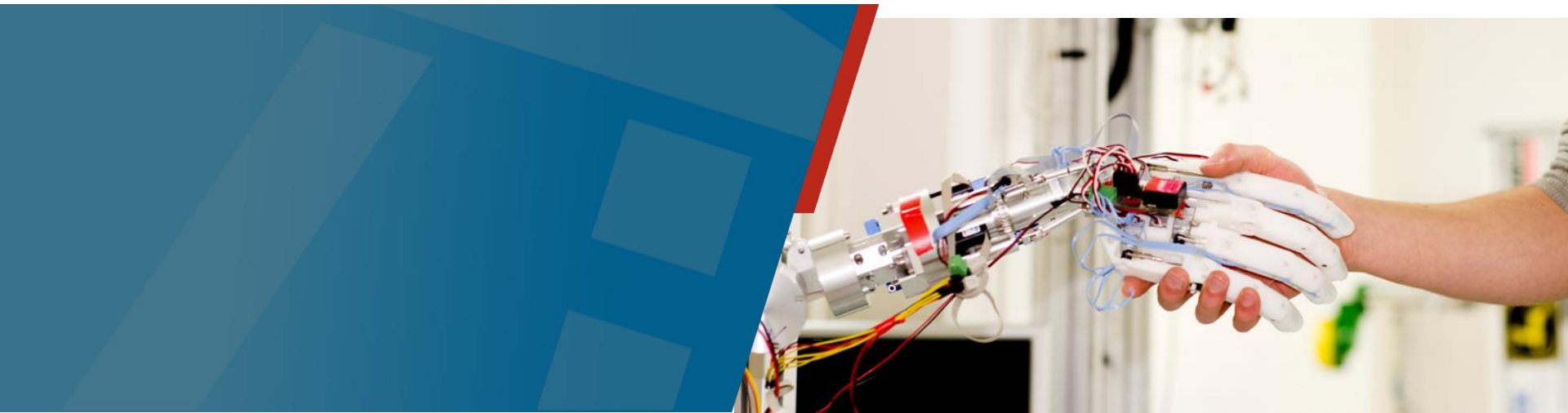


# Autonomous Mobile Robots (AMR)

## 3. Sensor Systems



**Prof. Dr. Karsten Berns**

Robotics Research Lab

Department of Computer Science

University of Kaiserslautern, Germany

# Contents

- Overview of Sensors in AMRs
- Force, Acceleration, Movement and Orientation
- Distance Sensors
- Vision Sensors

# Overview of Sensors in AMRs

## **Stereo System**

Long range

## **Stereo System**

Obstacle Detection

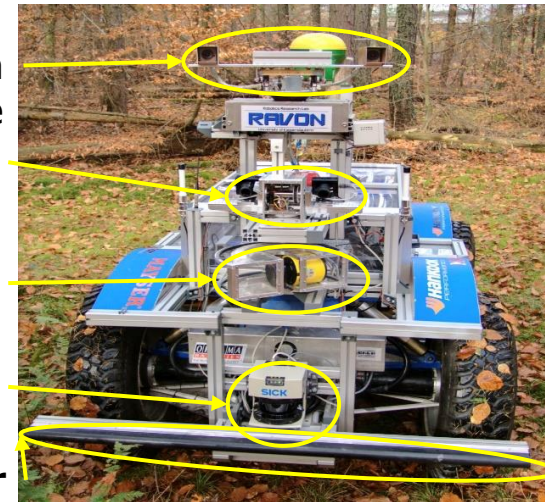
## **3D Laser Scanner**

Short term memory

## **2D Laser Scanner**

Safety System

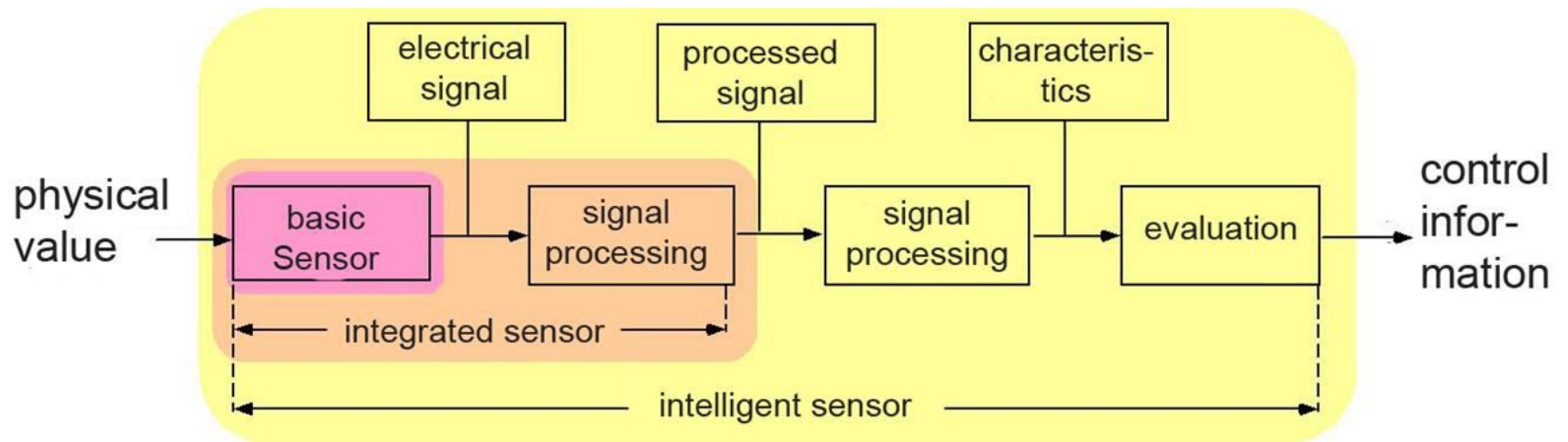
## **Ring-Mounted Bumper**



# Definition

- Sensor (lat.: sensus = sense): System to transform different kinds of physical values (e. g. force etc.) into proper electrical signals
- Integration levels
  - Basic sensor: measurement and transformation of the signals
  - Integrated sensor: additional signal processing incl. amplification, filtering, linearization and normalization
  - Smart sensor: integrated sensor with computer-controlled analysis of the processed signal

