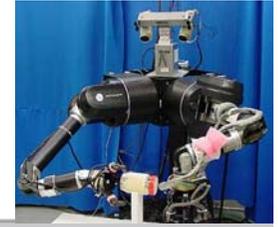
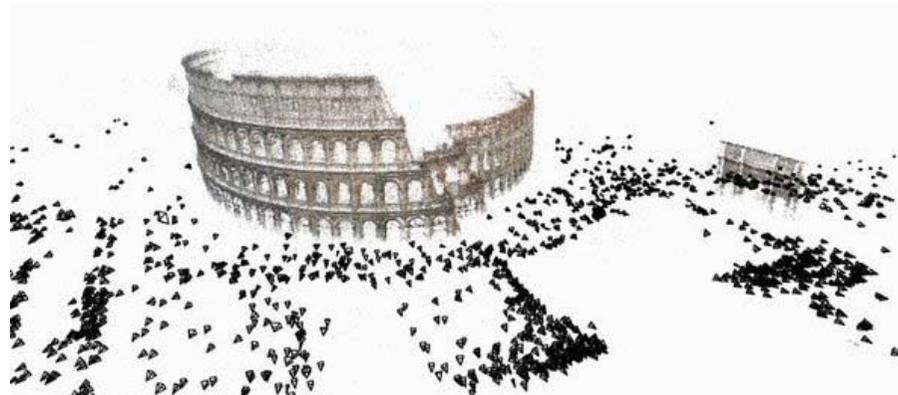
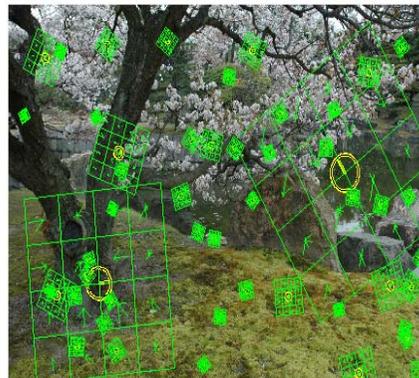


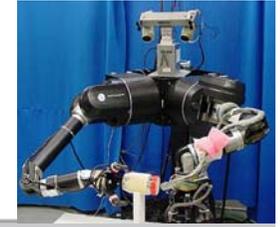
Einführung in Visual Computing (EVC) Image Processing & Computer Vision



186.822 VU 5.0 6 ECTS

Robert Sablatnig

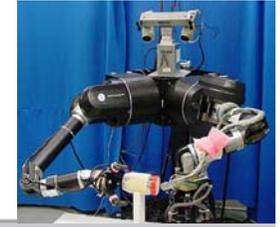




EVC: Image Processing & Computer Vision

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

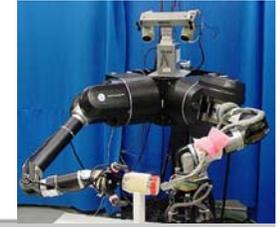
- Content:
 - What are the **basic concepts** of Image Processing and Computer Vision and how are they used in **applications**? The course answers these questions by describing the **creation** of **digital images** using digital cameras and the subsequent steps in order to derive **information kept 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>



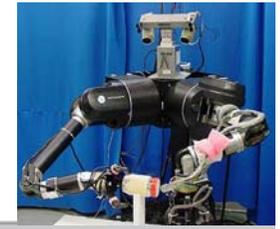


Readings

- 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

Springer Link

Search

TU WIEN UB Universitätsbibliothek

2011

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)

» Download Book (52,007 KB)

Table of contents (28 chapters)

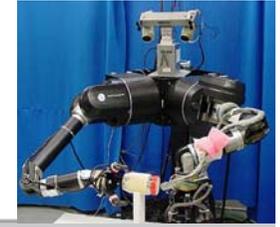
Page 1 of 2

Front Matter
» Download PDF (117KB) Pages I-XVI

Book Chapter
[Einleitung](#)
Alfred Nischwitz, Max Fischer, Peter Haberäcker, Gudrun Socher

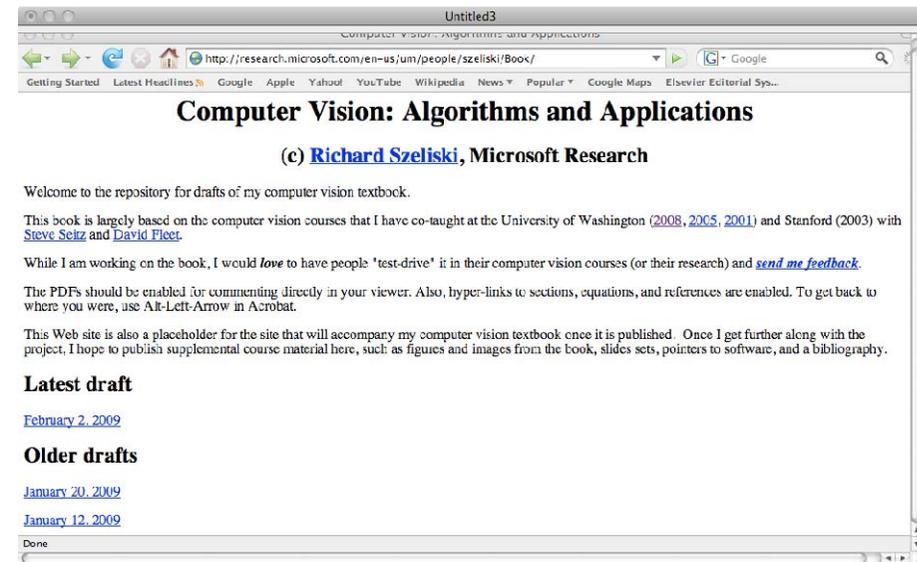
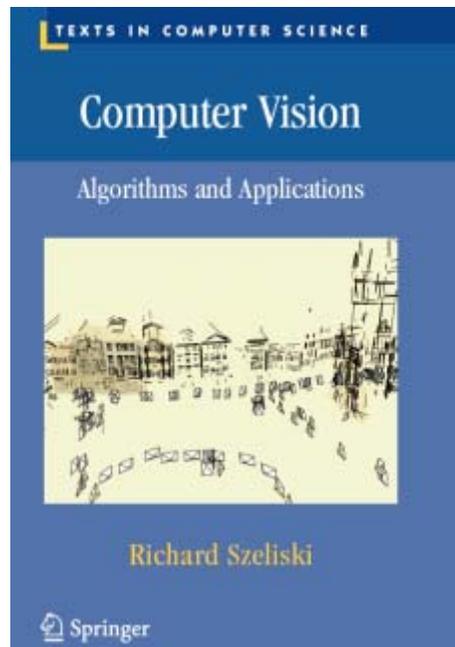
Other actions
» About this Book

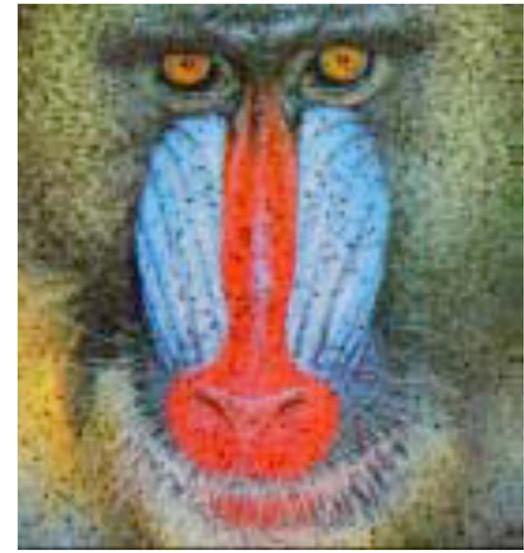
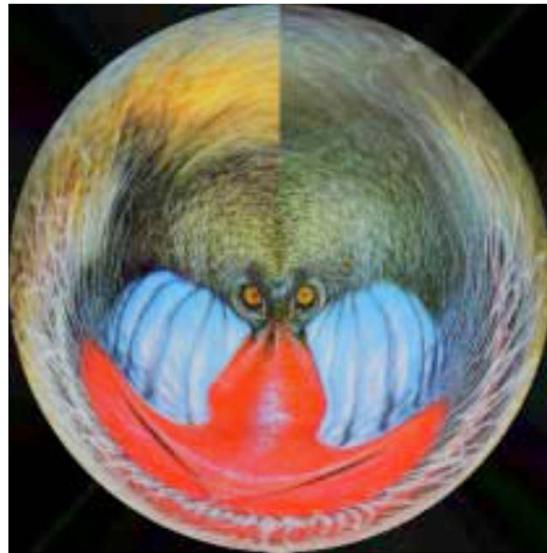
Share
f t in



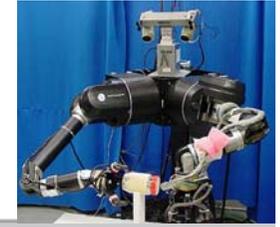
Readings

- 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/>

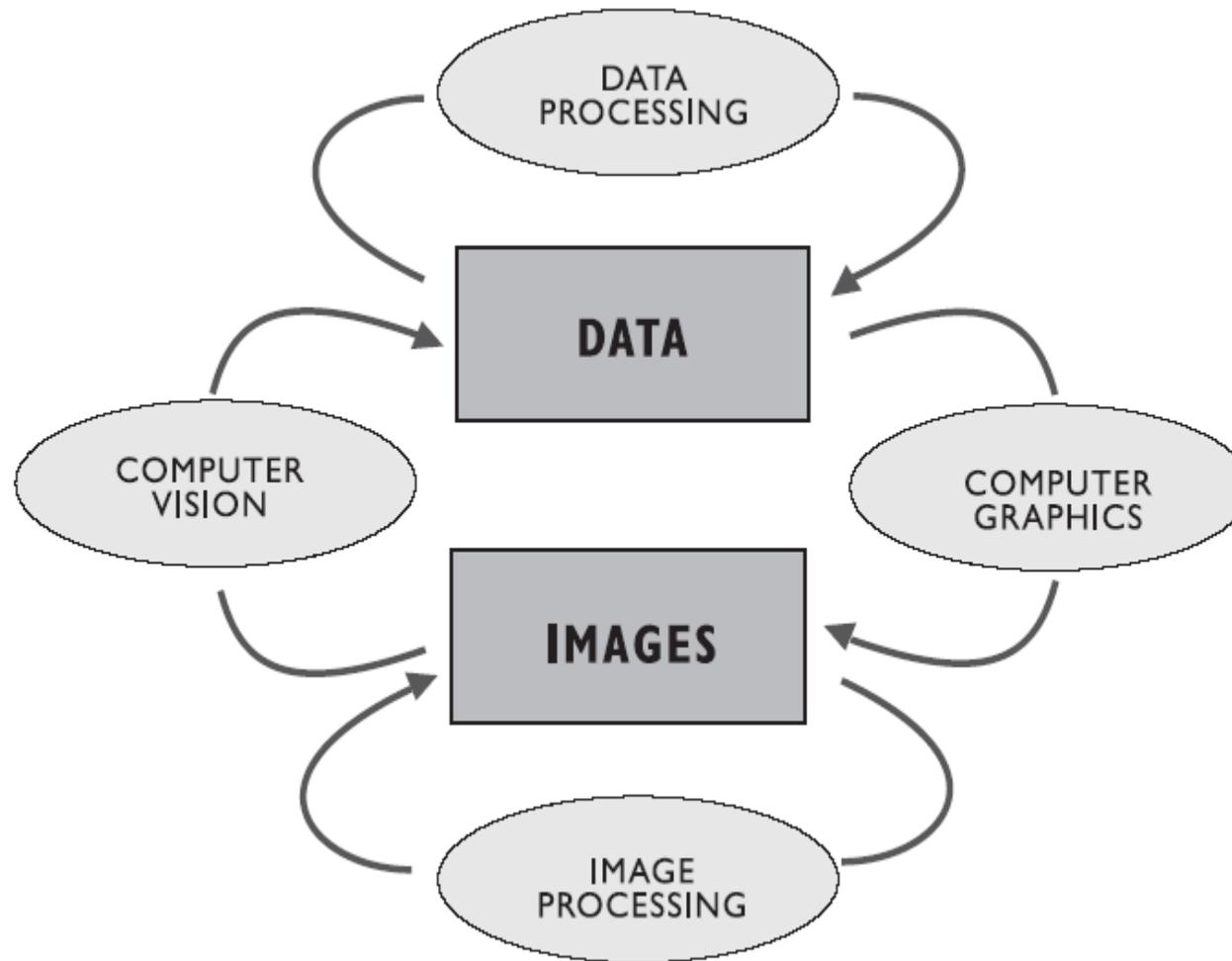


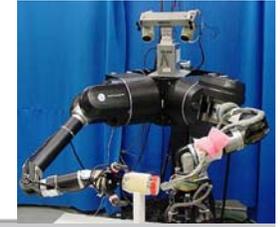


Introduction: What is Image Processing?



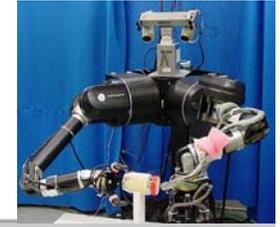
Computer Graphics vs. Computer Vision





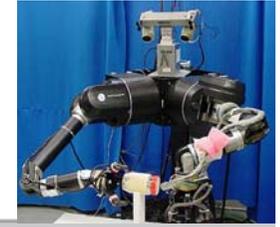
Categorization

- **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

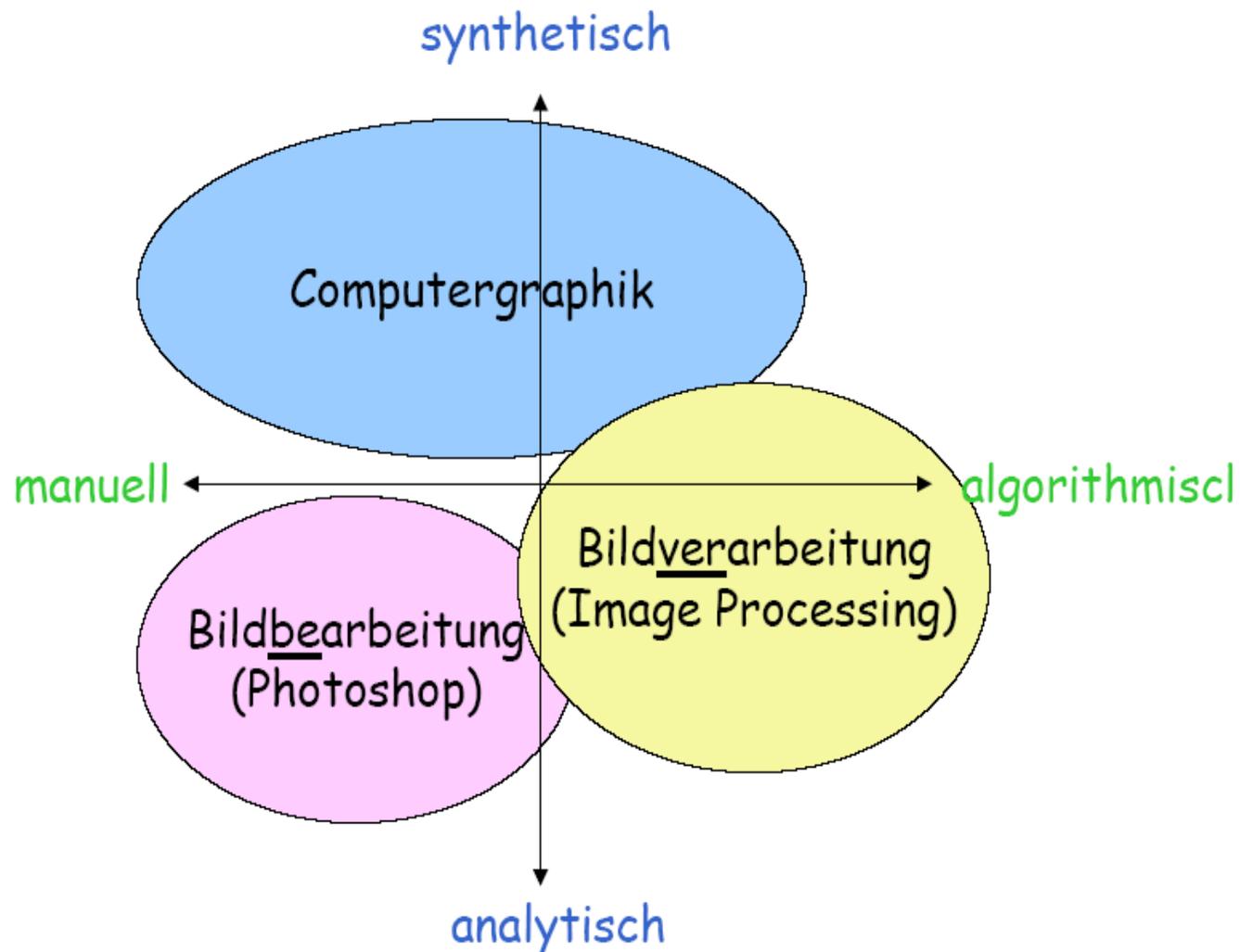


Categorization

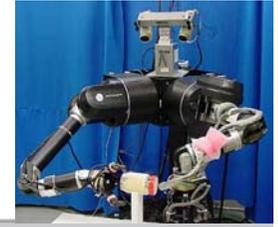
- ***Image Editing***: Manipulation of Images (e.g. Adobe Photoshop)
 - Visually
 - Interactive
 - User-defined parameters
- ***Image Processing***: Mathematical algorithmic processes
 - Image enhancement
 - Image transformation (geometric)
 - Image compression
 - Image segmentation



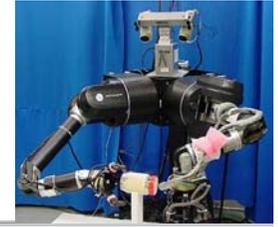
Kategorisierung



Example Image Processing: Filter (Noise Removal)



