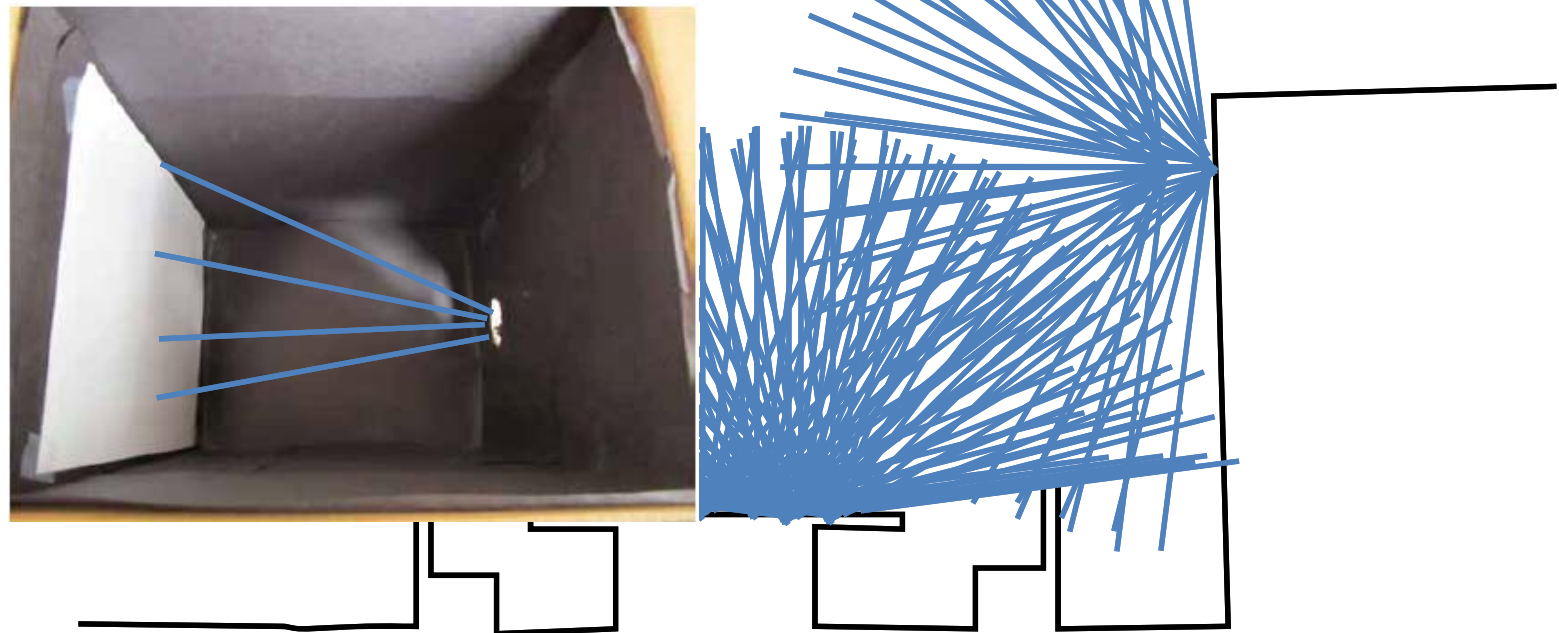
# Camera Obscura





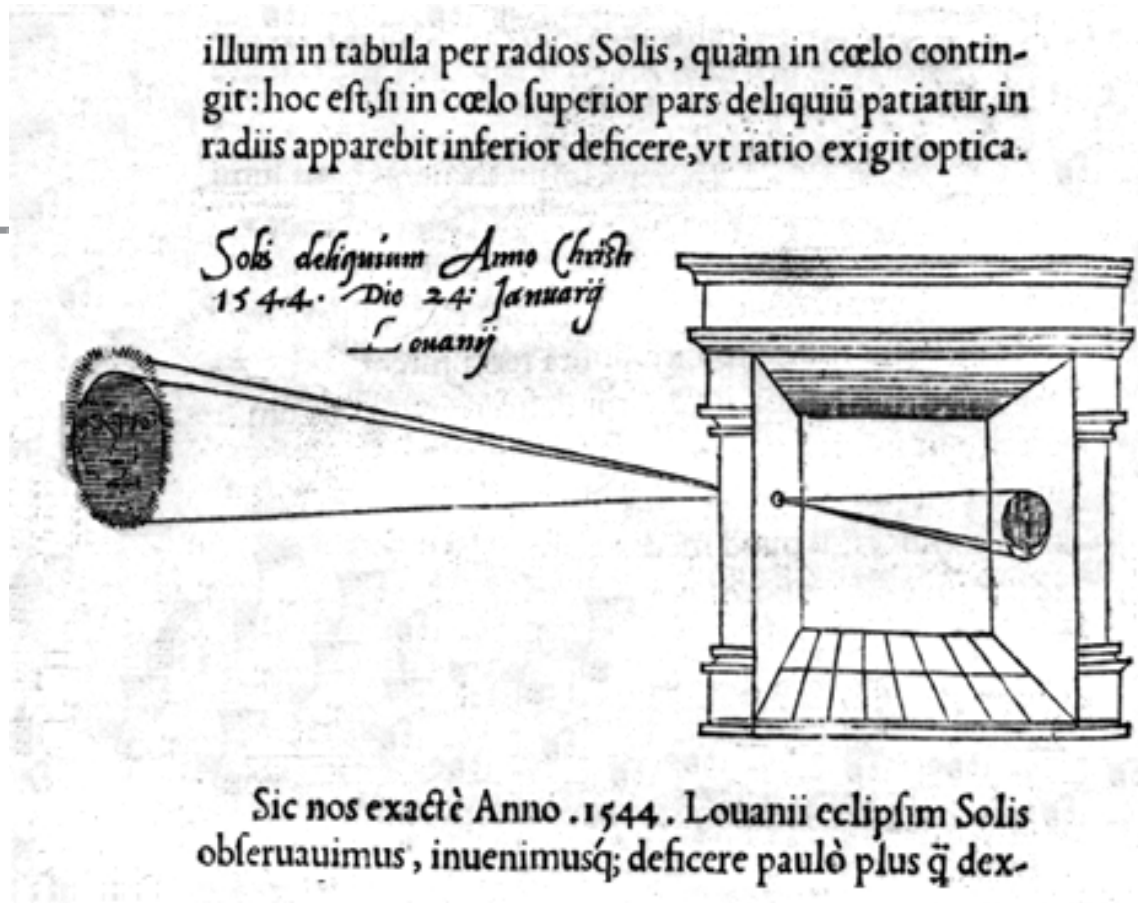
# Measuring the Plenoptic Function

The camera obscura  
The pinhole camera

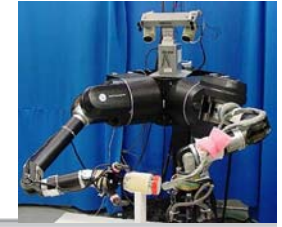


# Camera Obscura

- Latin:
  - Camera for "vaulted chamber/room"
  - obscura for "dark"
  - together "darkened chamber/room"