# Integration Level



# Sensor Classification: Proprioceptive

Acquisition of internal states of a robot/machine e. g.: joint position, joint velocity, joint acceleration, orientation

- **Position**
  - Potentiometer
  - Optical encoder
  - Differential transformer transducer
  - Magnetic-inductive encoder
- **Velocity**
  - Tachogenerator
  - Optical encoder
- **Acceleration**
  - Si-sensor
  - Piezo-electric sensor
- **Orientation**
  - Gyroscope
  - Geomagnetic sensor

# Sensor Classification: Exterceptive

Acquisition of external states ( $\Rightarrow$  environment) e. g.:  
obstacle distance, object identification, object position

- “Feel”
  - Artificial skin
  - Sliding sensors
  - Force-torque-sensors
- Approach
  - Inductive, capacitive sensors
  - Optical sensors
  - Acoustic sensors

# Sensor Classification: Exterceptive

- Distance
  - Optical sensors
  - Radar sensors
  - Acoustic sensors
- Position
  - (Differential) GPS
  - Ground-based radio-systems
  - Natural/artificial landmarks
- Vision
  - Cathode ray tube cameras
  - CCD-cameras
  - CMOS-cameras



# Classification Active/Passive

- Active sensors
  - Stimulation of the environment
  - Detection of response
  - Examples: ultrasound sensor, laser-scanner
- Passive sensors
  - Detection of already present signals
  - Examples: camera, microphone
- Task of sensor system
  - Detection of a time dependent environment

# Classification of Sensors

Classification	Sensor System	PC or EC	A or P
Tactile sensors (detection of physical contact or closeness; security switches)	Contact switches, bumpers Optical barriers Noncontact proximity sensors	EC EC EC	P A A
Wheel/motor sensors (wheel/motor speed and positions)	Brush encoders Potentiometers Synchros, resolvers Optical encoders Magnetic encoders Inductive encoders Capacitive encoders	PC PC PC PC PC PC PC	P P A A A A A
Heading sensors (orientation of the robot in relation to a fixed reference frame)	Compass Gyroscopes Inclinometers	EC PC EC	P P A/P

A, active; P, passive; P/A, passive/active;  
PC, proprioceptive; EC, exteroceptive – [Siegwart04]

# Classification of Sensors

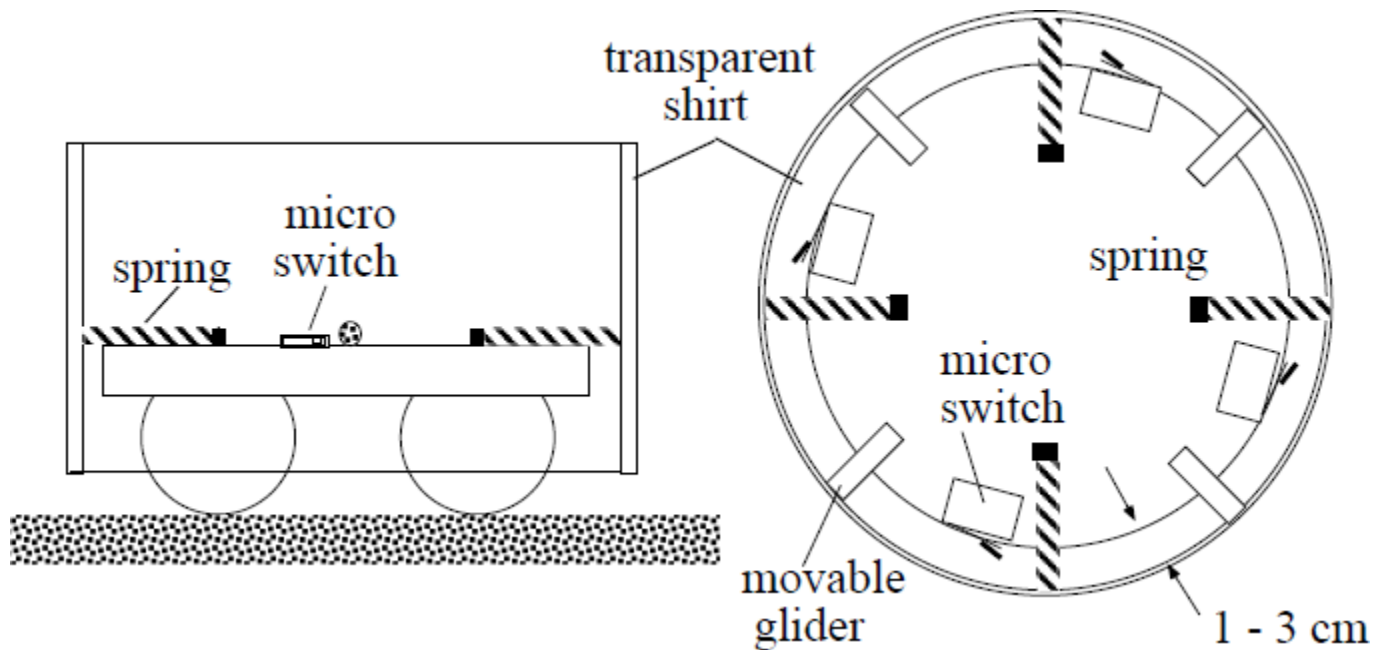
Classification	Sensor System	PC or EC	A or P
Ground-based beacons (localization in a fixed reference frame)	GPS	EC	A
	Active optical or RF beacons	EC	A
	Active ultrasonic beacons	EC	A
	Reflective beacons	EC	A
Active ranging (reflectivity, time-of- flight, and geometric triangulation)	Reflectivity sensors	EC	A
	Ultrasonic sensor	EC	A
	Laser rangefinder	EC	A
	Optical triangulation (1D)	EC	A
	Structured light (2D)	EC	A
Motion/speed sensors (speed relative to fixed or moving objects)	Doppler radar	EC	A
	Doppler sound	EC	A
Vision-based sensors (visual ranging, whole- image analysis, segmentation, object recognition)	CCD/CMOS camera(s) Visual ranging packages Object tracking packages	EC	P