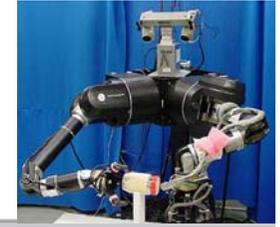
Example Image Processing: Image Enhancement



Original

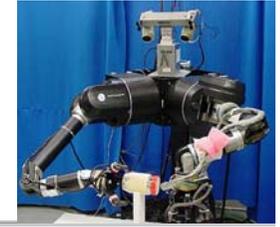


Automatic Enhancement



Example: Image Restoration

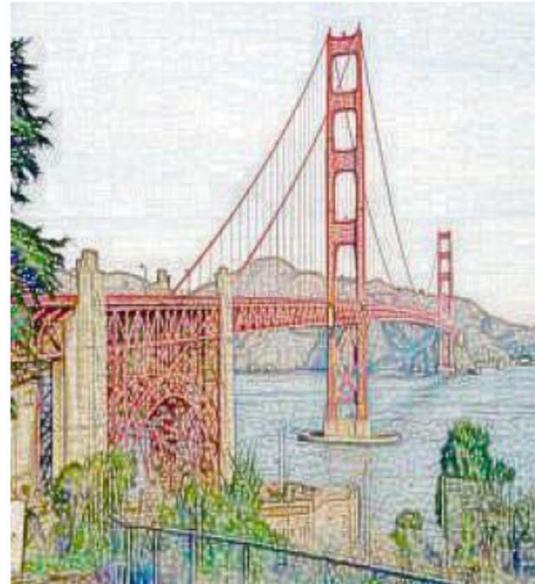




Example: Special Effects



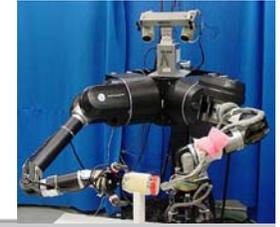
Photo



Simulated
color pencils

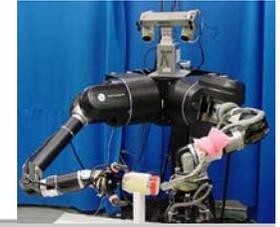


Simulated
oil painting

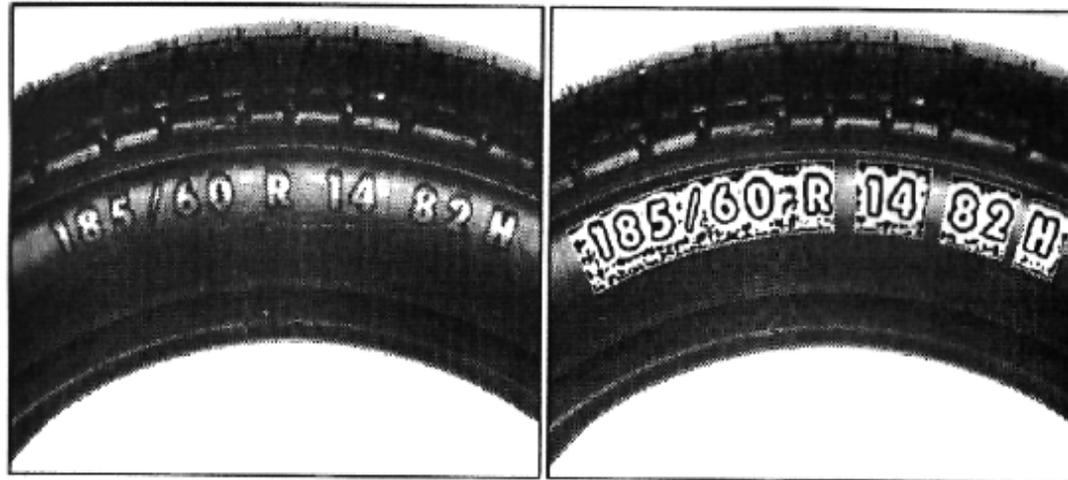


Difference: Pattern Recognition – Image Processing?

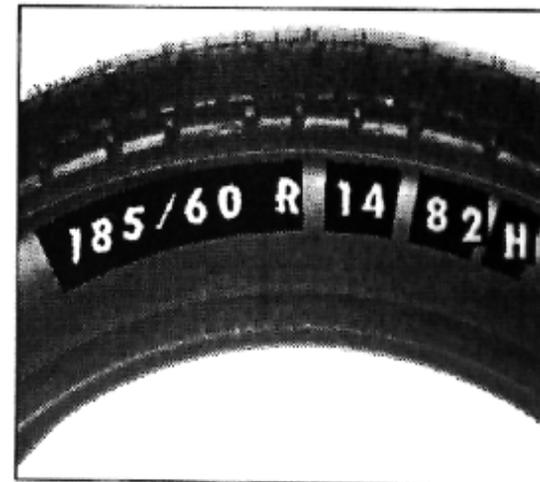
- **Pattern Recognition:**
 - **Classification** of **Patterns** into a (finite) **number of** pre-defined **classes**
 - like 2-dimensional patterns, **OCR**
 - **Standard book:** Duda and Hart 1973, "Pattern Classification and Scene Analysis"
- **Image Processing:**
 - **Processing** of an image to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

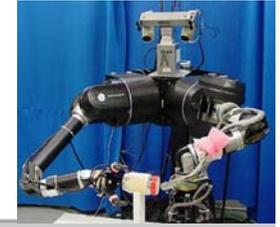


Example: Pattern Recognition



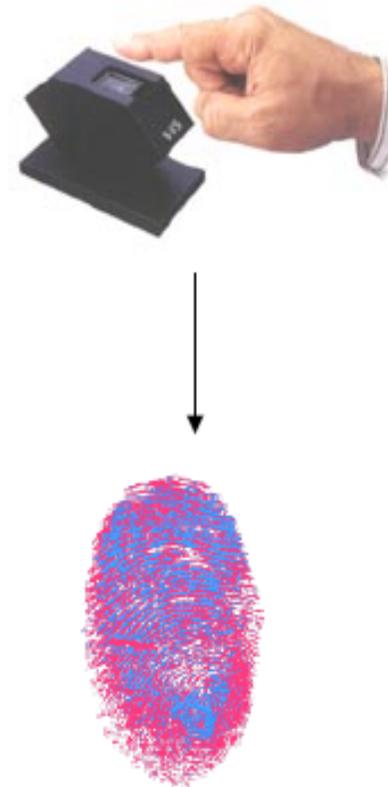
Optical
Character
Recognition
(OCR)

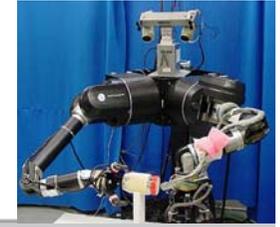




Example: Pattern Recognition

Fingerprint Recognition

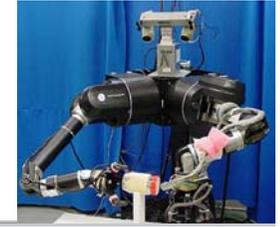




Example: Pattern Recognition

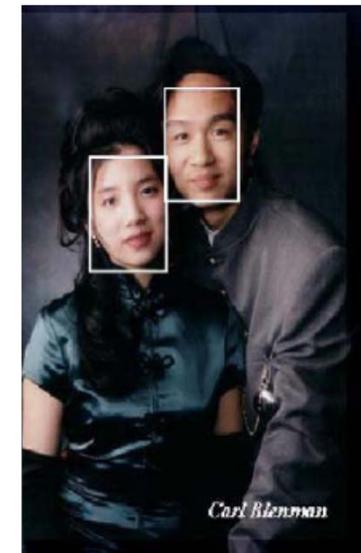
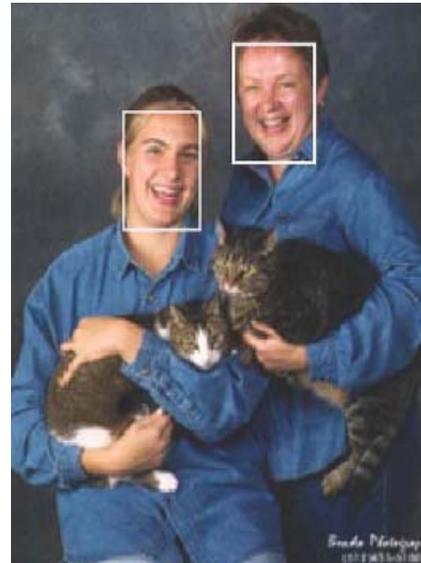
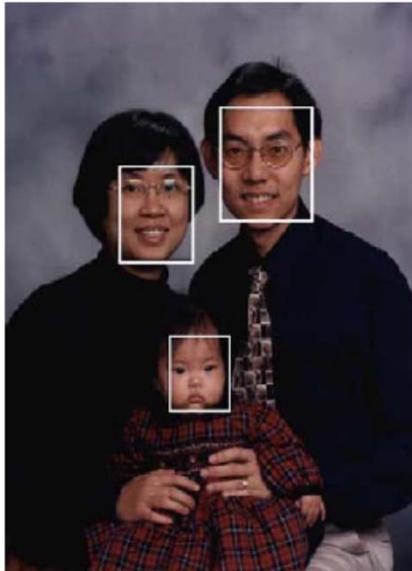
Face Recognition



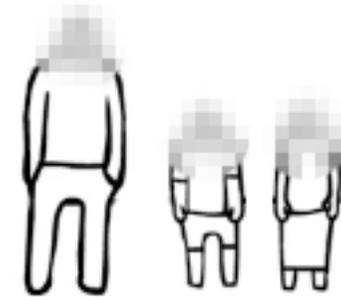


Example: Computer Vision

- Face Detection



Google Street View



[Web](#) [Images](#) [Maps](#) [News](#) [Shopping](#) [Mail](#) [more](#) ▾

philipp.lenssen@gmail.com | [My Profile](#) | [Help](#) | [Web History](#) | [My Account](#) | [Sign out](#)

Google Maps e.g., "10 market st, san francisco" or "hotels near lax"
1504 broadway, nyc
Search Maps [Show search options](#)
Search the map Find businesses Get directions

[Print](#) [Send](#) [Link to this page](#)

Search Results My Maps

1504 Broadway
New York, NY 10036
[Make this my default location](#)

New!
[Explore this area](#) »

Photos



User-Created Maps

[Cheap Eats in NYC](#)
[North American New Humanist Forum](#)
[Barrel to Bottles](#)

[More photos, videos, and user-created maps](#) »

1508 Broadway Address is approximate
Street View Help Full-screen

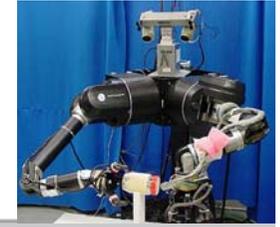
Zoom Out

© 2008 Google

Google Street View

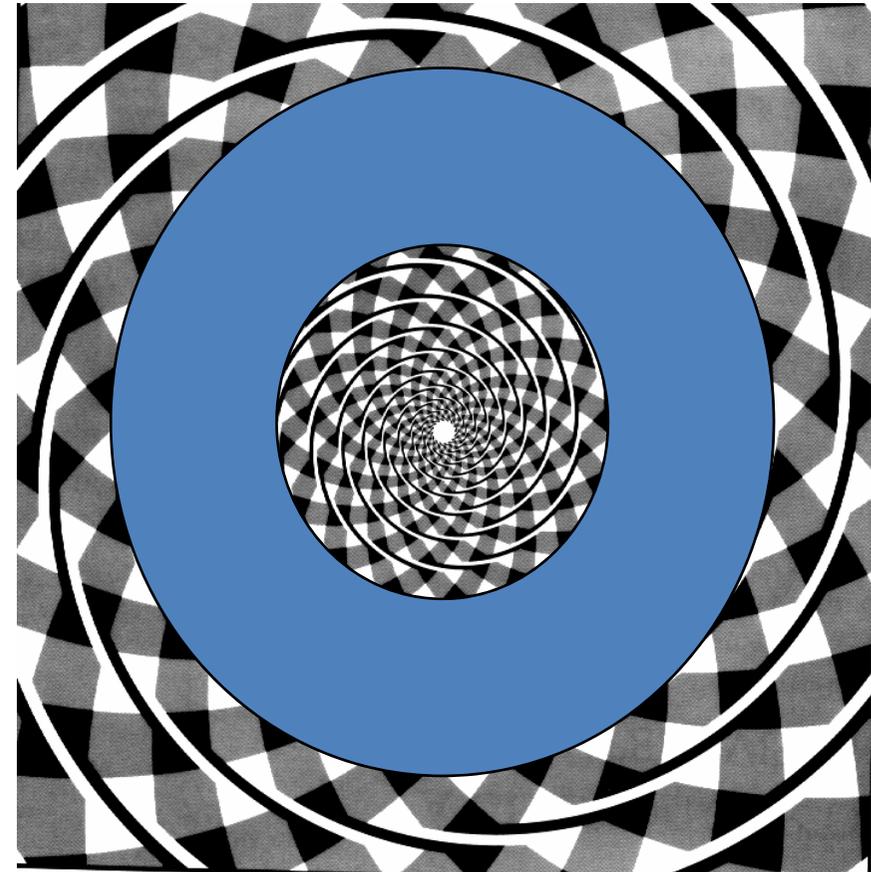


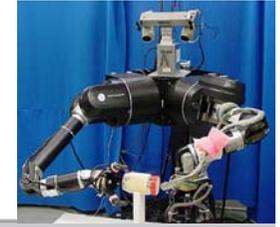
Introduction: What is Computer Vision?



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?



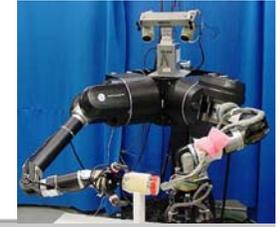


What is Computer Vision ?

"**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

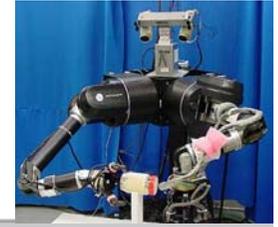


Computer Vision – Industry Related

- 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*

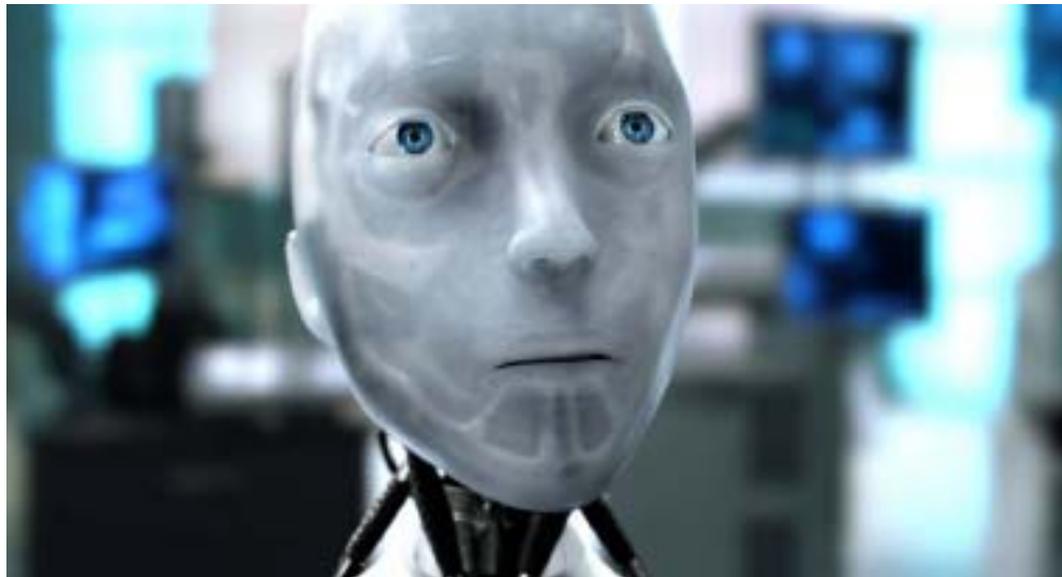


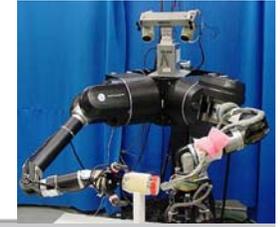
Computer Vision



At least three goals:

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



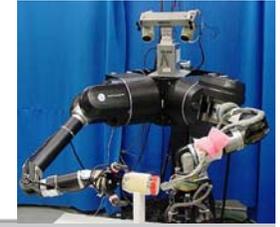


Computer Vision

We still do not know:

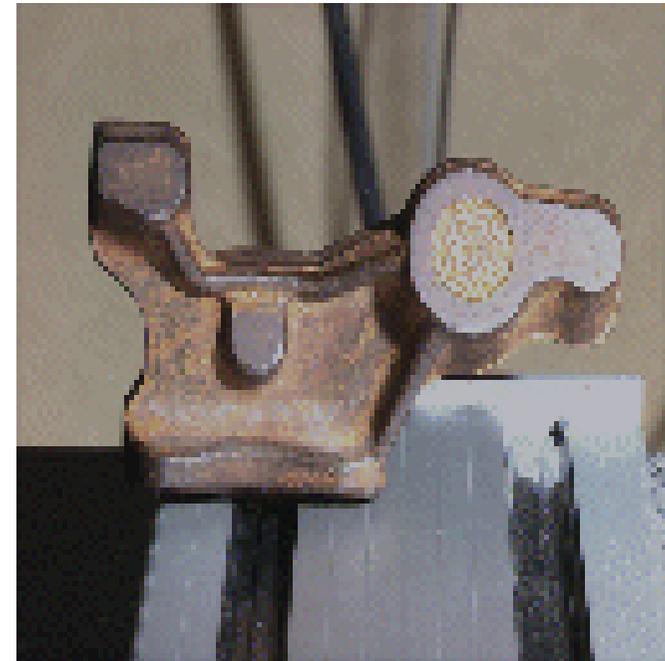
- Is vision a well organized process with fundamental principles or
- A bag of tricks?