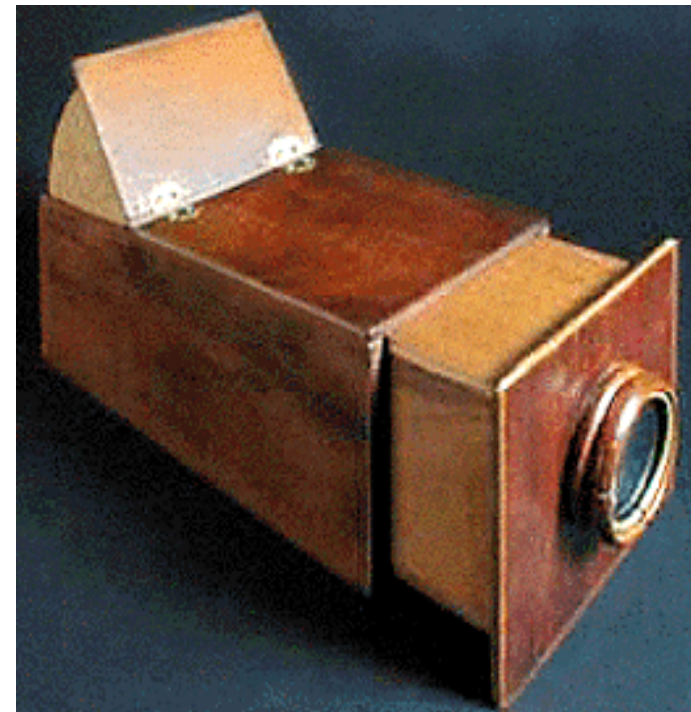
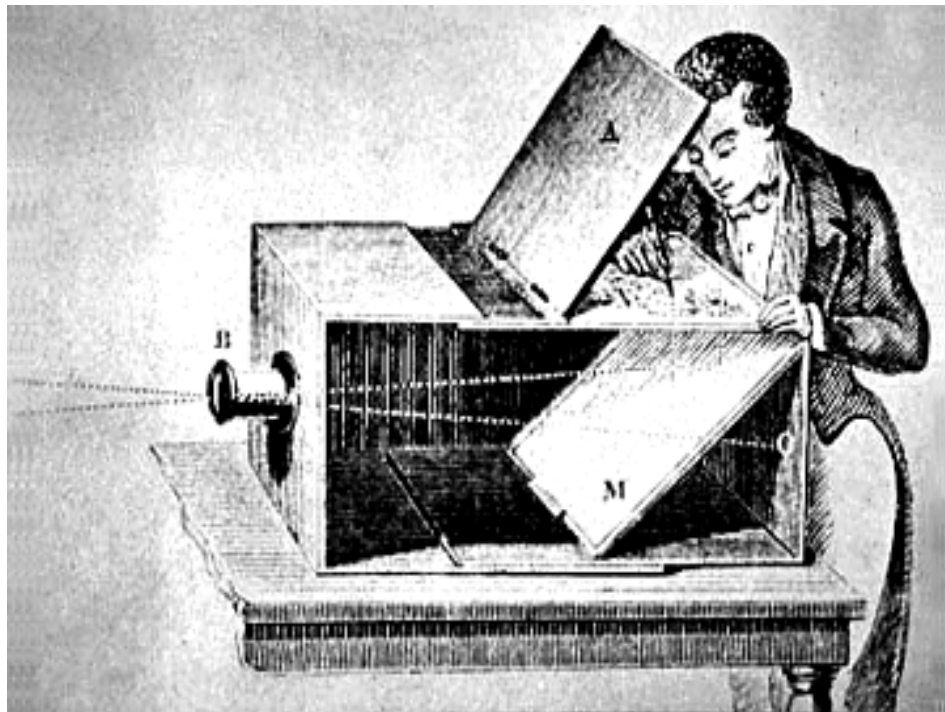


- "When images of illuminated objects ... penetrate through a small hole into a very dark room ... you will see [on the opposite wall] these objects in their proper form and color, reduced in size ... in a reversed position, owing to the intersection of the rays". - Da Vinci  
[http://www.acmi.net.au/AIC/CAMERA\\_OBSCURA.html](http://www.acmi.net.au/AIC/CAMERA_OBSCURA.html) (Russell Naughton)