# Forces, Acceleration, Orientation



# Bumper

- Last resort before crashing
- Emergency break
- Consumes part of the impulse



Sketch of a simple bumper (sideview and bird's eye view)

# Magnetic Wheel Encoders

Various measurement principles:

- Measurement of the number of magnetic pole changes of magnets at the perimeter of a disk
- Hall effect sensors
- Tacho generator: voltage produced by an electric generator turned by the wheel

# Optical Wheel Encoders

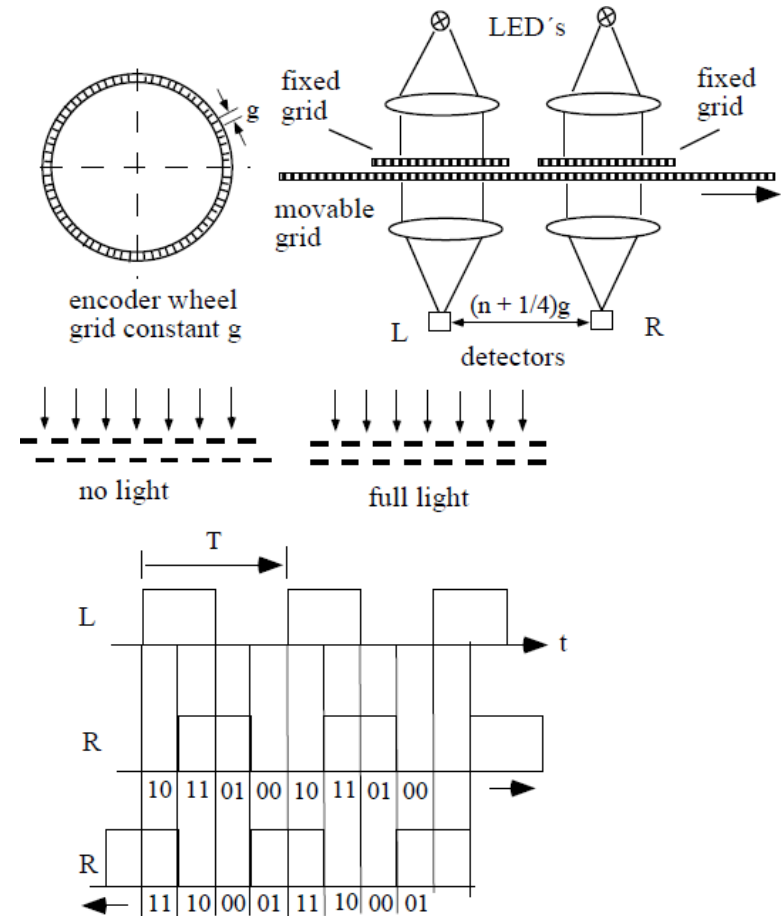
- Measurement principles
  - Distance measurement by number of ticks produced by a grid passing a light barrier
  - Two grids: one fixed to the vehicle chassis, the other one turning with the wheel
- Vehicle motion might be tracked simply by counting the number of ticks at the wheels resulting in the distance travelled  $s$

$$s = 2\pi r \cdot \frac{n}{n_0}$$

- $n$  number of ticks measured
- $n_0$  number of ticks for a full revolution of the wheel
- $r$  wheel radius

# Optical Wheel Encoders: Direction Determination

- Two light barriers  $(n + \frac{1}{4})$  grid constants apart
- Two signals, phase difference of  $90^\circ \Rightarrow$  determine direction
- Typical: grid of 4096 equidistant transparent and non transparent areas (resolution: 12 Bit,  $0.1^\circ$ )



Measurement principle of a wheel-encoder  
 Quadraturzähler,  $4096 \frac{\text{steps}}{\text{revolution}} \Rightarrow 12 \text{ Bit, Resolution} < 0.1^\circ$