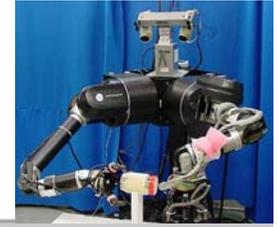


Goals and Applications of Computer Vision

- 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

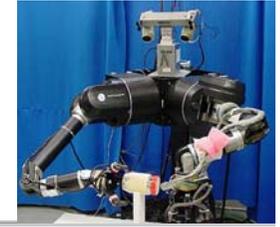


- Why not **simply copy human vision** researched by neurophysiologists, psychologists, and psychophysicists?



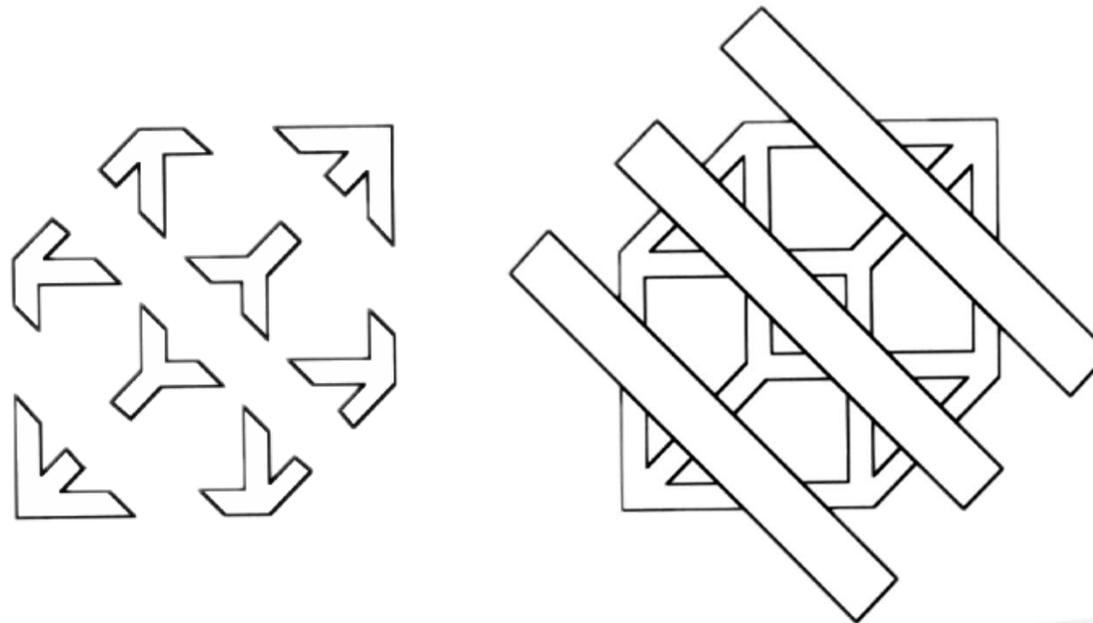
- **Eye** research is **finished** – **Human Vision** research is **not!**
- Seeing is **not only a process within the eye** – eye is only **producing images** formed to “impressions” by the brain
- => **Beginning** of Computer Vision in the area of **Artificial Intelligence**

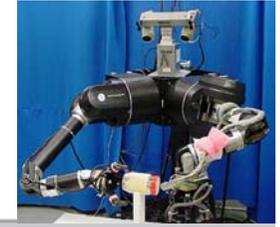




Computer Vision vs. Seeing

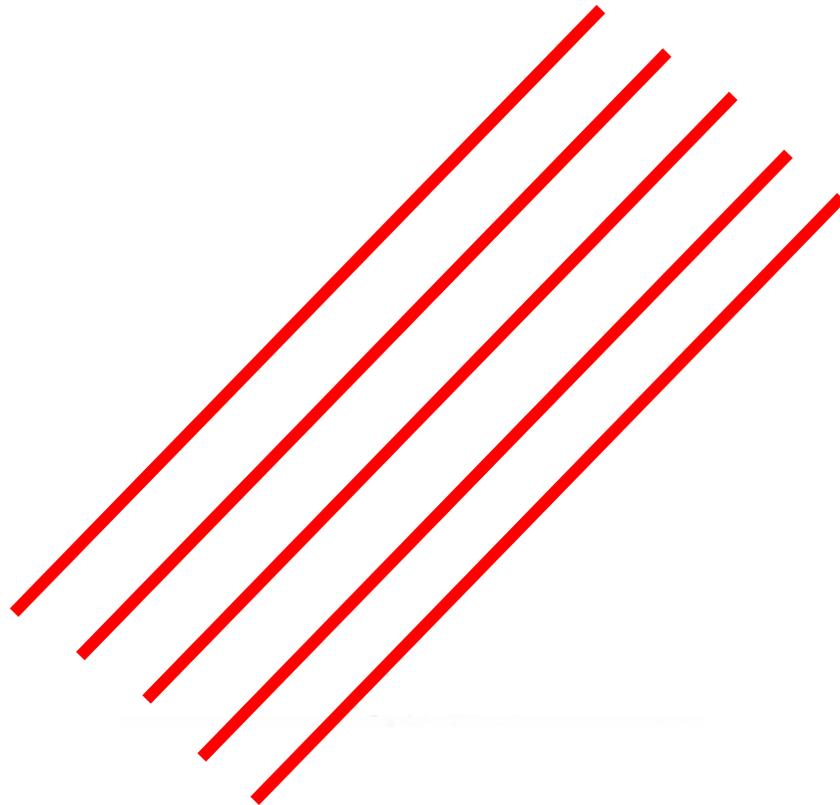
- Seeing has adapted itself to environment and therefore not faultless!
- Is Seeing an integral part of intelligence?
- Do we see reality – or what we want to see?
- **Is Seeing and Thinking separable?**



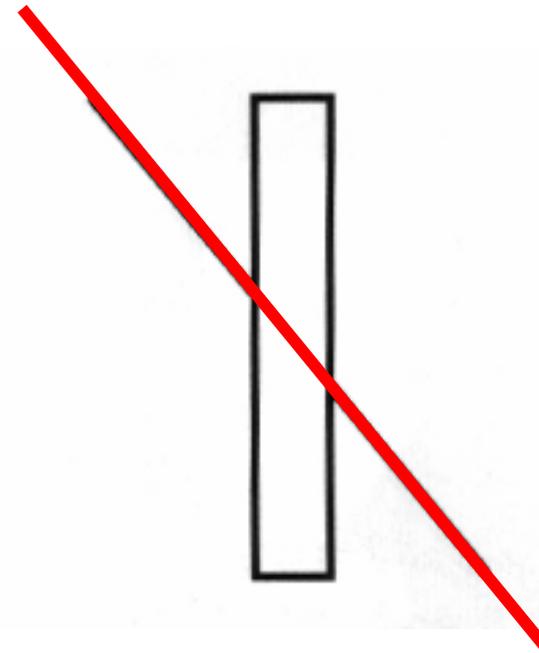


It's Just An Illusion: Visual Illusions

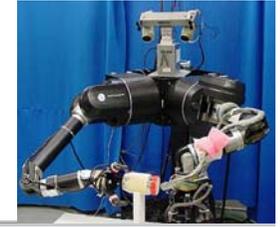
- Classical optical illusions



Zöllner Illusion (1860)

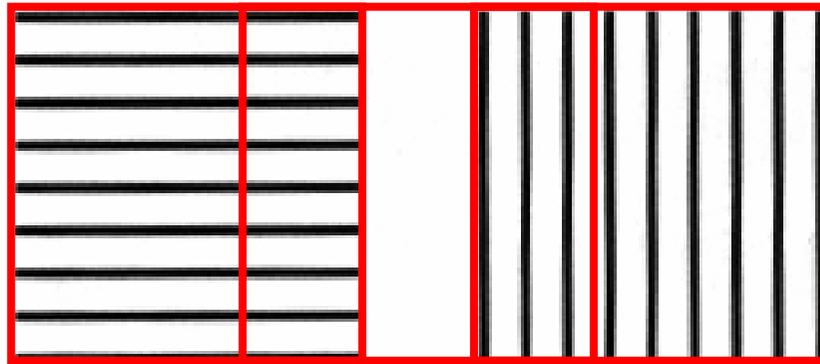


Poggendorf Illusion (1860)

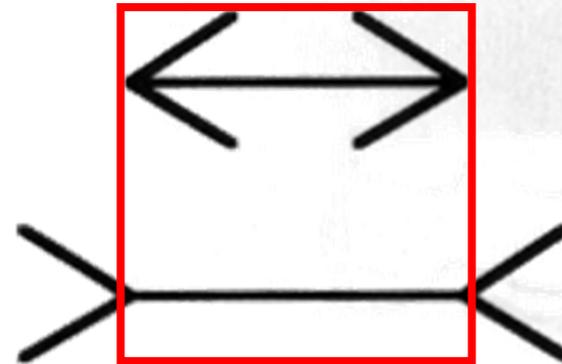


Visual Illusions

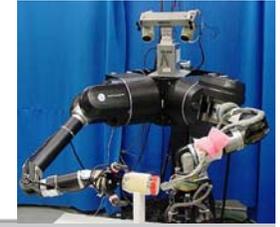
- Classical optical illusions



Helmholtz Squares (1866)

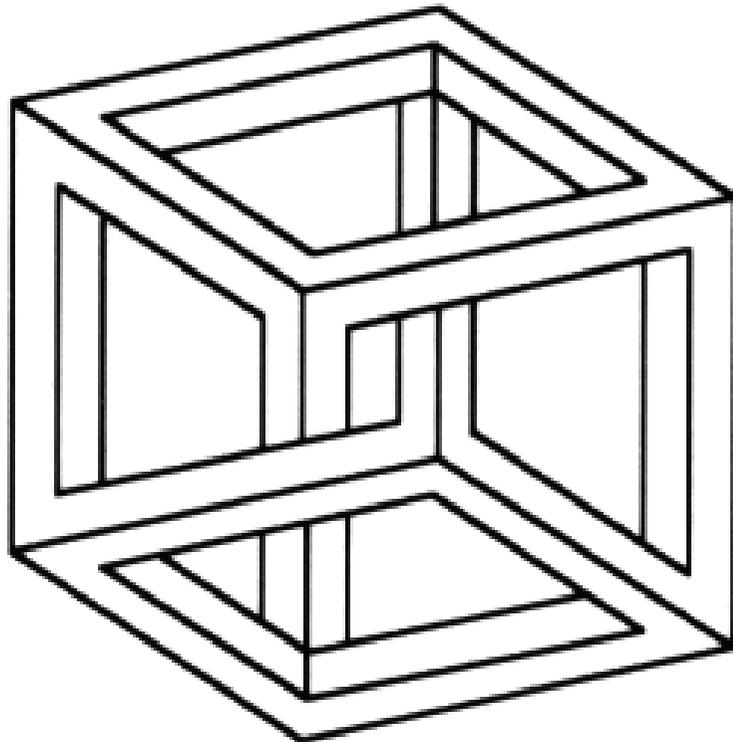


Müller-Lyer Illusion (1860)

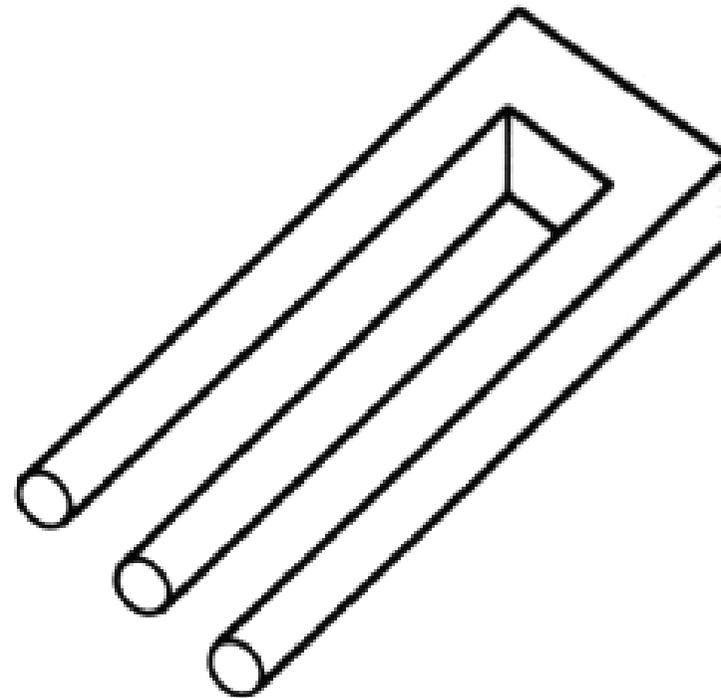


Visual Illusions

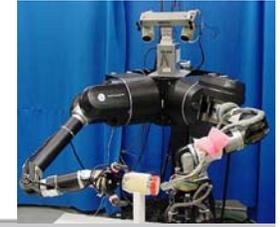
- Non existing 3D objects:



Escher Cube



Two-Pronged Trident



Perspective Illusions by Julian Beever

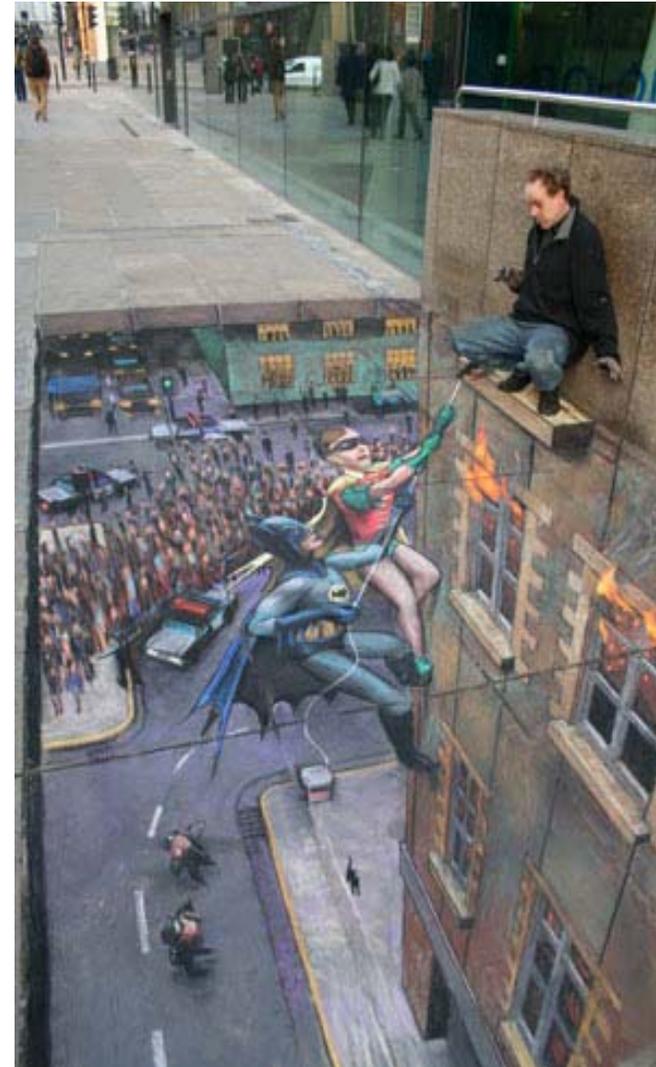
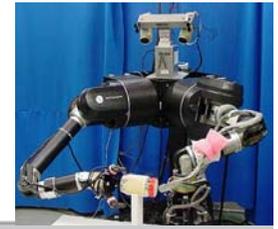
- <http://www.julianbeever.net/>

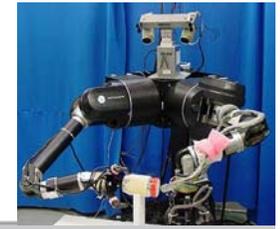


Babyfood...