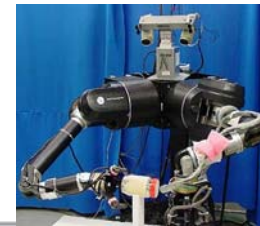


# Camera Obscura

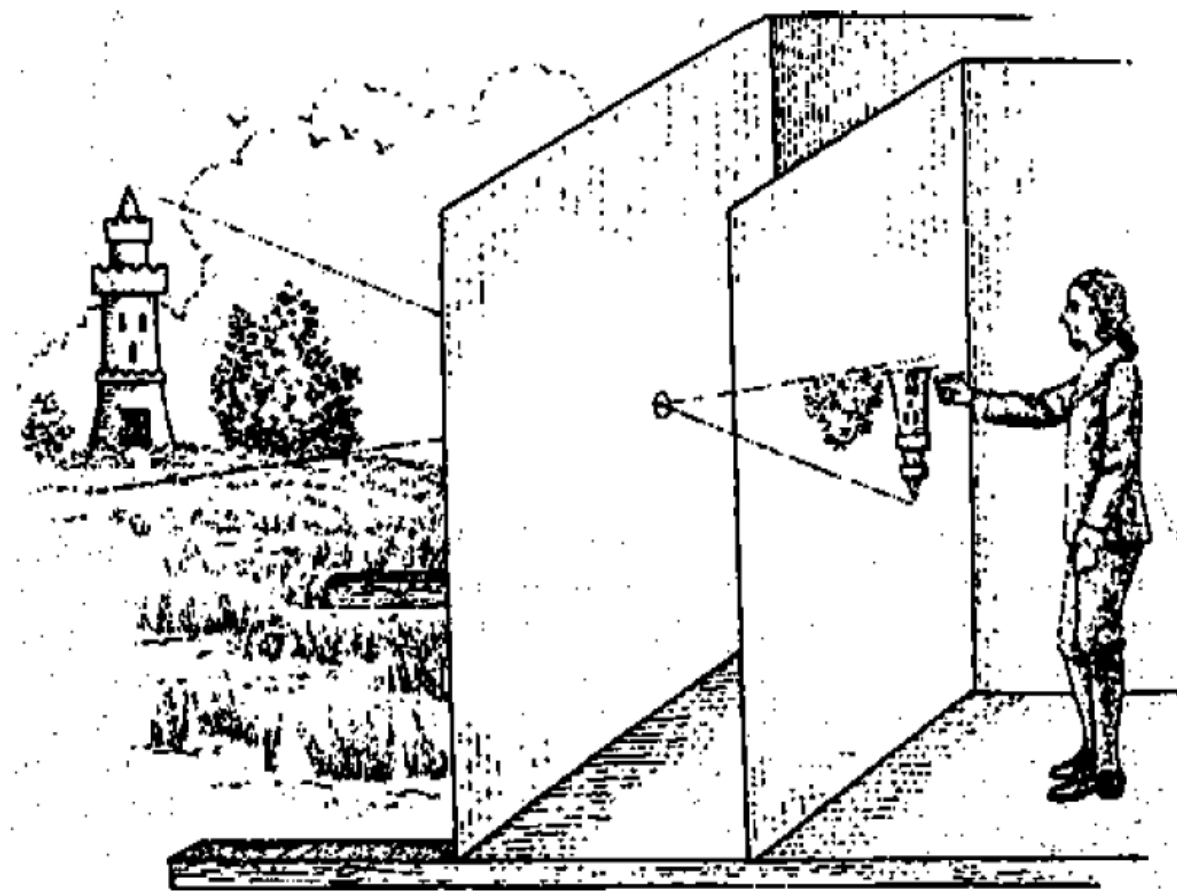
- Used to observe eclipses (eg., Bacon, 1214-1294)
- By artists (eg., Vermeer).



# Camera Obscura



*Drawing from "The Great Art of Light and Shadow"*  
Jesuit Athanasius Kircher, 1646.