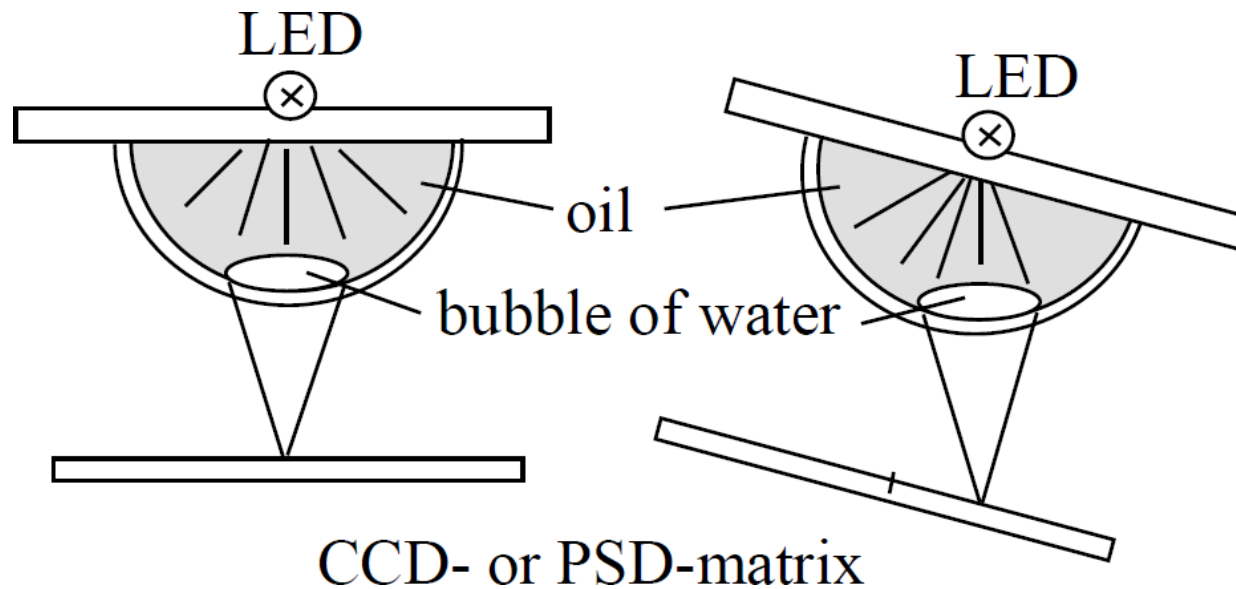
# Inclinometers

- Application of inclinometers: measurement of upward/downward orientation, measurement of shifts to a side with the danger of toppling or falling to the side
- Measurement of inclination in two axes required
- Measurement principles
  - Optical inclinometers: liquid under the influence of gravity
  - Capacitive inclinometers: dielectric liquid in capacitor
  - Acceleration sensors: measure direction of gravity

# Optical Inclinometers

- Usage of a droplet of liquid under the influence of gravity
- In a transparent half-sphere plastic bowl filled with oil a droplet of water forms a lens at the bottom, because water is more dense than oil
- The light of a LED is projected by that lens onto a CCD-matrix or PSD-matrix
- Any inclination shifts the droplet and so the picture of the LED at the CCD-matrix, indicating the amount of inclination
- An oil of suitable viscosity damps the movement of the water droplet to damp jitter from movements over uneven ground

# Optical Inclinometers



Measuring principle of an optical  
inclinometer

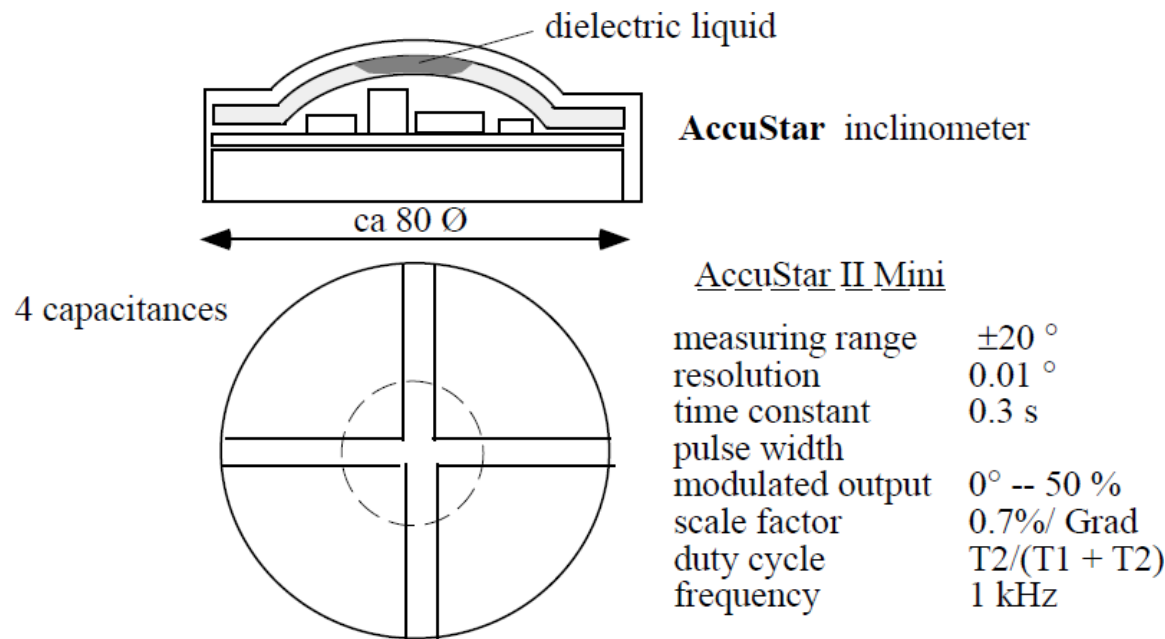
# Capacitors

- Stores Charge
- Capacity  $C = \epsilon_0 \cdot \epsilon_r \cdot \frac{A}{d}$
- $\epsilon_0 = 8,8pFm^{-1}$  (Permittivity of a vacuum)
- $\epsilon_r$  (no unit): relative permittivity
- Unit of capacity: Farad ( $F$ ) where  $1F = 1AsV^{-1}$

Material	$\epsilon_r$
Air	1,000576
SiO <sub>2</sub>	3,9
PVC	3,0 – 6,0
Si pure	11,7
Al <sub>2</sub> O <sub>3</sub>	6,0 – 9,0
Barium titanate	20000

# Capacitive Inclinometers

- Dielectric liquid drop floats between the plates of a capacitance
- Any tilt shifts the drop to the side and changes the capacitances in a quad capacitance measuring device