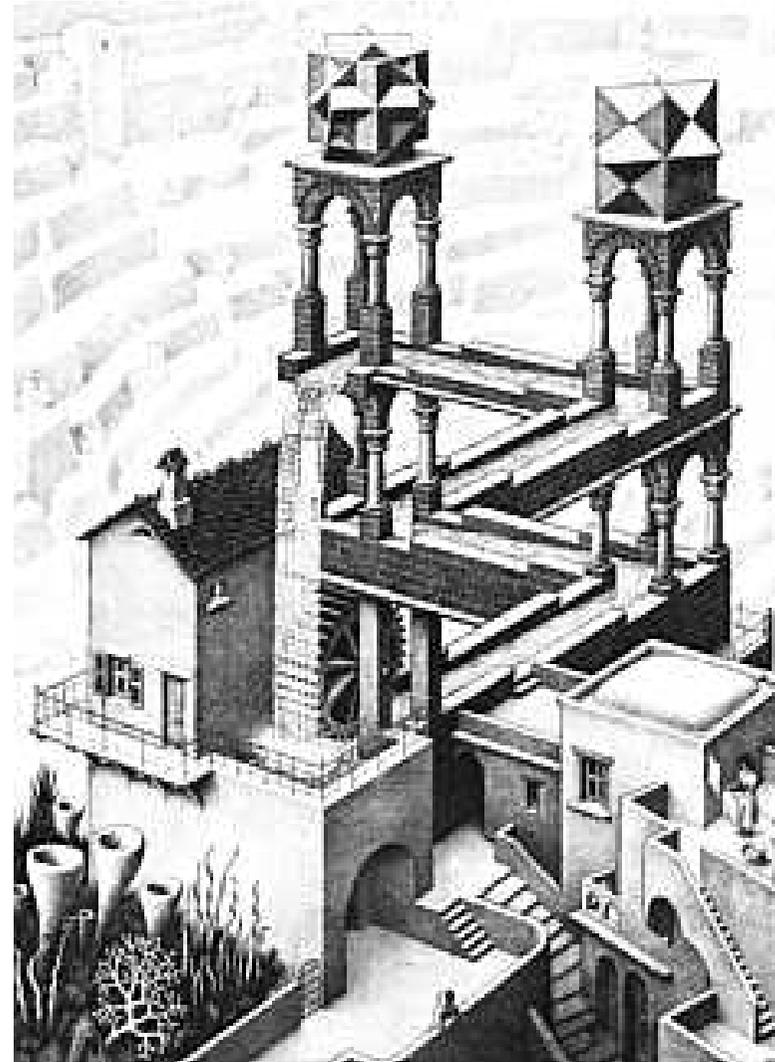
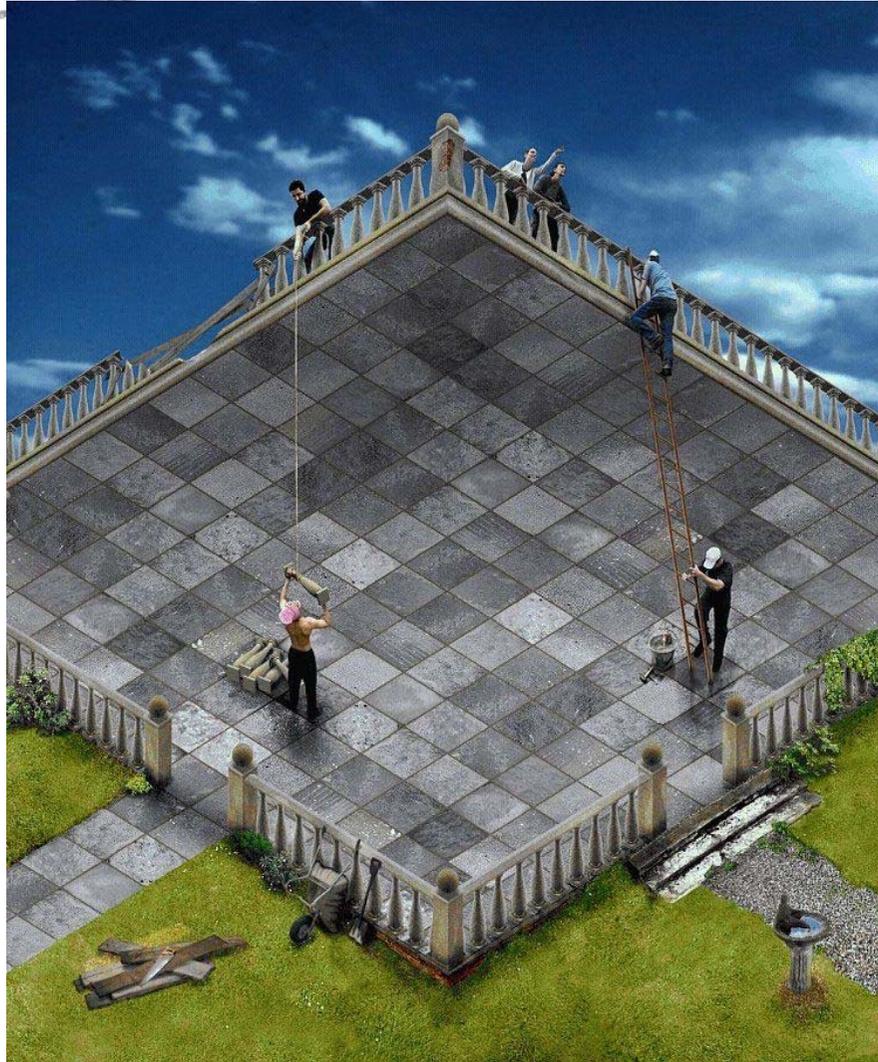


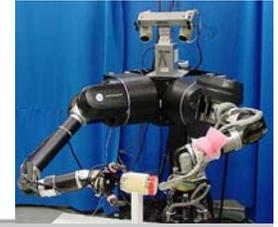
Make Poverty History





M.C. Escher





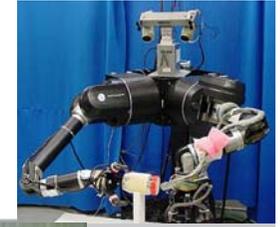
Ambiguous Interpretations



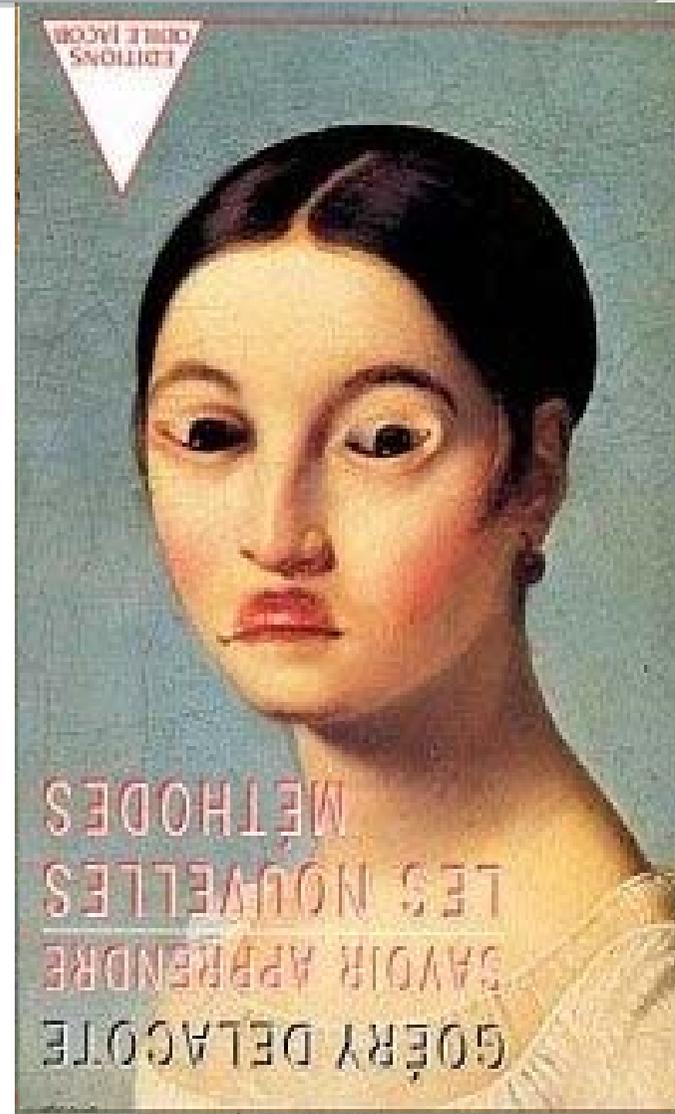
Amerindian vs. Inuit



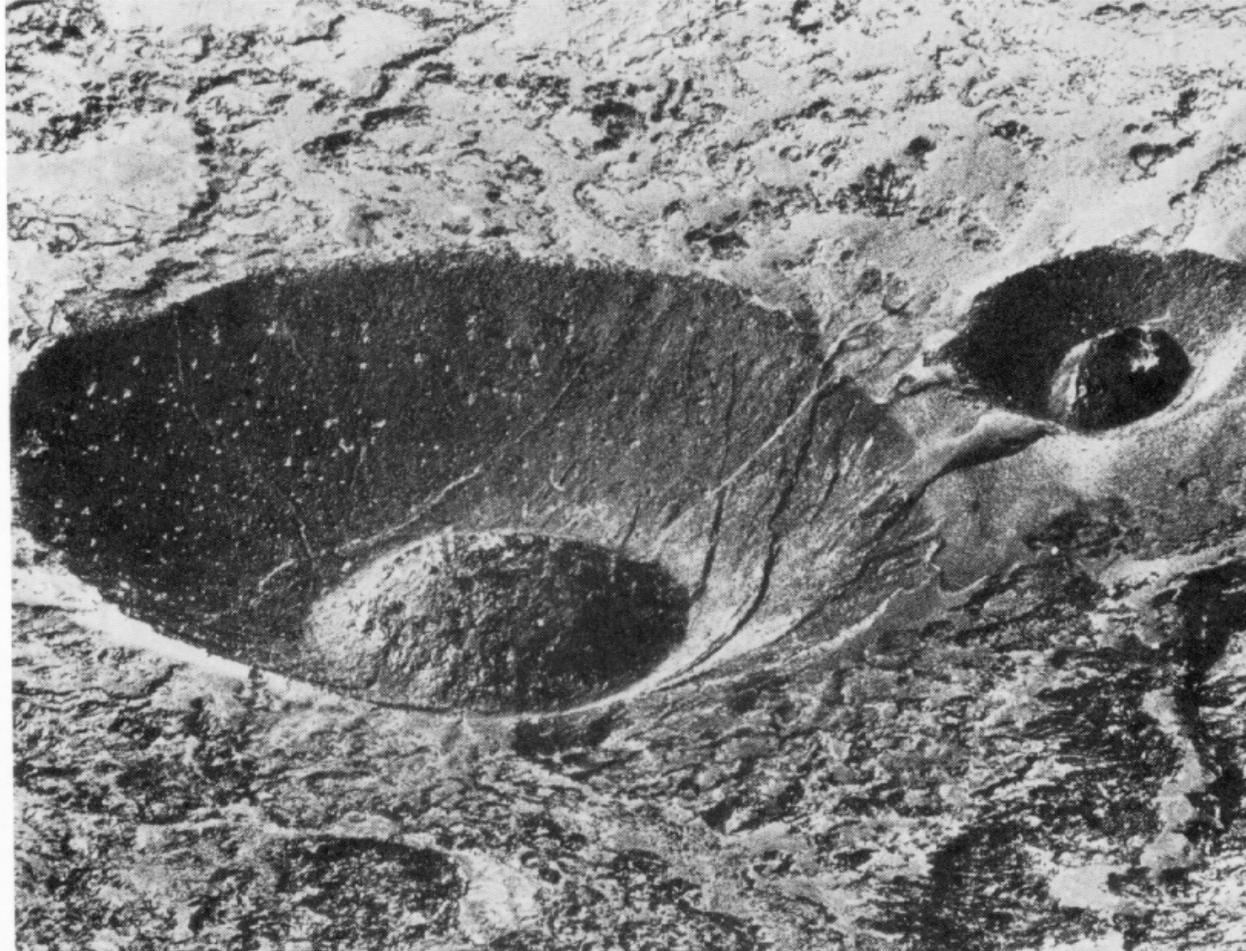
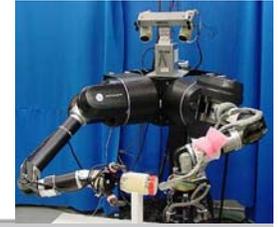
Young/Old Lady



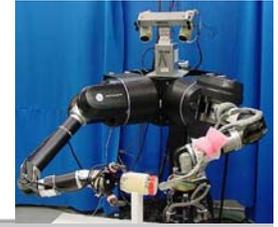
Rotary Effects



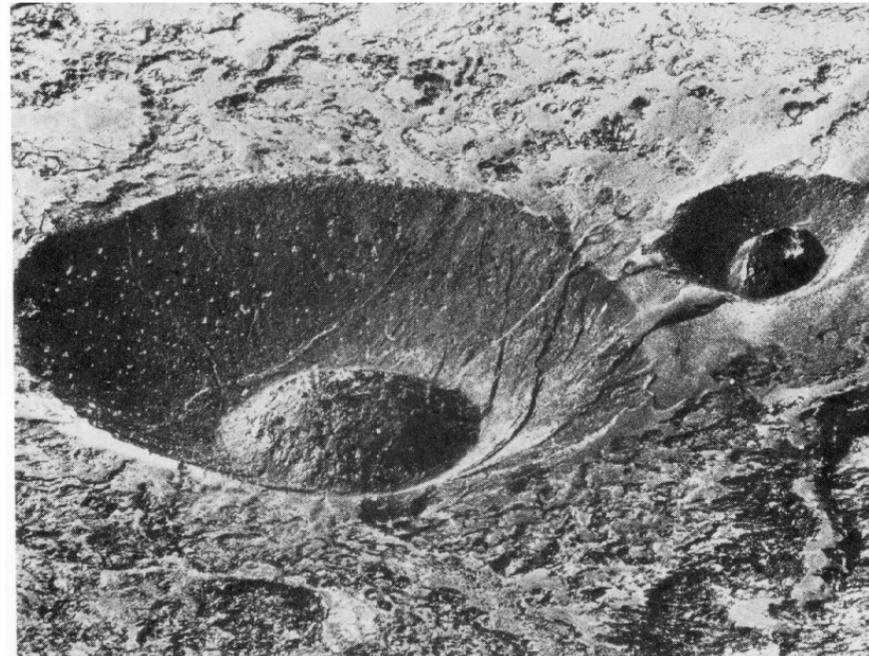
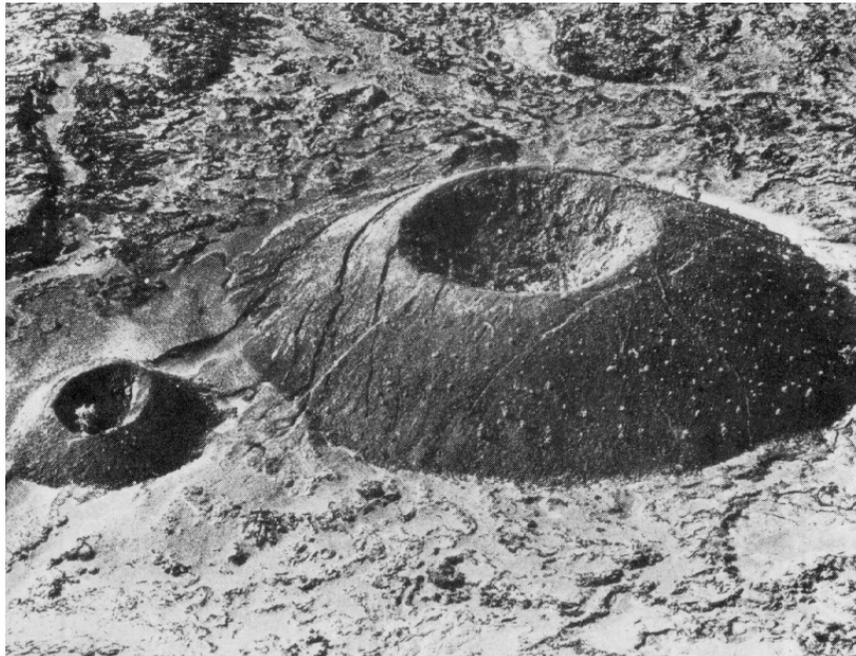
Are these phenomena caused by manipulation of the visual system by unreal images?

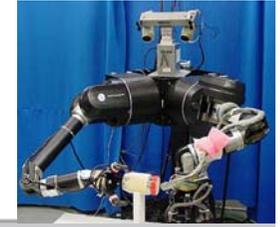


Are these Phenomena caused by Manipulation of the Visual System by Unreal Images?



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)





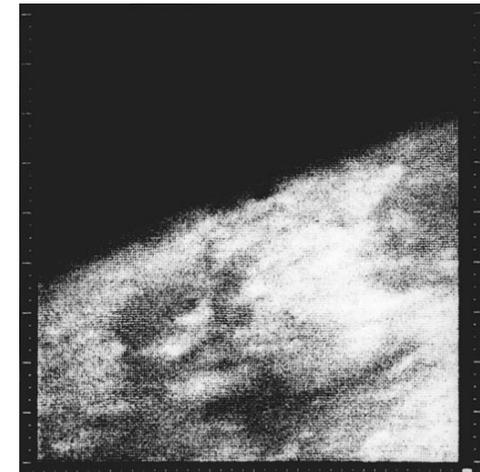
History

- 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**

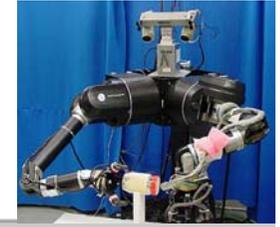


Source: NASA

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



Source: NASA

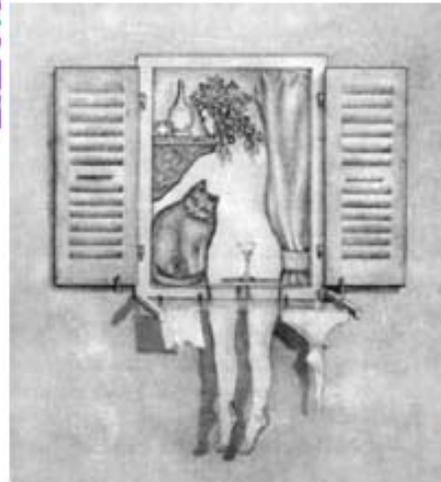


Computer Vision

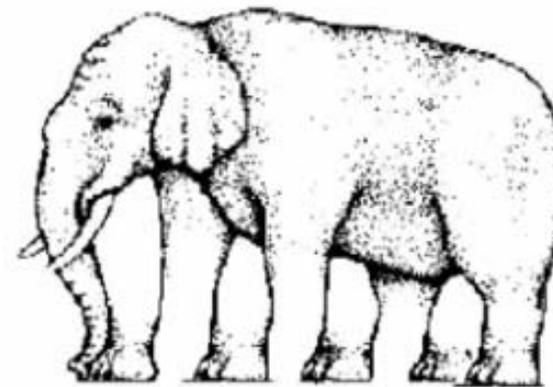
The systems today are still exceedingly limited in their performance → **considerable room for improvement**



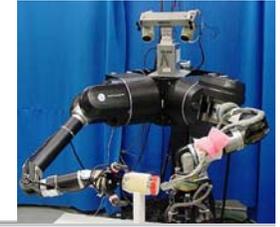
Where are chairs?