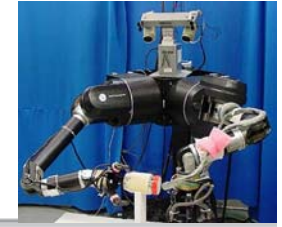


# Camera Obscura



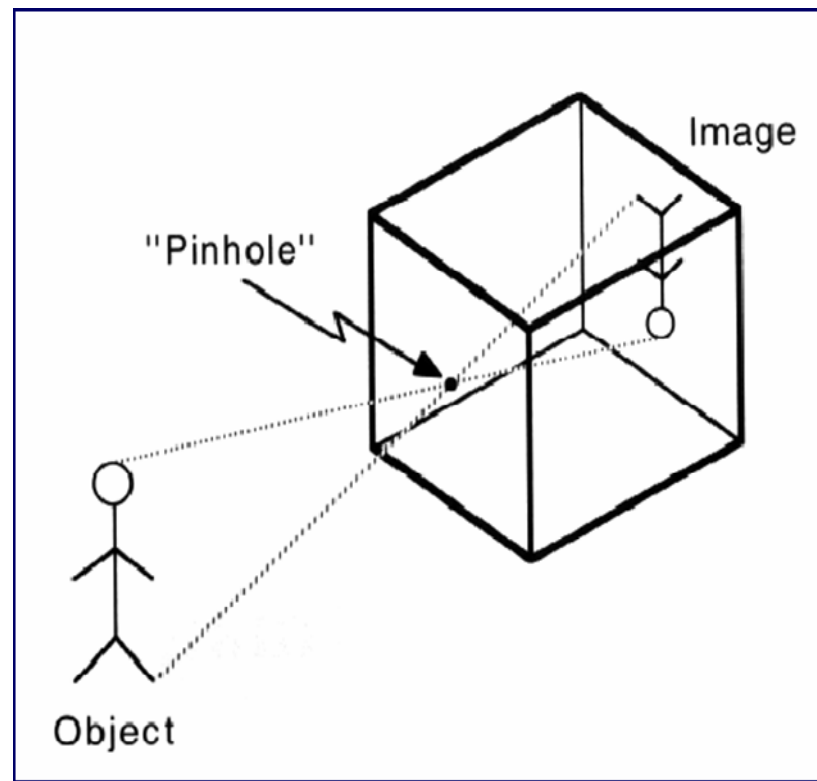
Jetty at Margate England, 1898.

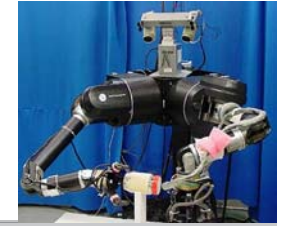




# Pinhole Camera

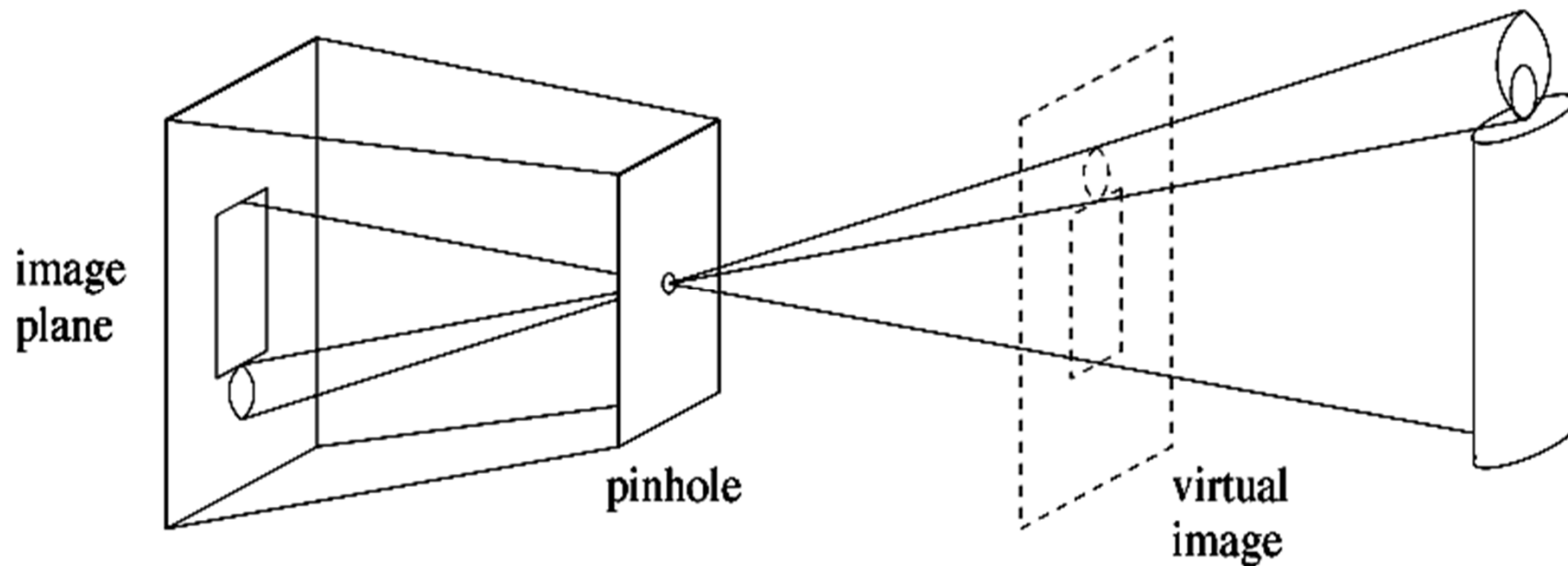
- Simple Model of Camera Obscura: Pinhole camera
  - Very small hole (aperture  $\sim 0$ ), Light passes through the hole and forms image on back (upside down and flipped)