Measurement principle of a capacitive inclinometer

# MEMS

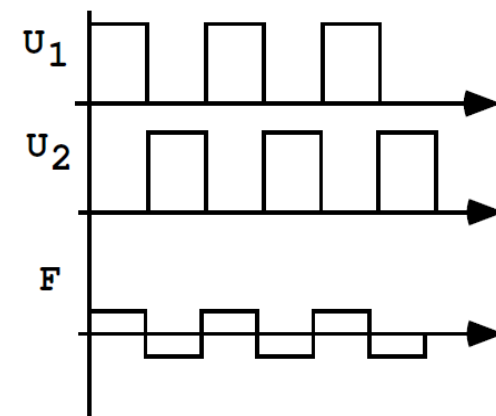
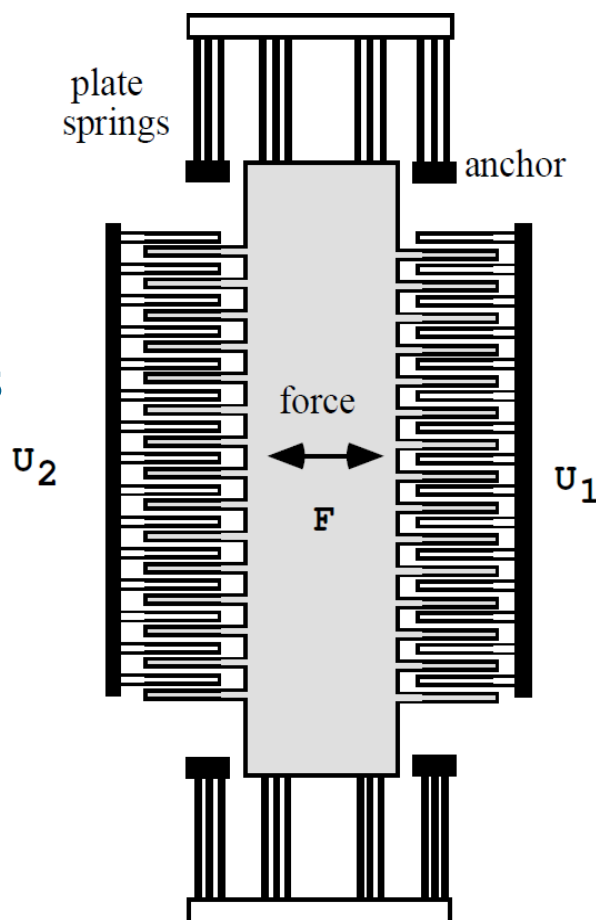
- Micro-Electro-Mechanical System
- Integration of complex electro mechanical systems into bulk silicon
- Silicon: material with good properties for this type of application, very well understood from decades of producing integrated circuits
- Same technique used for ICs is applied to etch out free swinging beams of silicon anchored to the bulk material at few points only
- Measurement principle: pair of capacitors, measure very small distance variations under acceleration
- Central difficulty: earth acceleration far larger than vehicle acceleration  $\Rightarrow$  orientation information required to remove unwanted gravity forces from the measurement results

# MEMS: Measurement Principle

- A mass anchored to the bulk by plate springs is forced into oscillations by a comb of slabs acting as capacitors.
- Typical dimensions of the slabs
  - $s = 125 \mu\text{m}$
  - Thickness  $b = 1 \mu\text{m}$
  - Distance to the next slab  $d = 1 \mu\text{m}$
- The force is multiplied by the number of combs gripping into each other
- One direction only, but activating two combs at each side of the mass alternatively switching the voltage driving the combs, one voltage may set the system into oscillations
- Typical frequencies: approx. 20 kHz
- Typical voltage: 5 V
- Small forces sufficient: damping of the system is low

# MEMS

- Driving the capacitors by two voltages with  $180^\circ$  phase shift; resulting signal after synchronous demodulation is proportional to the difference in capacitances and measures the deviation  $\Delta d$
- Measuring frequency is much larger than the oscillation driving frequency  $\Rightarrow$  no interference