Two interpretations?



How many feet?



Future Challenges of Computer Vision

- Where do the innovations come from?

- 1. Hardware



Wavi Xtion



Kinect



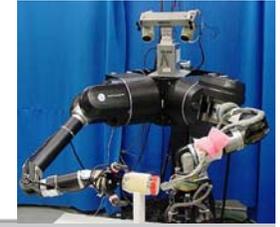
- 2. Algorithms/Software



Microsoft
Research

<http://www.gigapixel.com>

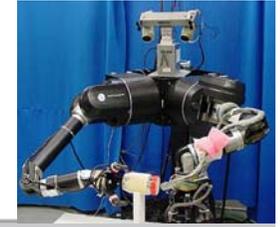
CLAUSS



Hardware

- **First time that HW is no longer a real limitation !!**
- Processing
- Image Resolution
- Storage
- Internet
- Mobile Devices
- Networks of cameras

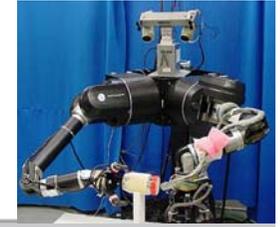




Processing

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

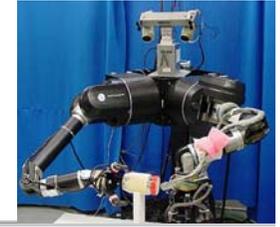




Processing

- 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

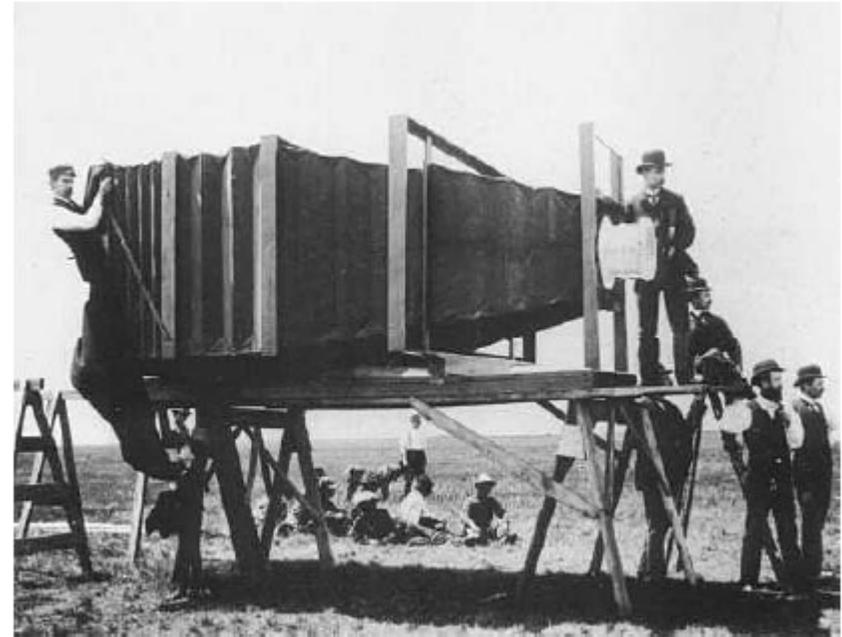




Resolution

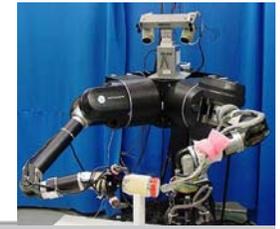
Ever growing resolution:

- 1975: $100 \times 100 = 0.01$ MP
- 2009: 13.280×9.184 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

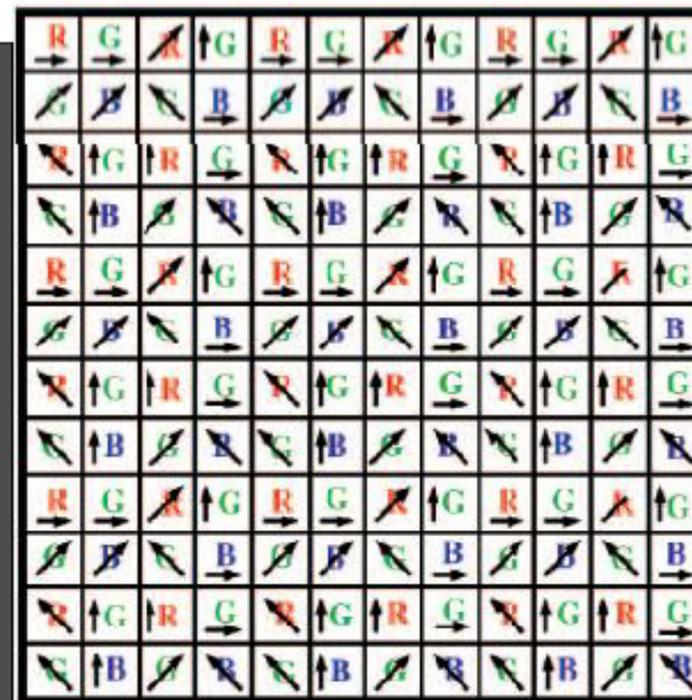


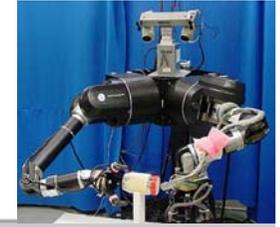


What can we do with that?

Assorted Pixels (Nayar)

Intensity-and-color-and-polarization mosaic:



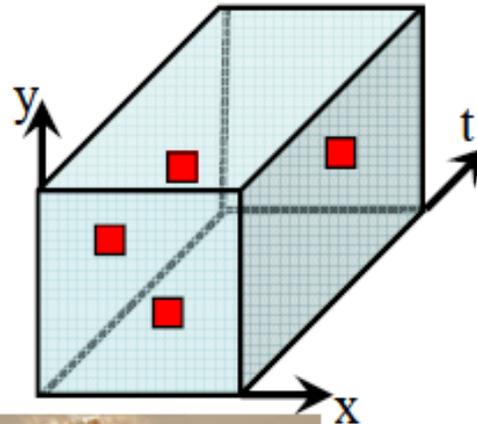


Some Questions to Tackle

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



Hundley: Time Space Mixtures



Agrawala et al.,
Digital Photomontage



(b)

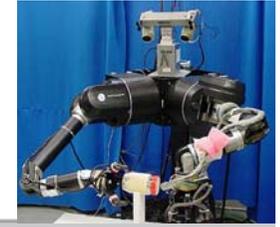


(c)



(d)

Freeman 2003



Some Questions to Tackle

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

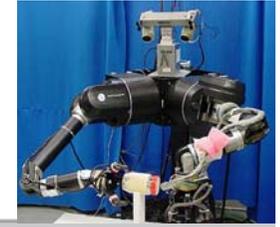
- No constraints of view-points
- Multiple Images → **Redundancy**
- Control the illumination of each pixel



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

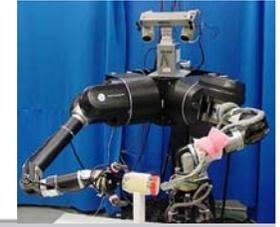


1280x960 Video

- Can we index that? → **Algorithms**



Life Logs with
wearable webcam



Internet

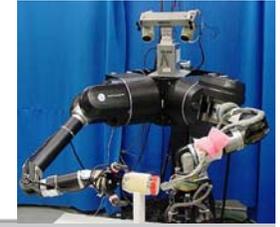
Huge repository of images

- 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](#)

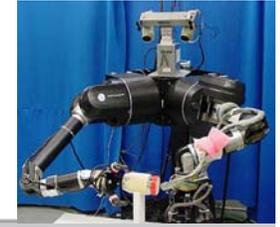




What is Vision?

- 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



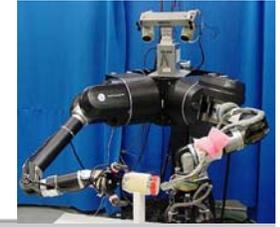
The Importance of Images

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



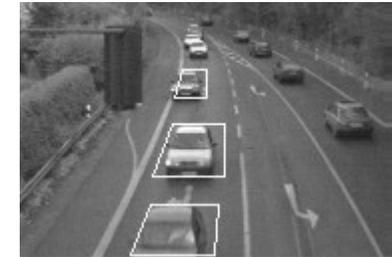
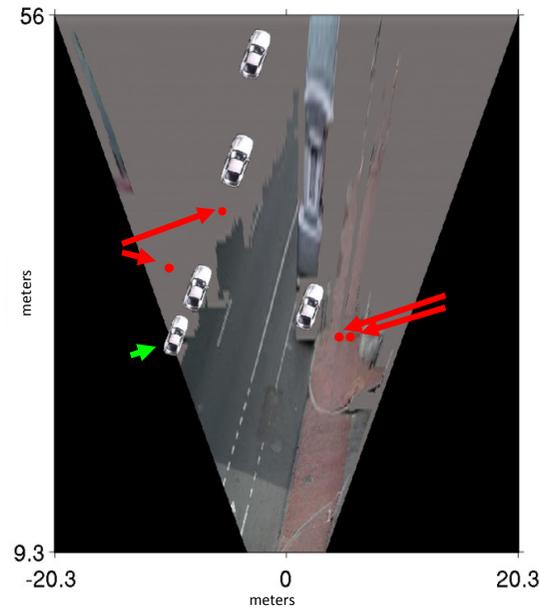
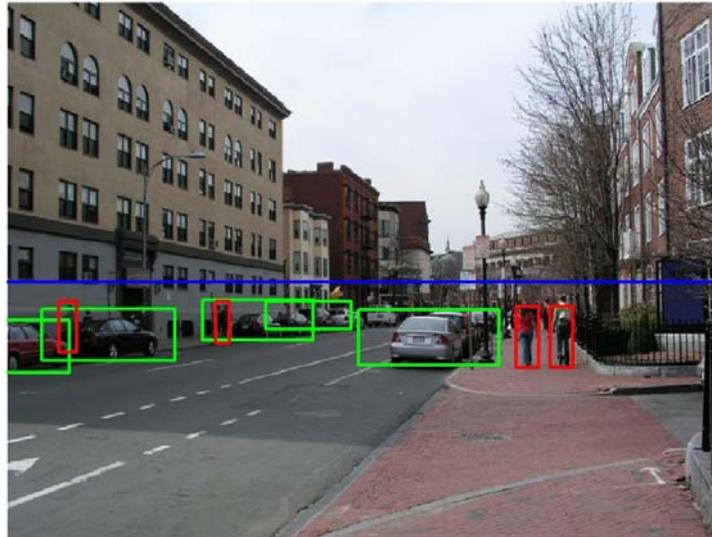
“Dora Maar au Chat”
Pablo Picasso, 1941

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

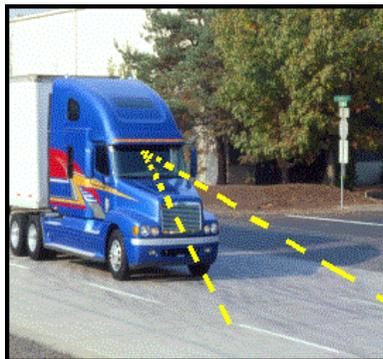


Assisted Driving

Pedestrian and car detection

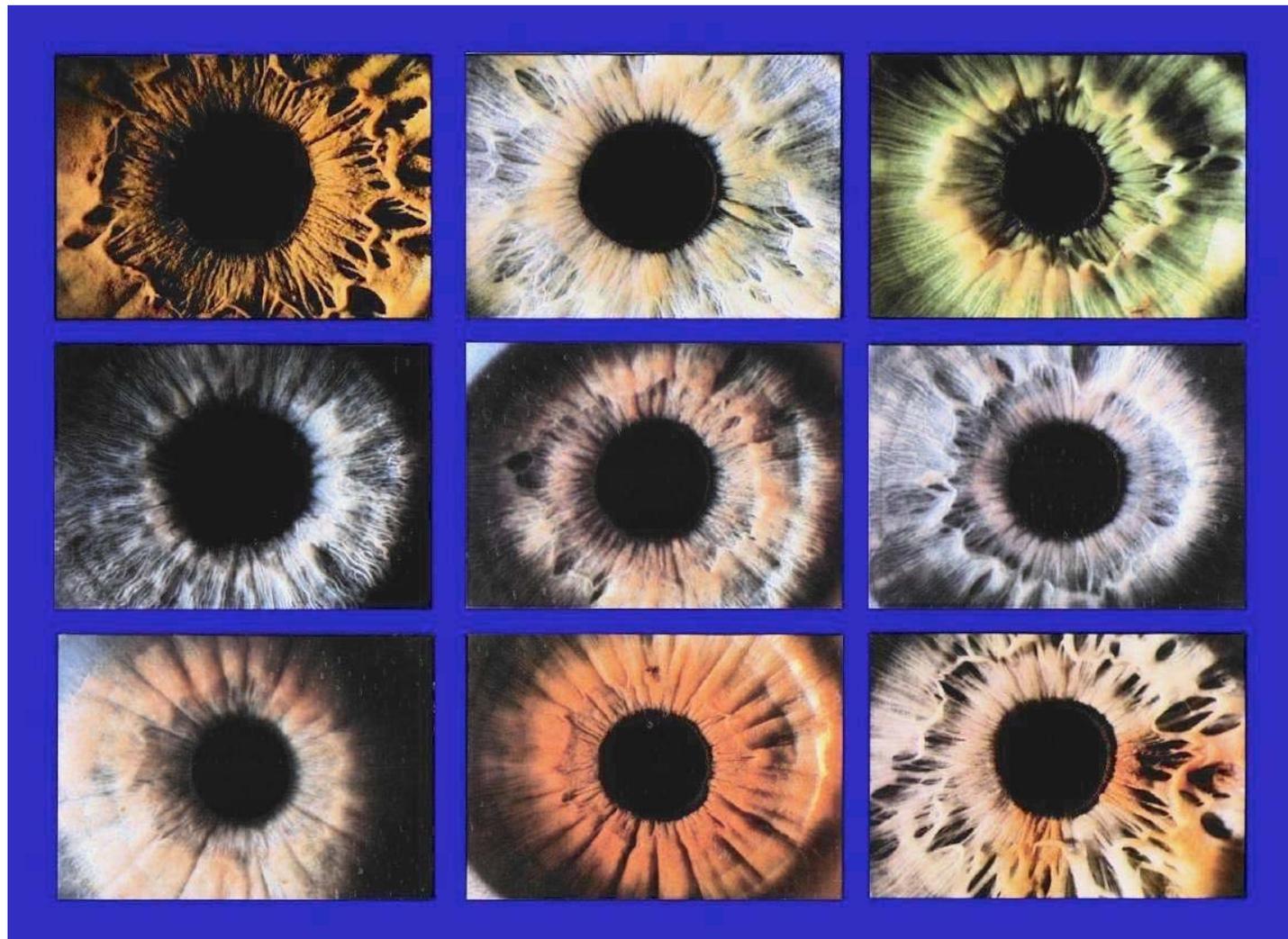
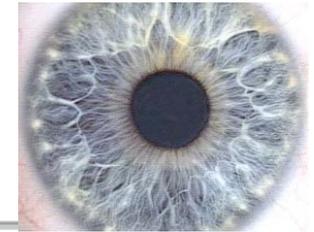


Lane detection



- 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>

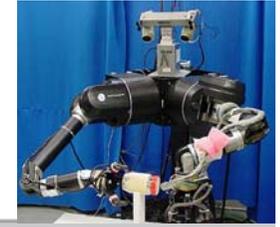
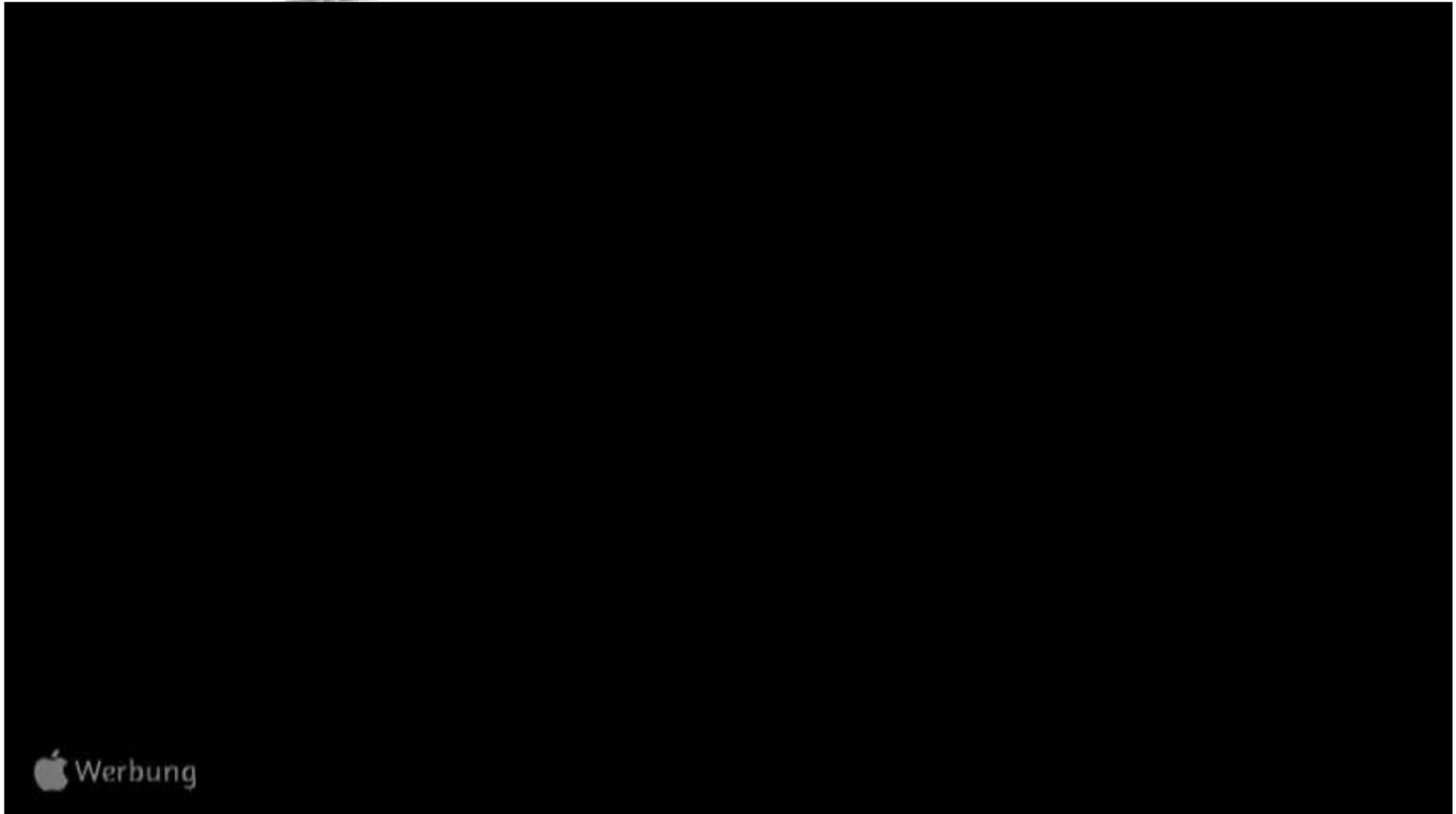