# Pinhole Camera

- Abstract camera model - box with a small hole in it
- Pinhole cameras work in practice

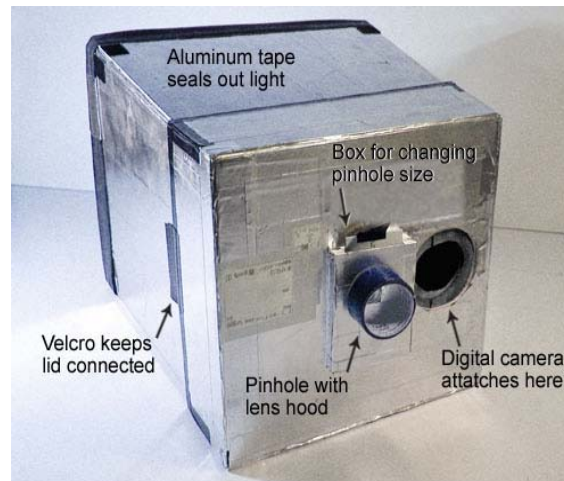
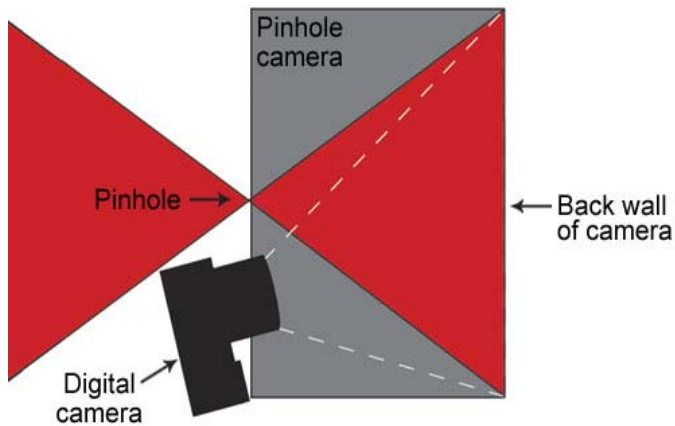