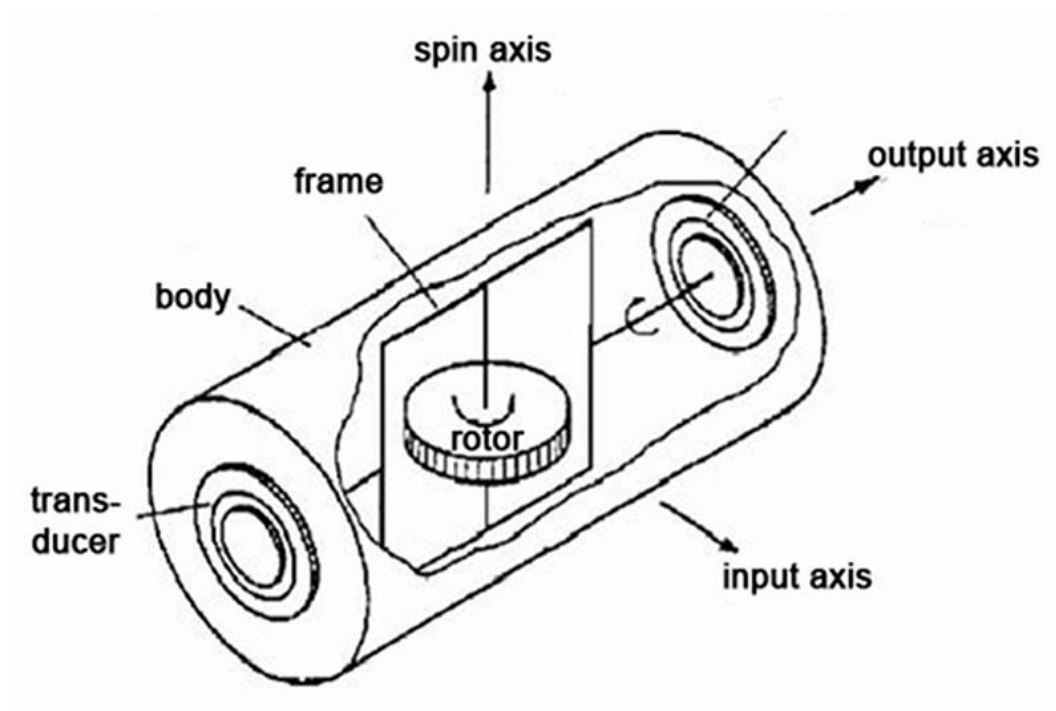
## Forced Oscillations



# Gyroscopes

- Torque applied to the input axis (cause)
- Gyro rotation around the spin axis (mediator)

=> rotation around the output axis (effect)

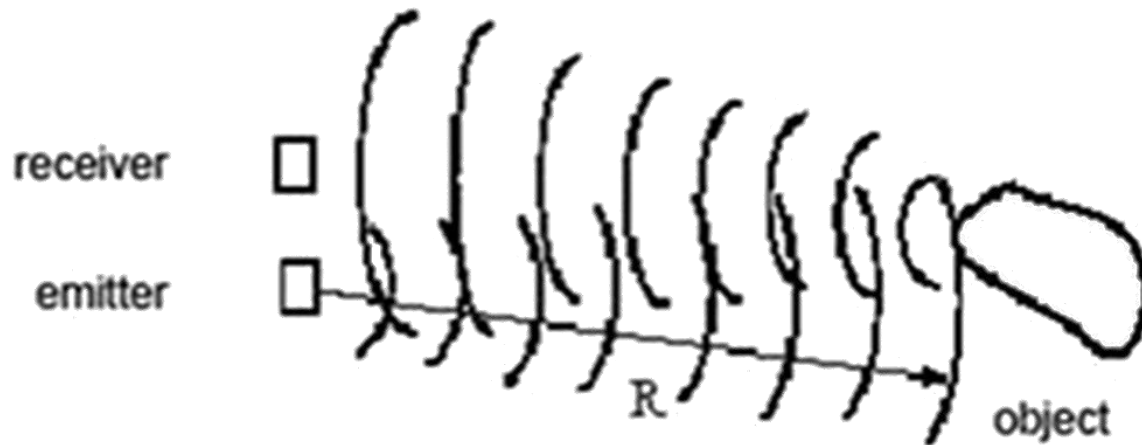


# Distance Sensors



## Active Distance Sensors

- Energy (sound, light, microwaves, etc.) is emitted
- Runtime/direction of the reflected energy is measured
- => Distance to objects by characteristic velocity and runtime



Principle of active distance detection

# Energy at Object

$$\blacksquare f(R) = \begin{cases} a \cdot \text{const} \\ \frac{a}{R^2} \\ e^{-\frac{R}{\gamma}} \cdot \frac{a}{R^2} \end{cases}$$

- Laser, tightly bundled beam
- Object absorbs energy portion  $a$
- Absorbance of the medium
- (e. g. light in muddy water)

- $I_0$  Intensity of the emitted signal at emitter location
- $I_R = I_0 \cdot f(R)$  Signal intensity at object location (distance  $R$ )

# Detector Intensity

- Reflected signal at the objects location:  $I_1 = A \cdot \rho(\alpha) \cdot I(R)$

$$A = \begin{cases} \text{object surface area for normal source} \\ \text{area of laser beam (diameter } \emptyset), \\ \text{if surface area} > \frac{\pi}{4} \emptyset^2 \end{cases}$$

- $\rho(\alpha)$ : Reflectivity 99 % with mirror-like surfaces and  $\alpha \approx 0$ , 0.01 % with highly absorbing surfaces
- Intensity at the detector
- $I(D) = I_1 \cdot f_2(R) \cdot B = A \cdot I_0 \cdot \rho(\alpha) \cdot f(R) \cdot f_2(R) \cdot B$

# Detector Intensity

$$f_2(R) = \begin{cases} \frac{b}{R^2} \\ \frac{b}{R^2} \cdot e^{-\frac{R}{\gamma}} \end{cases}$$

- $b$ : Ratio of energy absorbed by the detector
- $B$ : Detector surface area
- $I(D) = A \cdot B \cdot \frac{1}{R^4} \cdot I_0 \cdot \rho(\alpha) \cdot a \cdot b$
- $A$ : object surface area
- $B$ : detector surface area
- $I_0$ : emitter intensity
- $\rho(\alpha)$ : object reflectivity
- $a, b$ : opening coefficient of detector/object

## Examples – Intensity at Detector

- Intensity at the detector if laser is used

- $$I(D) = \frac{\pi}{4} \cdot \varnothing^2 \cdot B \cdot \frac{1}{R^2} \cdot I_0 \cdot \rho(\alpha) \cdot a \cdot b$$

- Intensity at the detector with normal light and absorbance

- $$I(D) = A \cdot B \cdot \frac{1}{R^4} \cdot I_0 \cdot \rho(\alpha) \cdot a \cdot b \cdot e^{-\frac{2R}{\gamma}}$$