Image Stitching



 Werbung

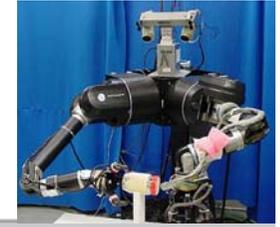


Image Stitching



(a) Image 1



(b) Image 2



(c) SIFT matches 1



(d) SIFT matches 2



(e) RANSAC inliers 1



(f) RANSAC inliers 2



(g) Images aligned according to a homography

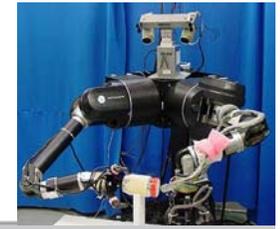
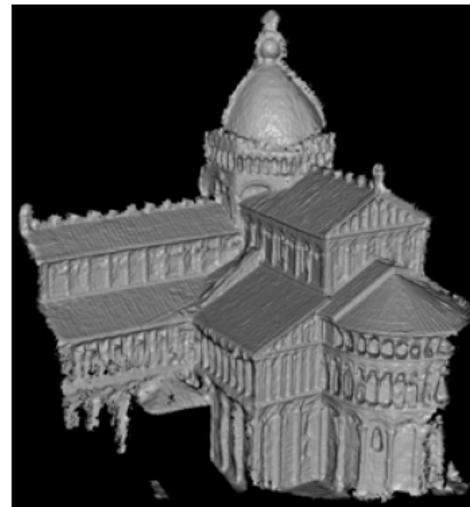


Photo Tourism

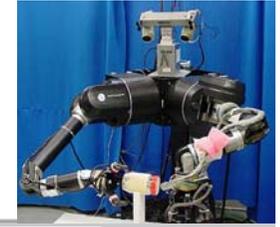
PhotoSynth



Snaveley 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

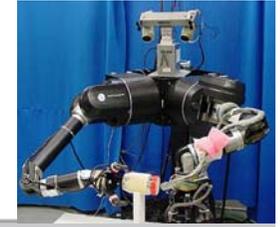
Richard Szeliski

University of Washington

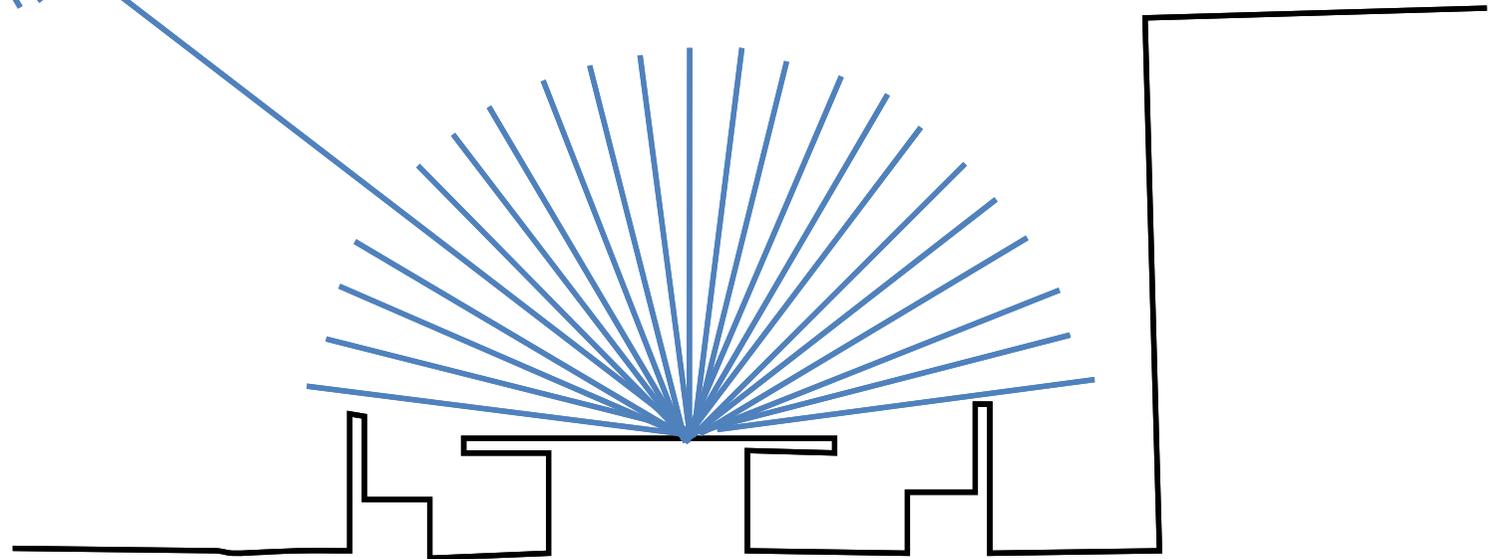
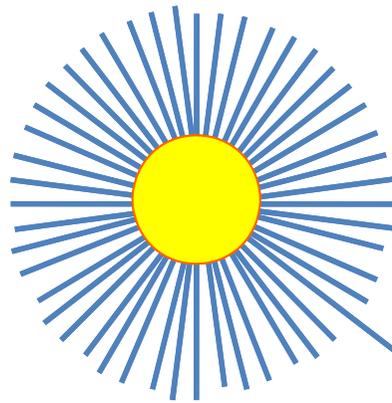
Microsoft Research

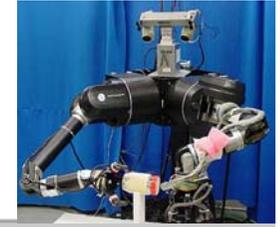
SIGGRAPH 2008

Why is Vision hard – The Plenoptic Function

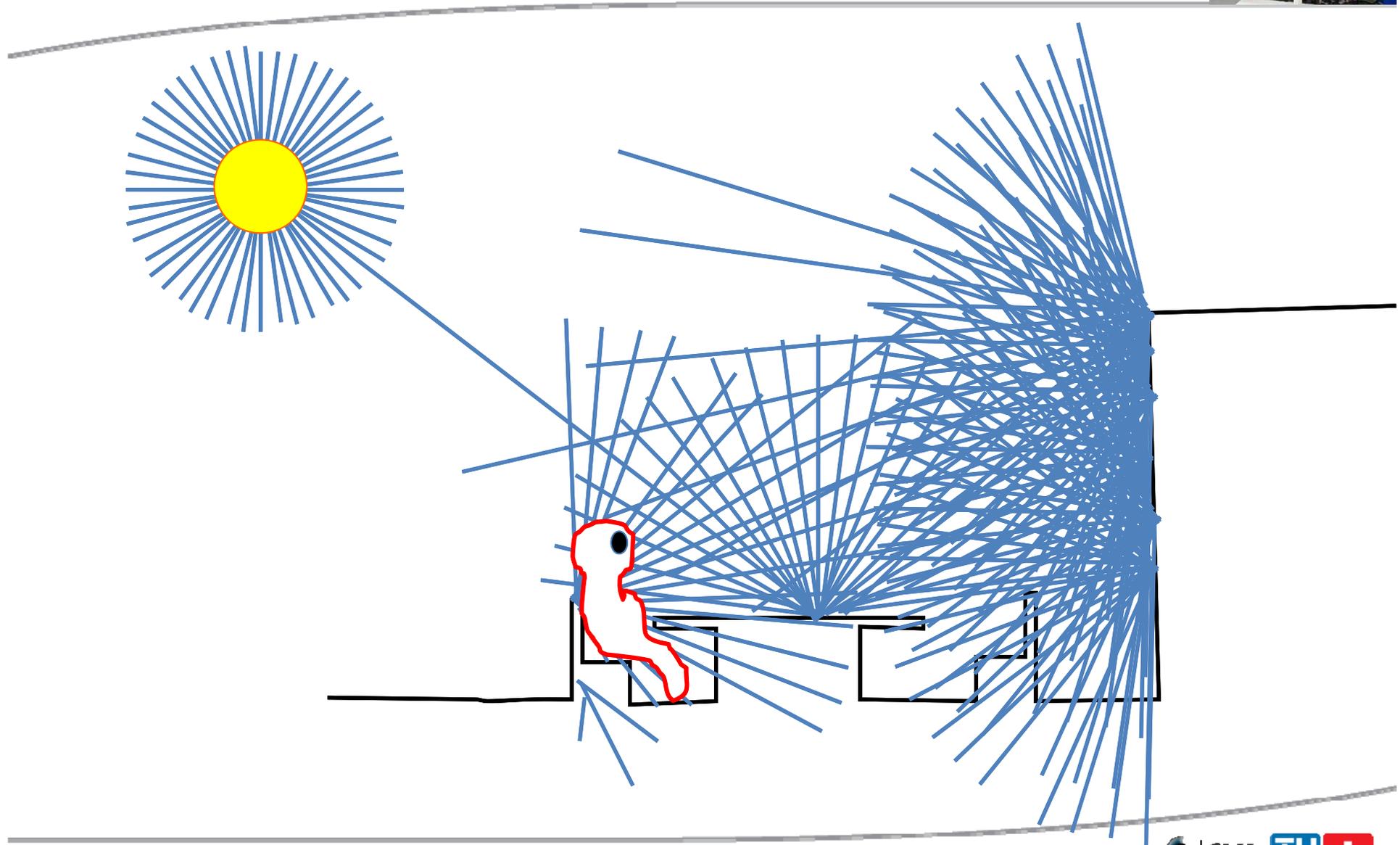


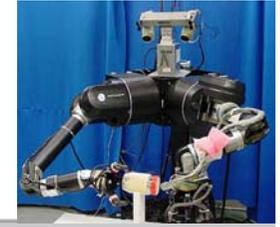
The Structure of Ambient Light





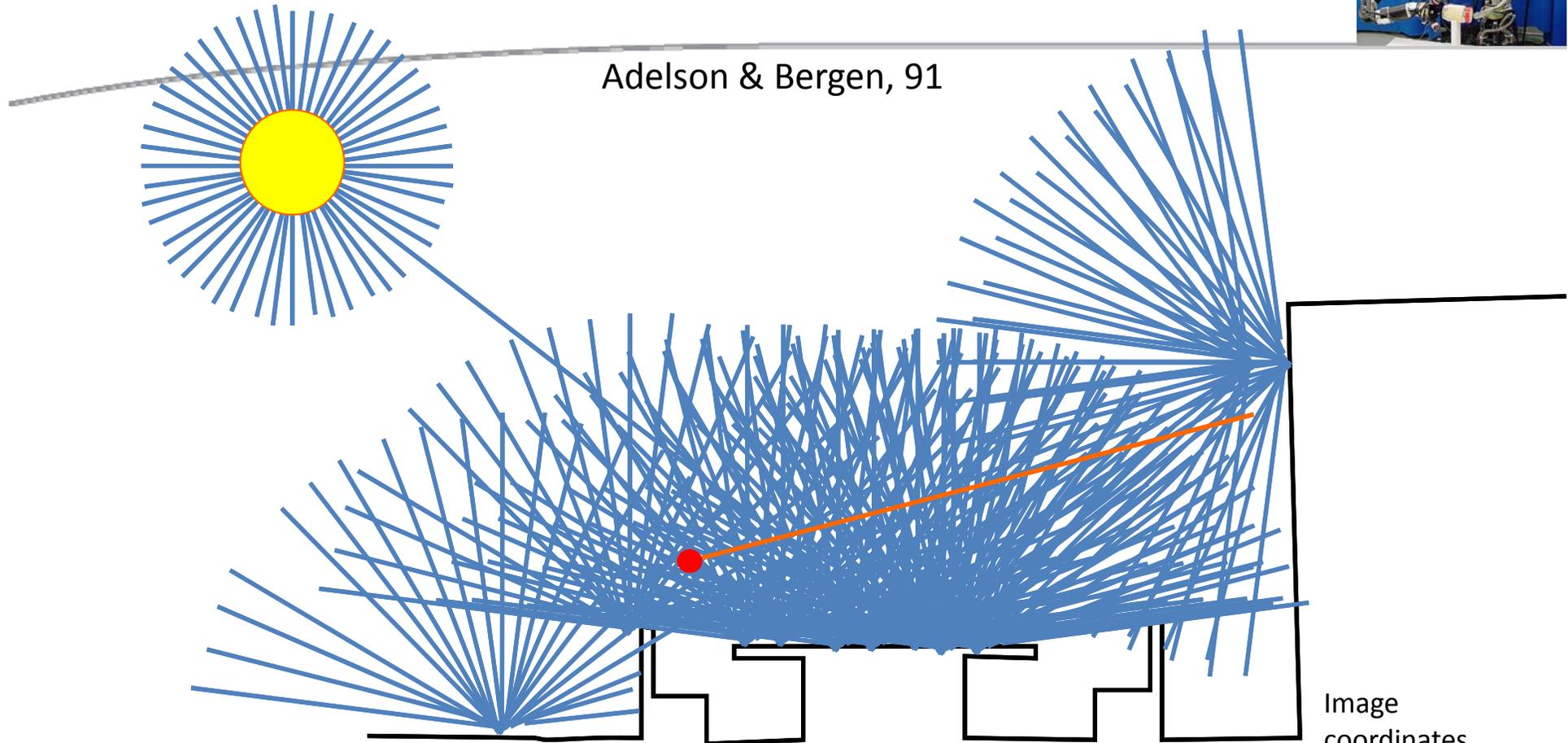
The Structure of Ambient Light





The Plenoptic Function

Adelson & Bergen, 91



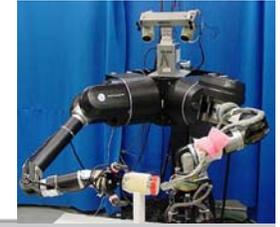
The intensity P can be parameterized as:

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

Image coordinates (spherical)
Color
Time
3D space

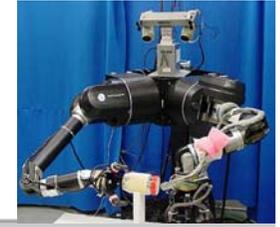
“The complete set of all convergence points constitutes the permanent possibilities of vision.”