# Commercial Pinhole Cameras

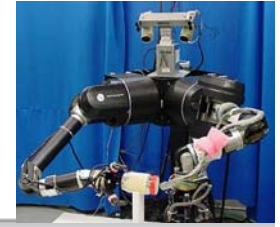


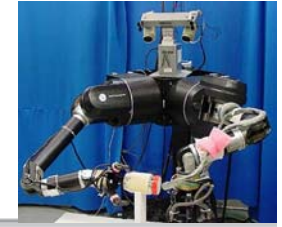
Robert Rigby 5x4 Pinhole Camera





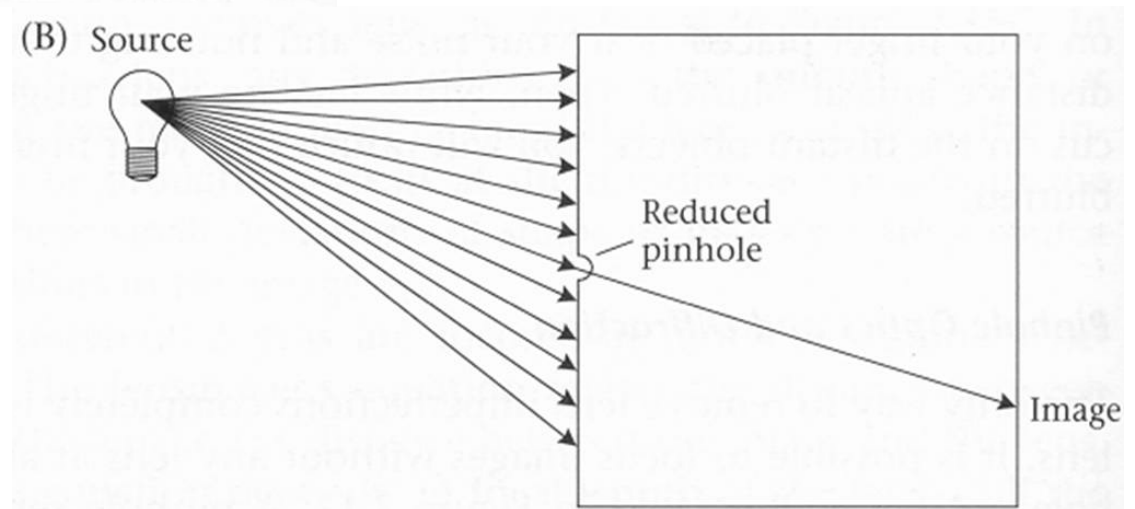
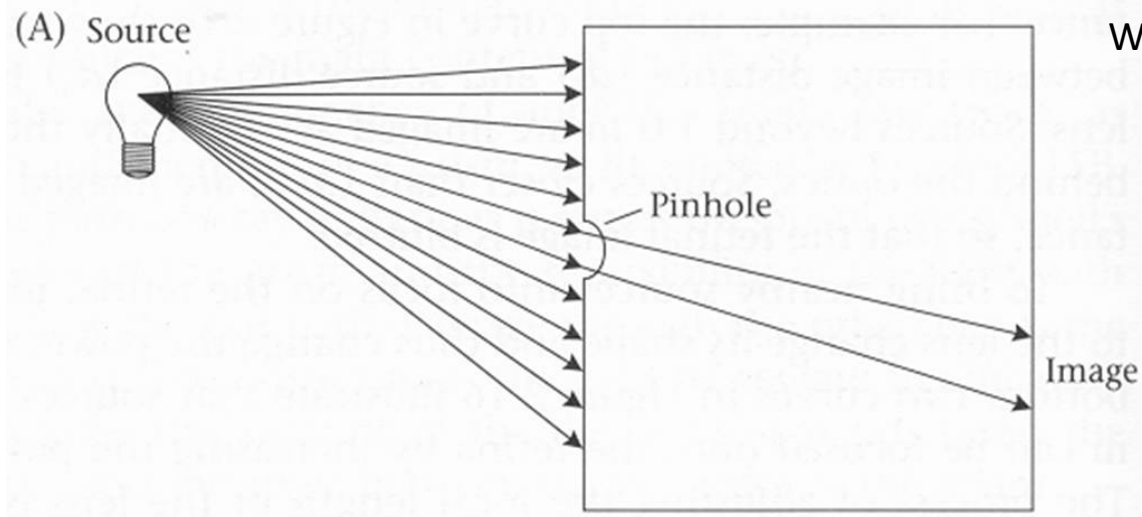
# Playing with Pinholes