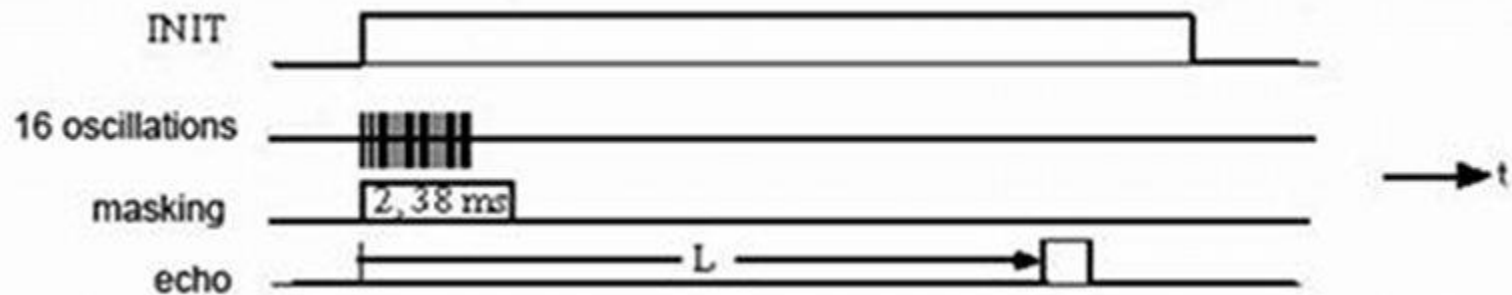
# Ultrasonic Sensor

- Short sound impulses generated and emitted to object
- Time until first echo returns is measured (SONAR = SONic Automatic Ranging)
- Speed of sound:  $c_{us} = 300 \text{ m/s}$  (air),  $c_{us} = 1500 \text{ m/s}$  (water)
- Frequencies: usually 25, 50, 100 kHz (wavelength in air 13, 6.6, 3.3 mm)
- Range in air very limited due to strong absorbance ( $\approx 10 \text{ m}$ )
- 50 wave trains emitted at one time at 50 kHz (1 ms)
- Distance  $d$  to object with runtime  $L$

- $d = c_{us} \cdot \frac{L}{2}$



# Ultrasonic sensor

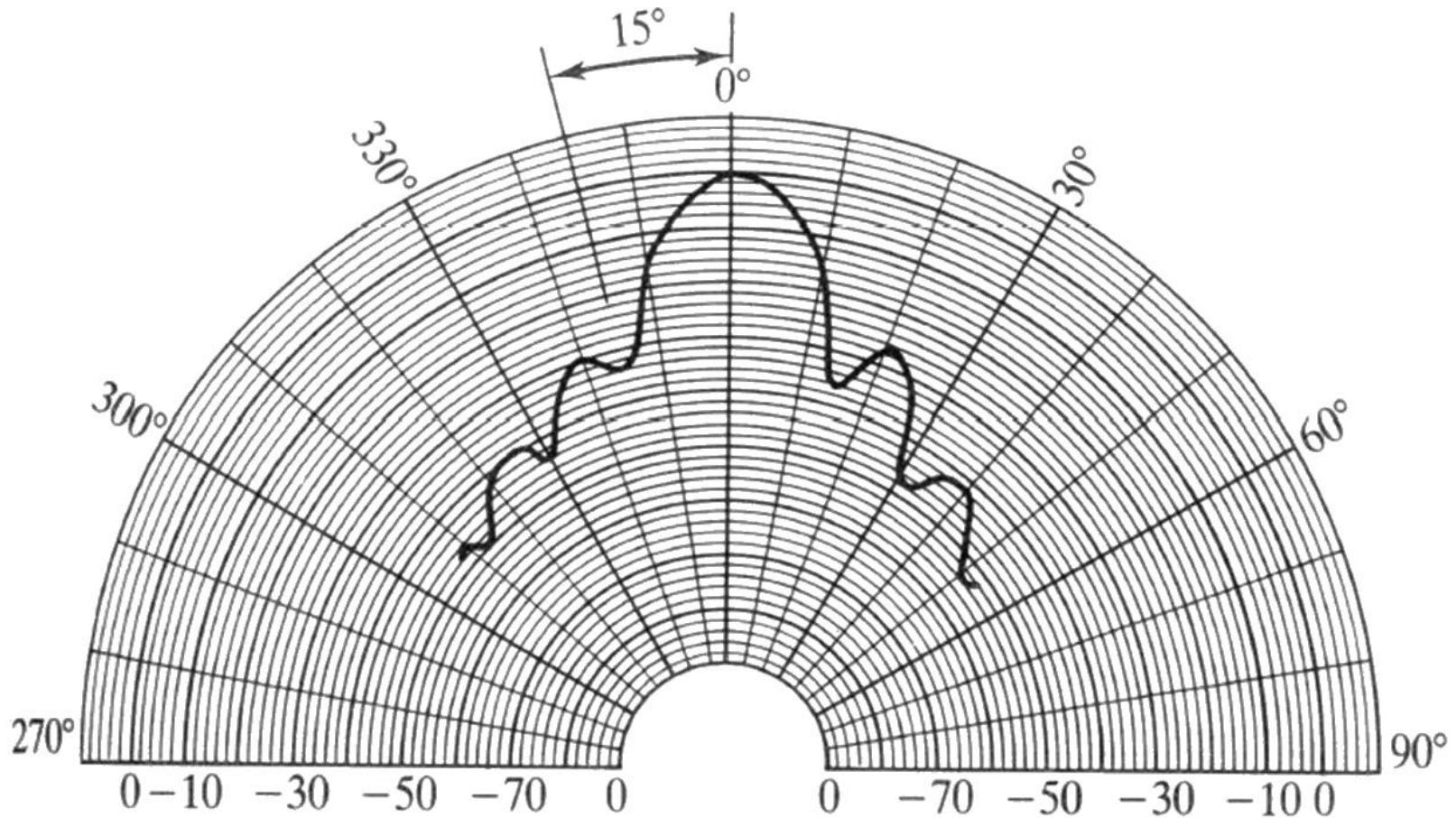


Principle of ultrasonic distance measurement

# Ultrasound in Air

- Propagation with steady velocity
- Velocity is temperature dependent
- 330 m/s (0 °C)
- 343 m/s (20 °C)
- 355 m/s (40 °C)
- Sensors have to be adjusted to temperature
- Half of the elapsed time divided by the speed of sound results in the distance of the object