Gibson

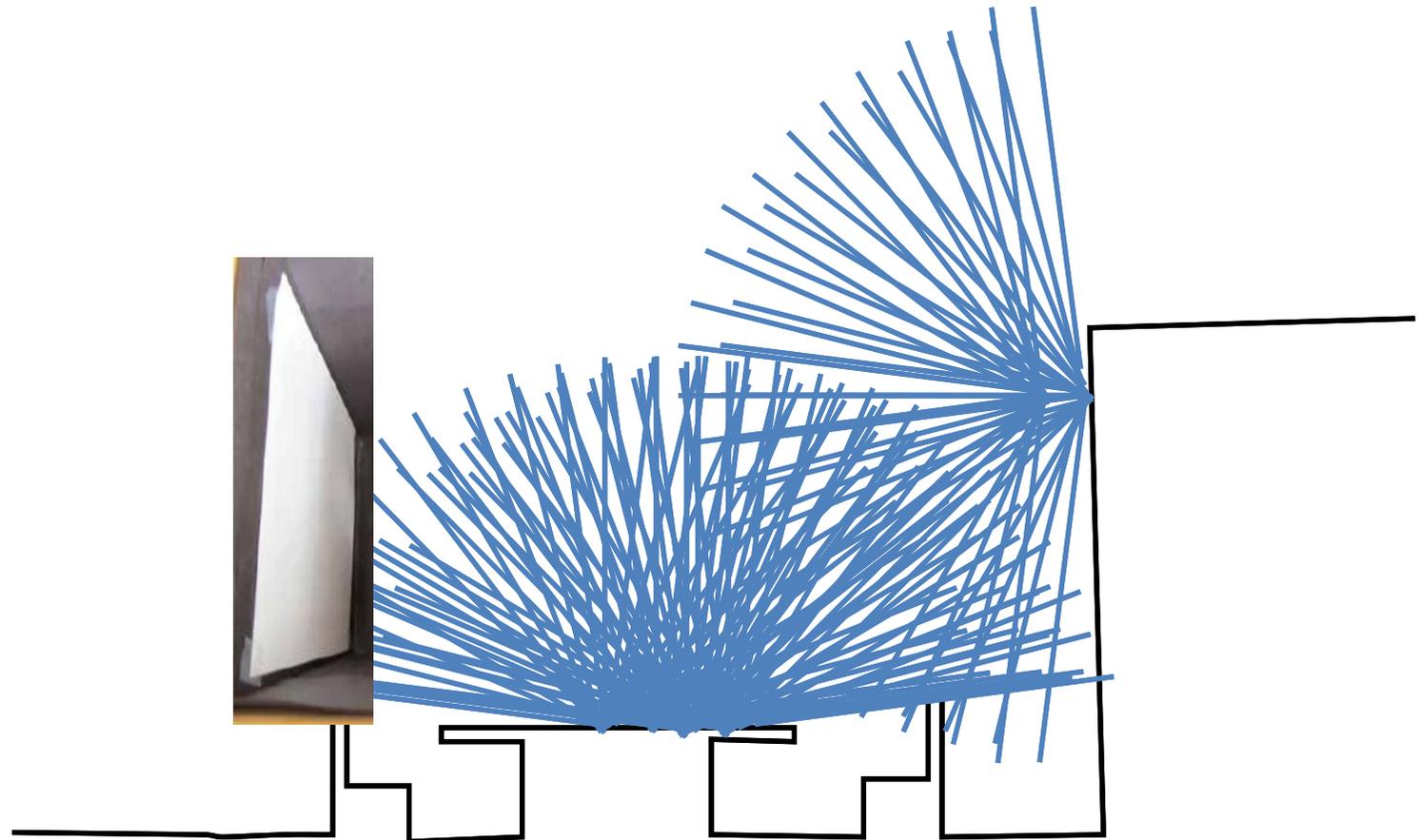


Measuring the Plenoptic Function

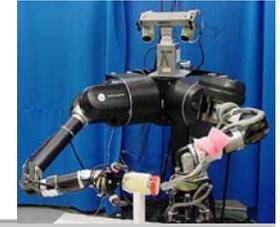
- *“The significance of the plenoptic function is this: The world is **made of 3D objects**, but these objects **do not communicate their properties** directly to an observer. Rather, the objects **fill the space** around them with the **pattern of light rays** that constitutes the plenoptic function,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



Measuring the Plenoptic Function

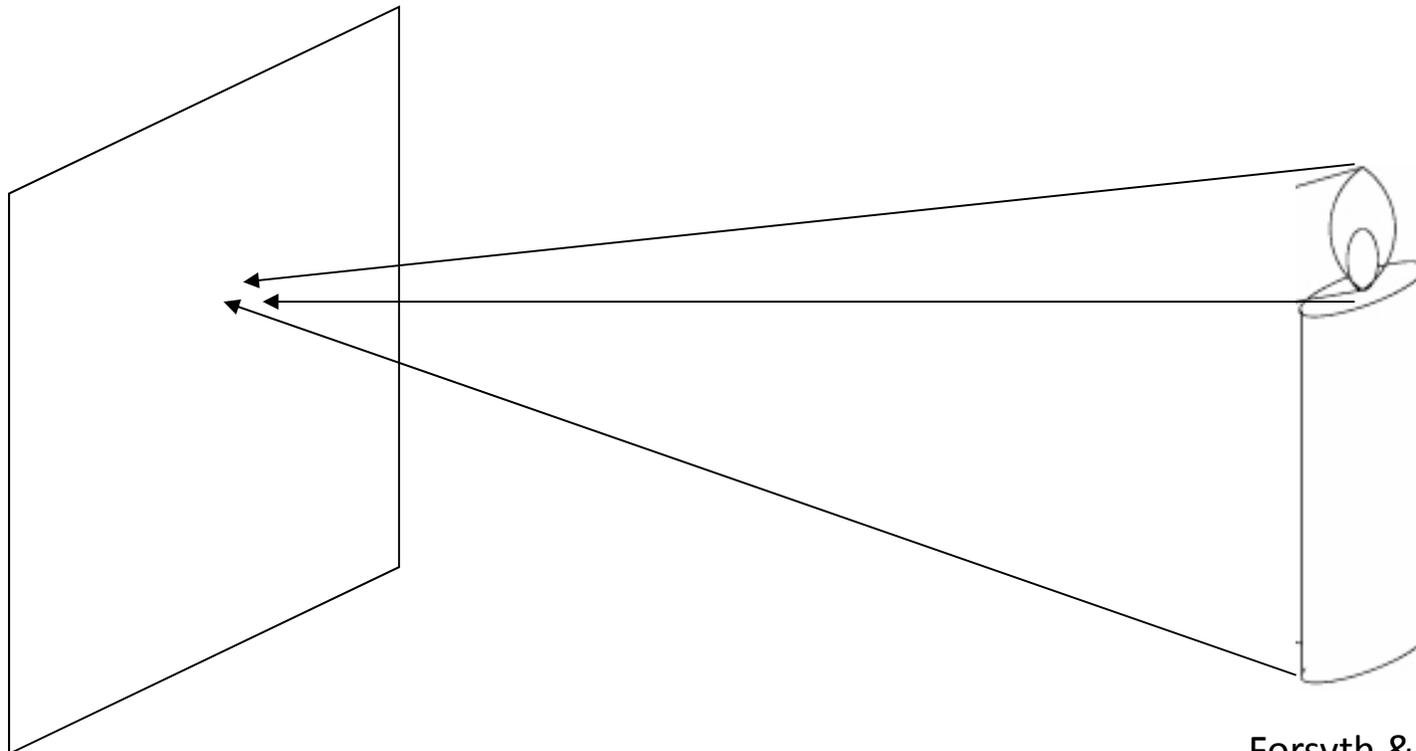


Why is there no picture appearing on the paper?



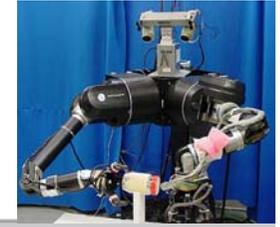
Measuring the Plenoptic Function

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



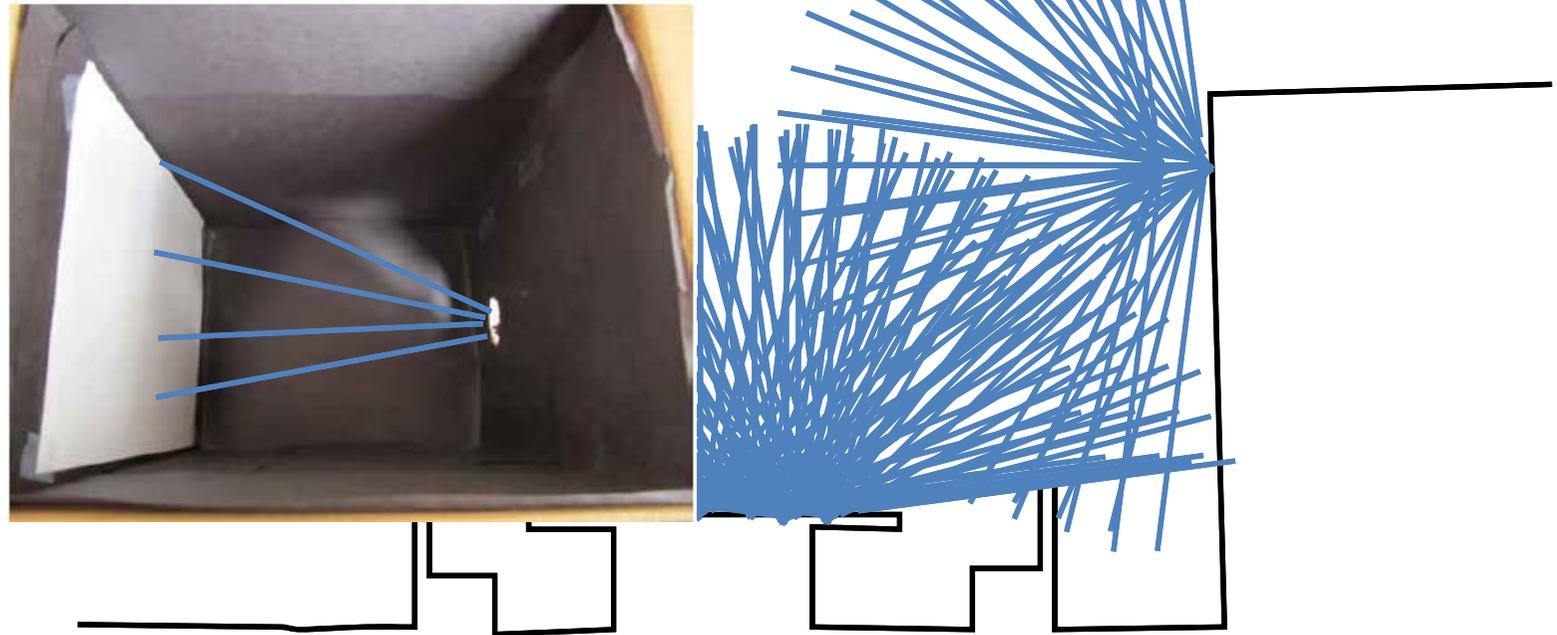
Forsyth & Ponce

Camera Obscura



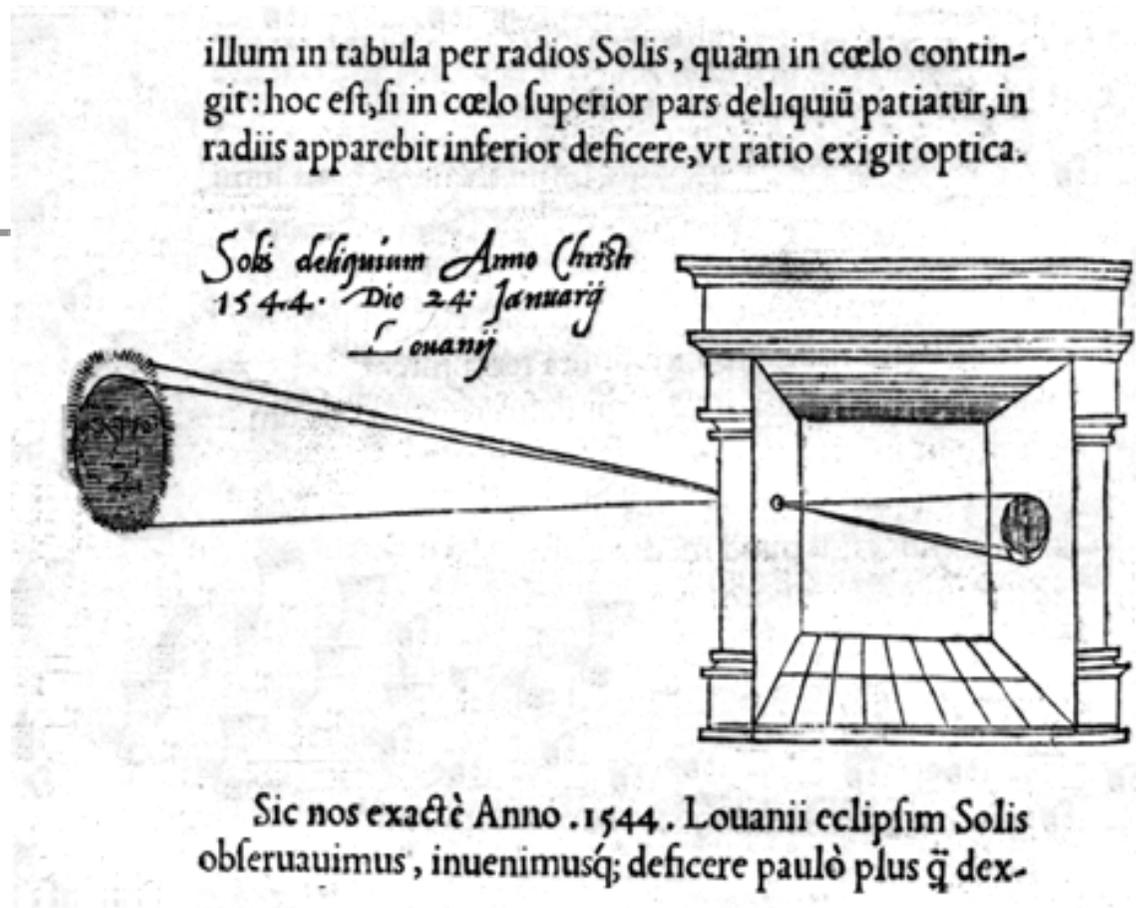
Measuring the Plenoptic Function

The camera obscura
The pinhole camera

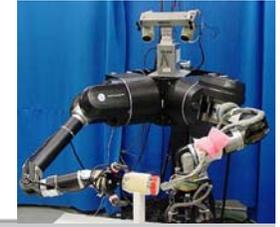


Camera Obscura

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

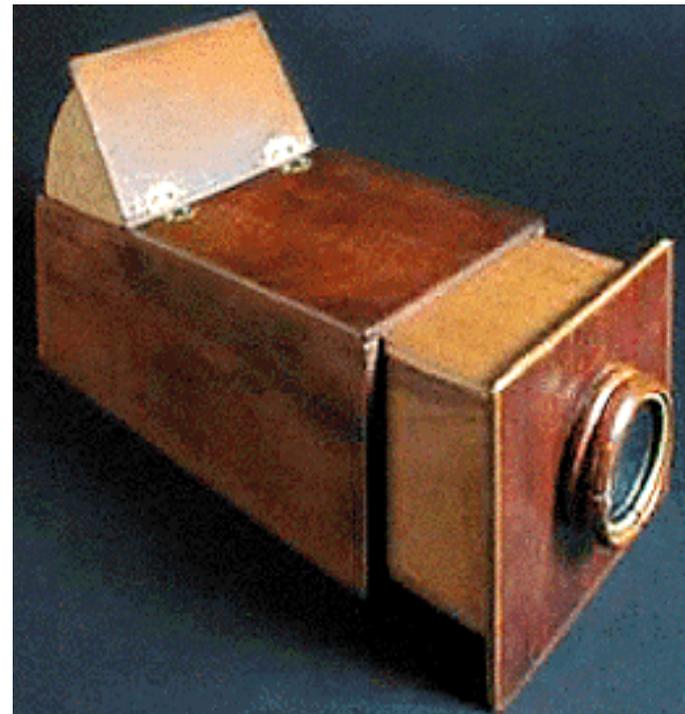
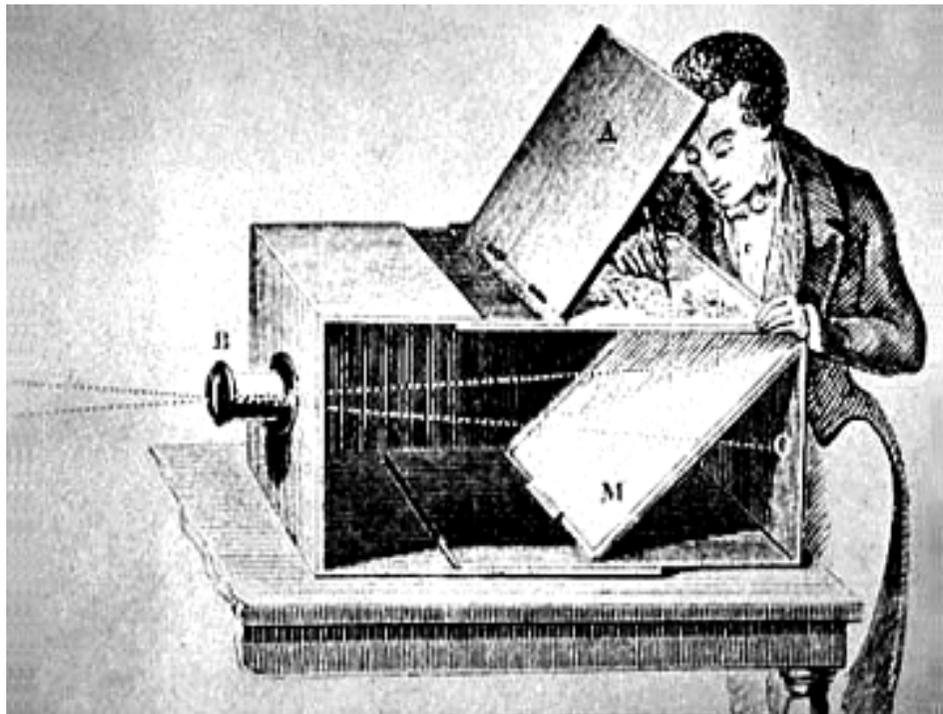


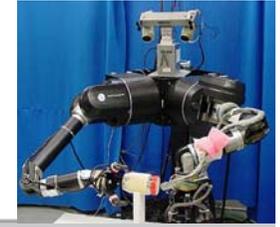
- "When images of illuminated objects ... penetrate through a small hole into a very dark room ... you will see [on the opposite wall] these objects in their proper form and color, reduced in size ... in a reversed position, owing to the intersection of the rays". - Da Vinci
http://www.acmi.net.au/AIC/CAMERA_OBSCURA.html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



Camera Obscura

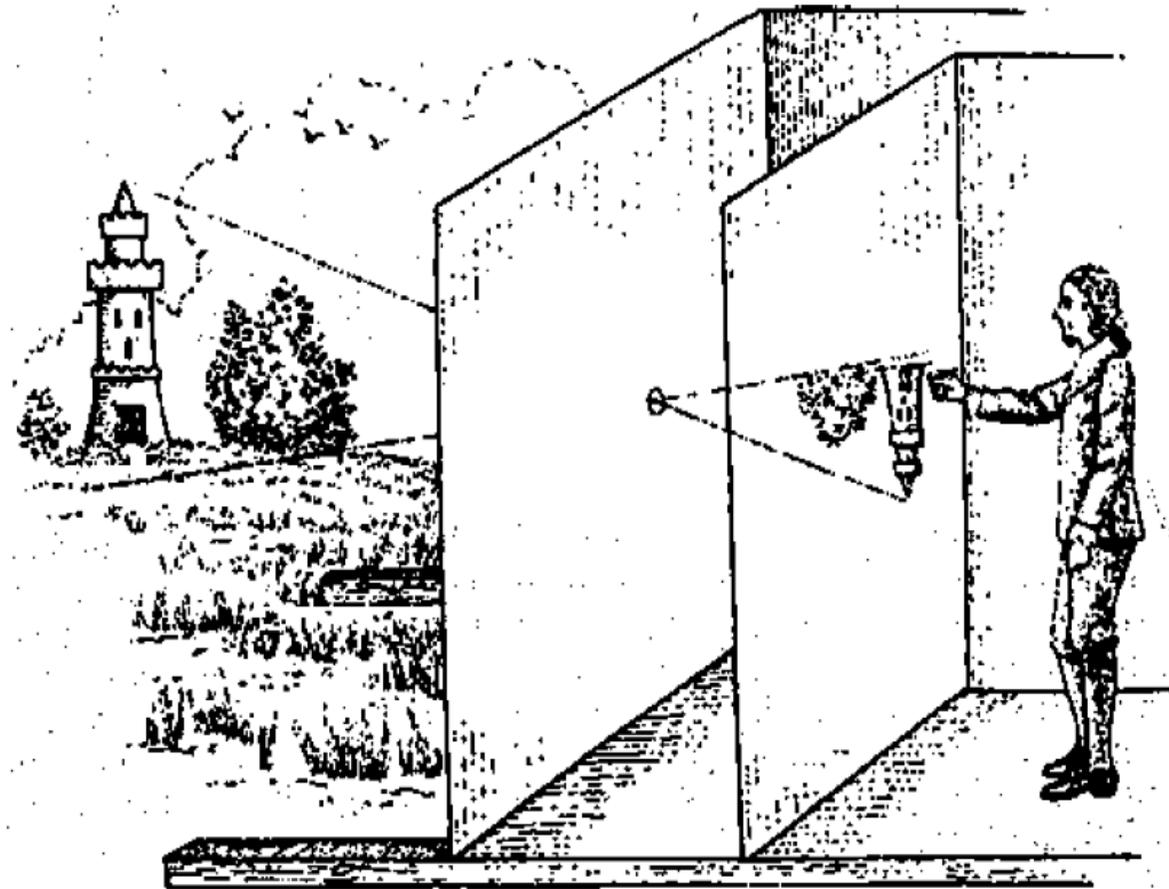
- Used to observe eclipses (eg., Bacon, 1214-1294)
- By artists (eg., Vermeer).