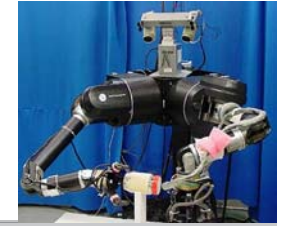




# Effect of Pinhole Size

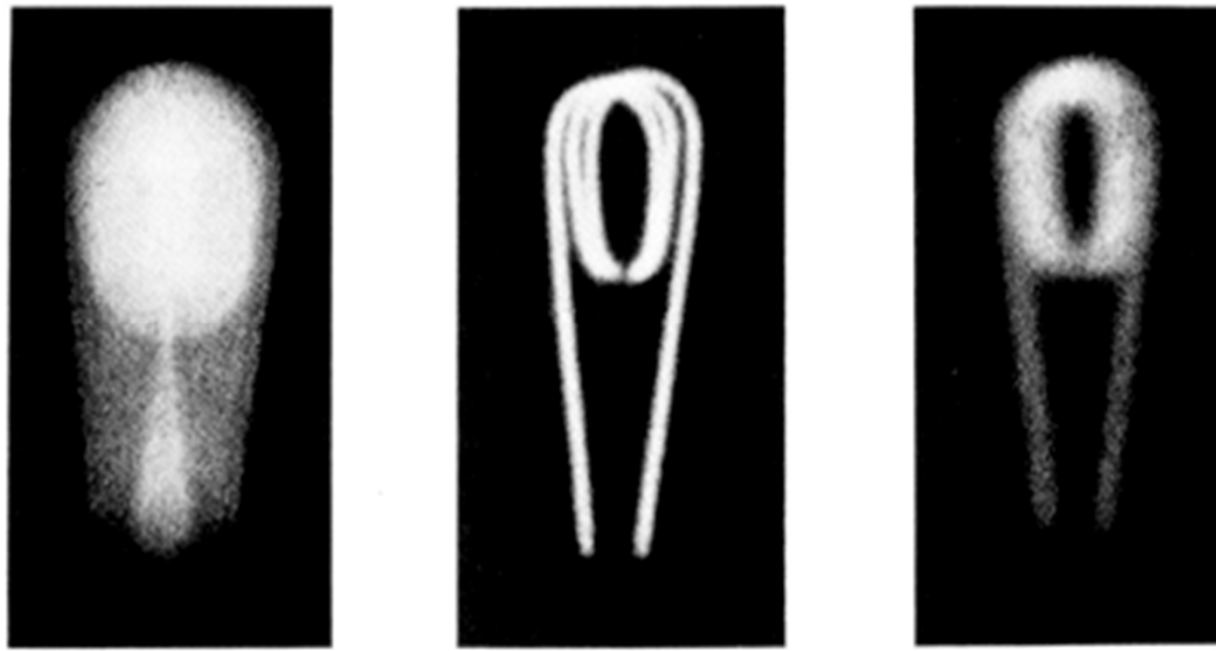
Wandell, Foundations of Vision, Sinauer, 1995





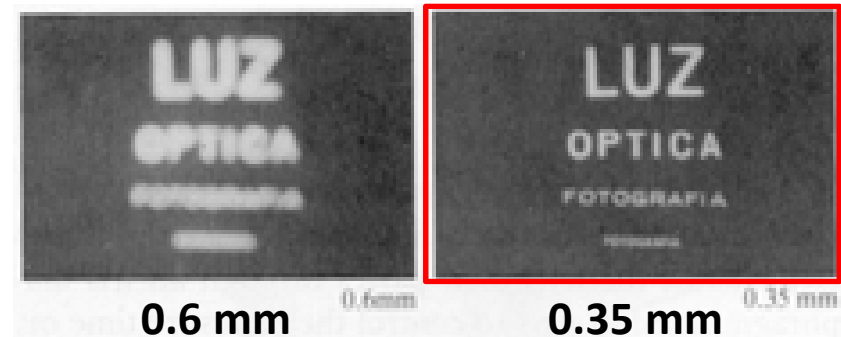
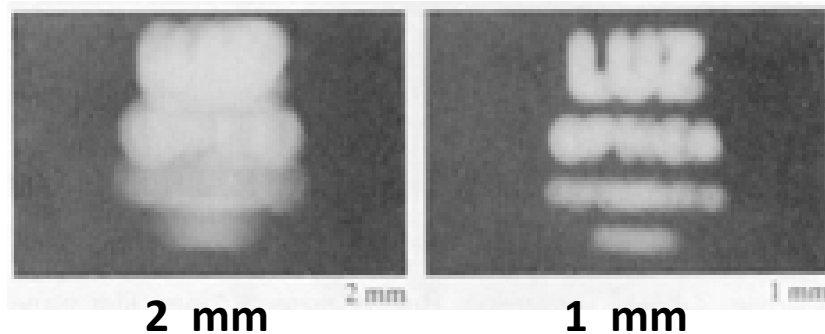
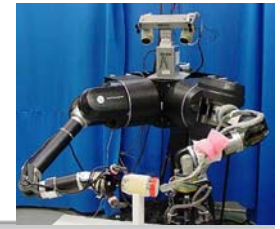
# Limits of Pinhole Cameras

- A picture of a filament taken with a pinhole camera. In the image on the left, the hole was too big (blurring), and in the image on the right, the hole was too small (diffraction).



Ruechardt, 1958

# Pinhole Camera Images with Variable Aperture



- Why not making the aperture as small as possible?
  - Less light gets through
  - Diffraction effect