Camera Obscura

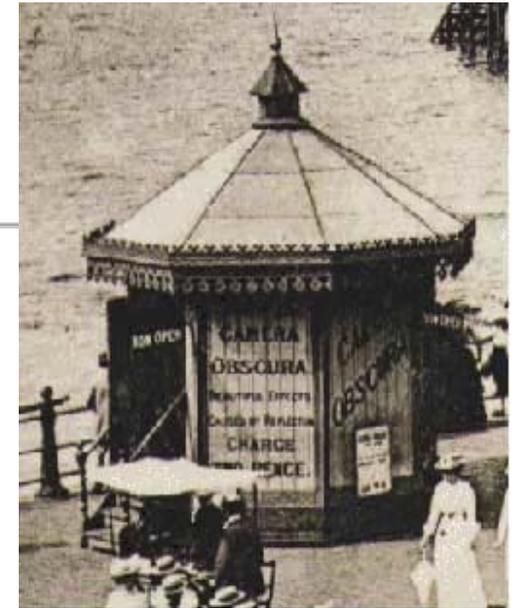
Drawing from "The Great Art of Light and Shadow"
Jesuit Athanasius Kircher, 1646.

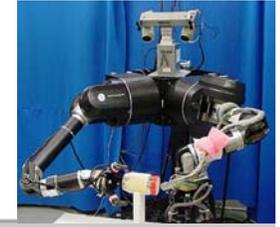


Camera Obscura



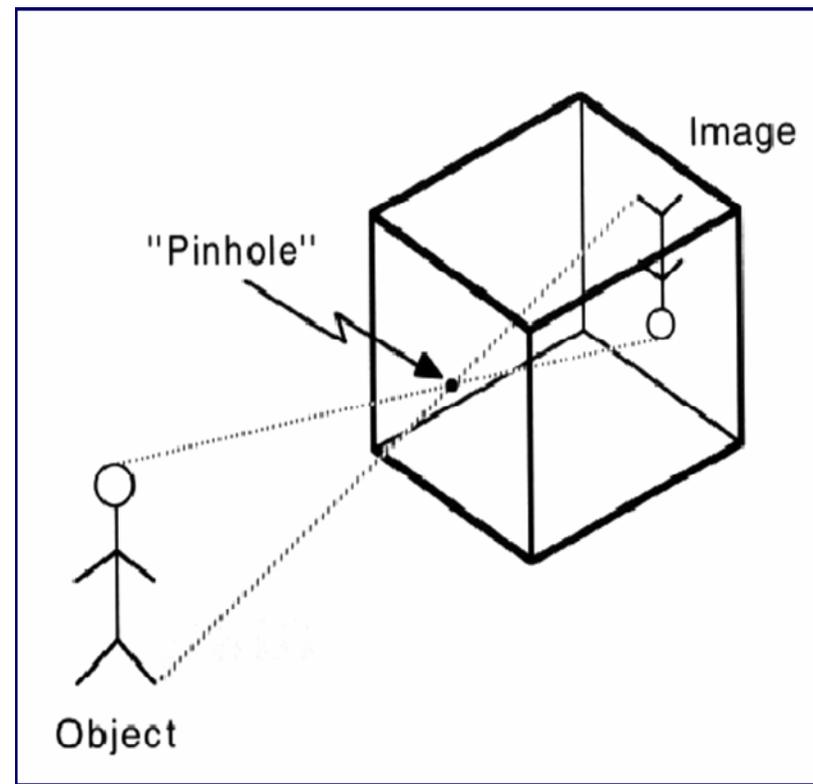
Jetty at Margate England, 1898.

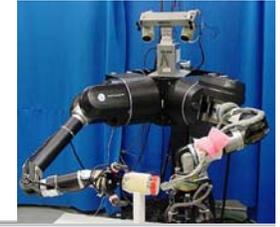




Pinhole Camera

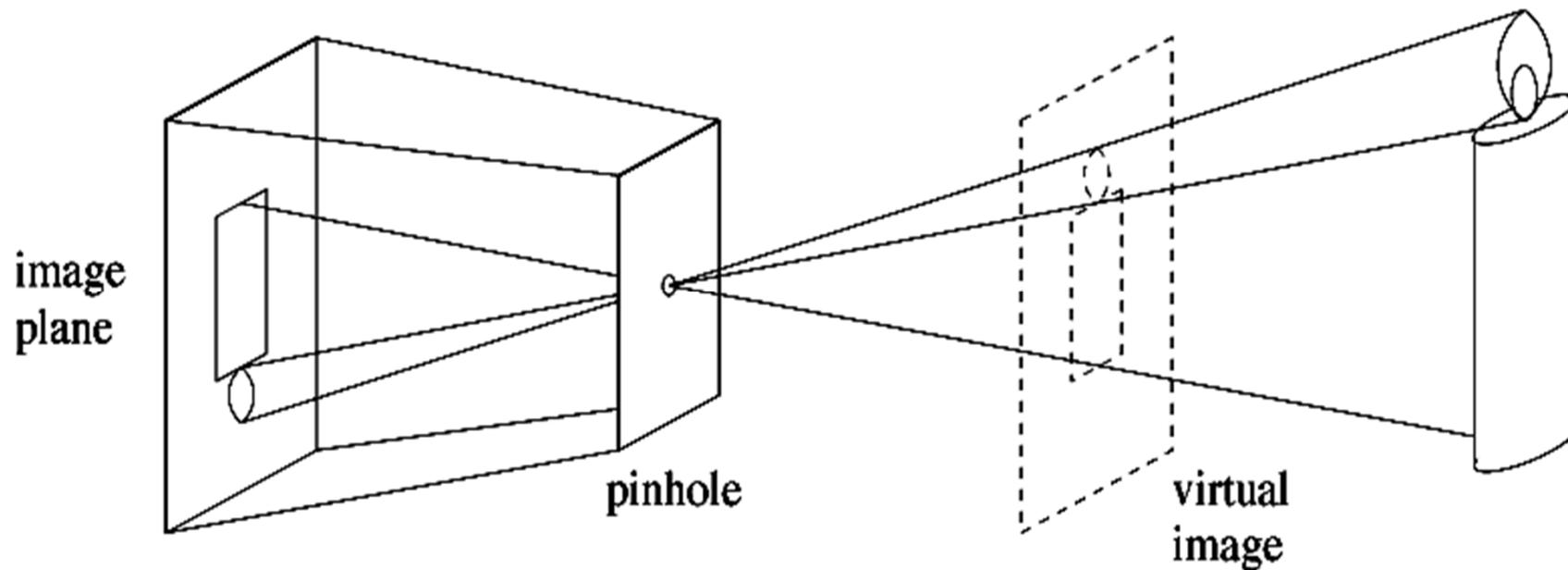
- Simple Model of Camera Obscura: Pinhole camera
 - Very small hole (aperture ~ 0), Light passes through the hole and forms image on back (upside down and flipped)



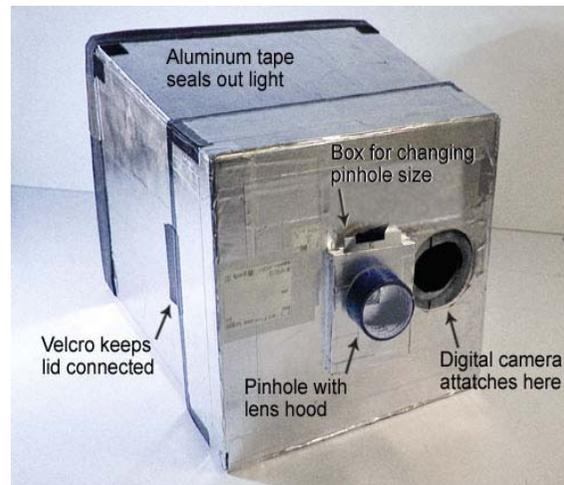
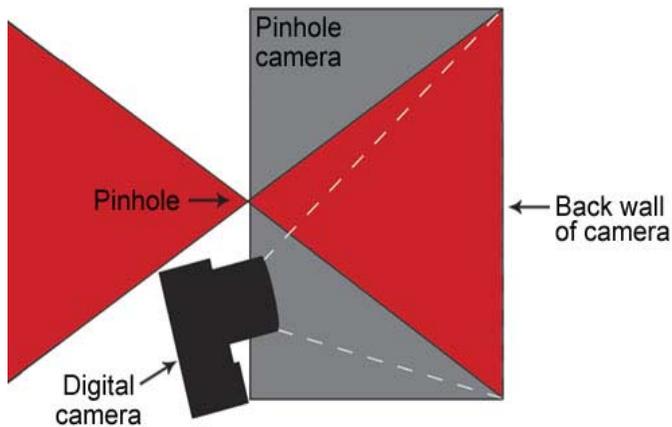


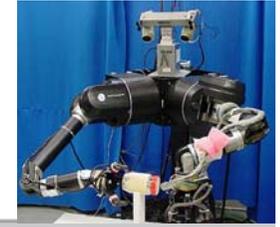
Pinhole Camera

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



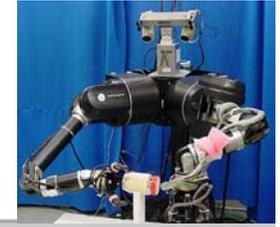
Commercial Pinhole Cameras



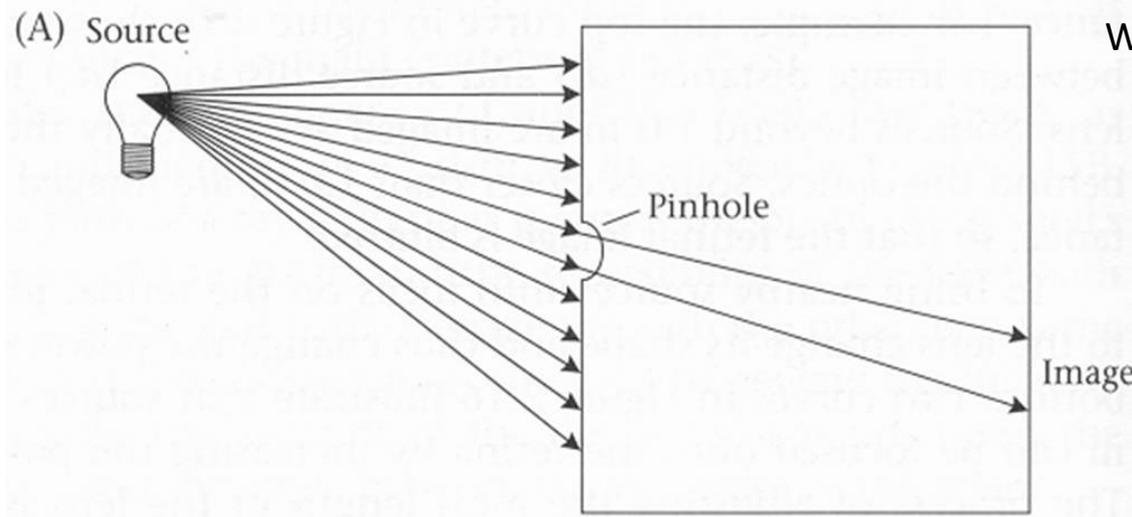


Playing with Pinholes

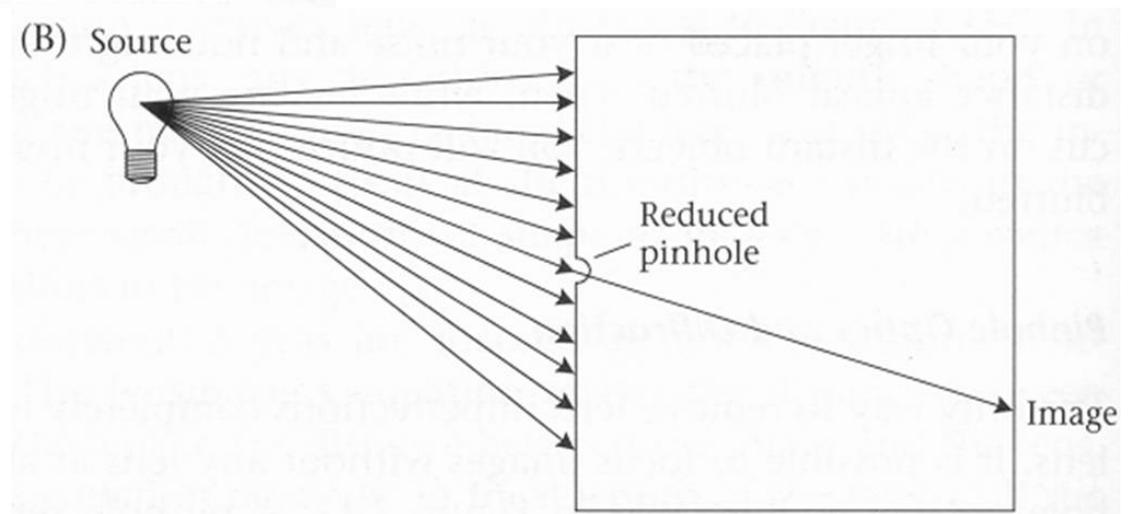


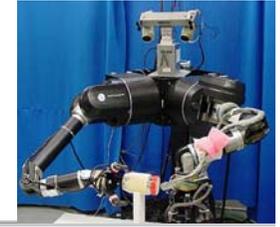


Effect of Pinhole Size



Wandell, Foundations of Vision, Sinauer, 1995





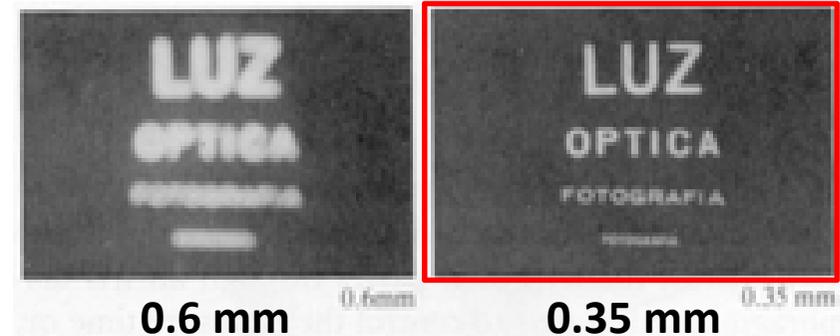
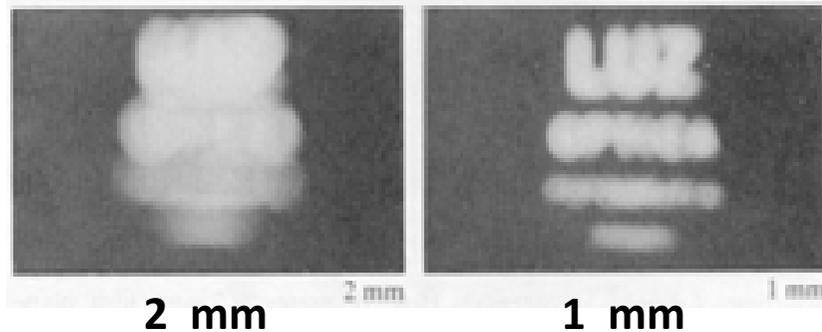
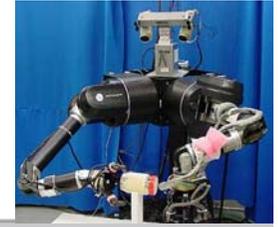
Limits of Pinhole Cameras

- 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