# Propagation of the Ultrasonic Waves

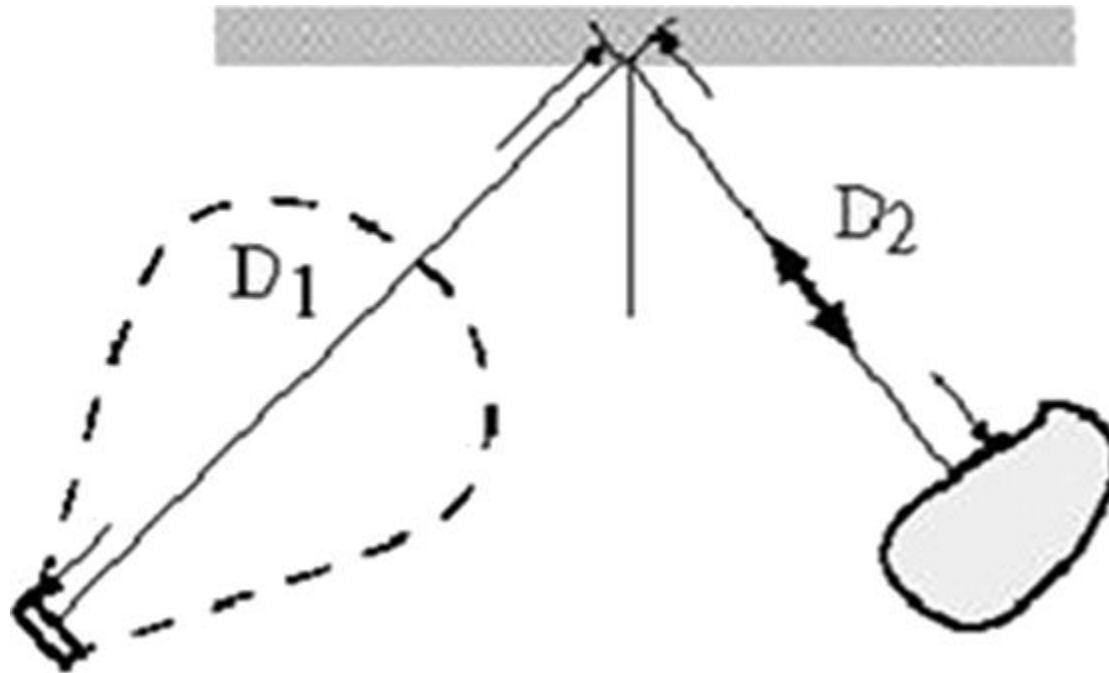


Propagation of the ultrasound waves

# Properties of Ultrasonic Measurements

- Recognition improves with increasing surface area of the object facing the sensor
- Big objects with rough surfaces are best suited for recognition (Surface is considered rough, if roughness is bigger than the wavelength of the signal)
- Object transparency makes no difference to sensor (Advantage to optical systems)
- Small objects tend to reflect small amounts of the signal
- Wave distribution of smooth surfaces is too low (invisible at some angles)
- Smooth surfaces detection improves as wavelength declines

## Problems: Reflexions



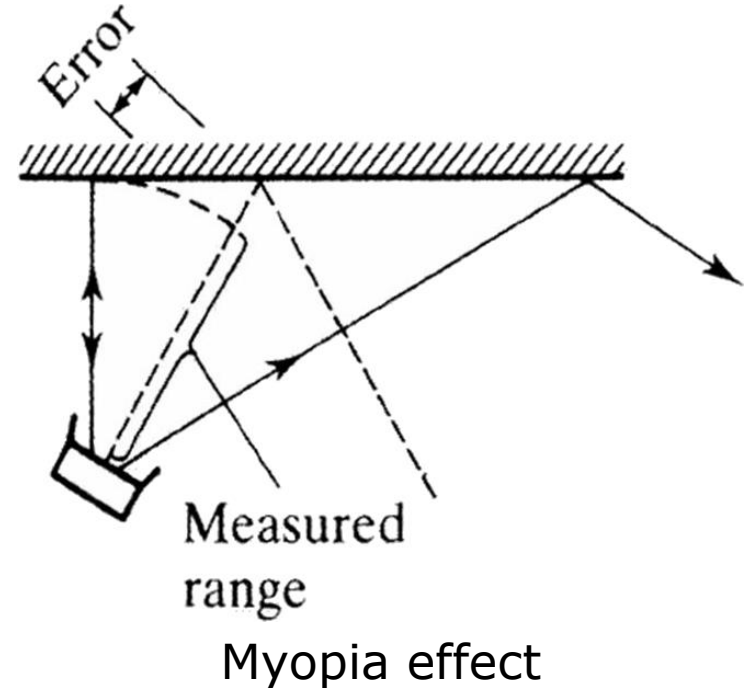
Pretended distance  $D_1 + D_2$  due to reflexion at invisible surface

## Problems: Reflexions

- Reflection on smooth walls:  $f = 49 \text{ kHz} \Rightarrow \lambda = 6.75 \text{ mm}$   
 $\Rightarrow$  all surfaces with roughness of less than 6 mm appear smooth to ultrasound sensor
- Heavily absorbing surfaces reflect a too weak echo  
 $\Rightarrow$  only detection of very close objects
- Large opening angle ( $30^\circ$ )
- Unable to detect precise direction
- Produces “crosstalk” with transducers close by

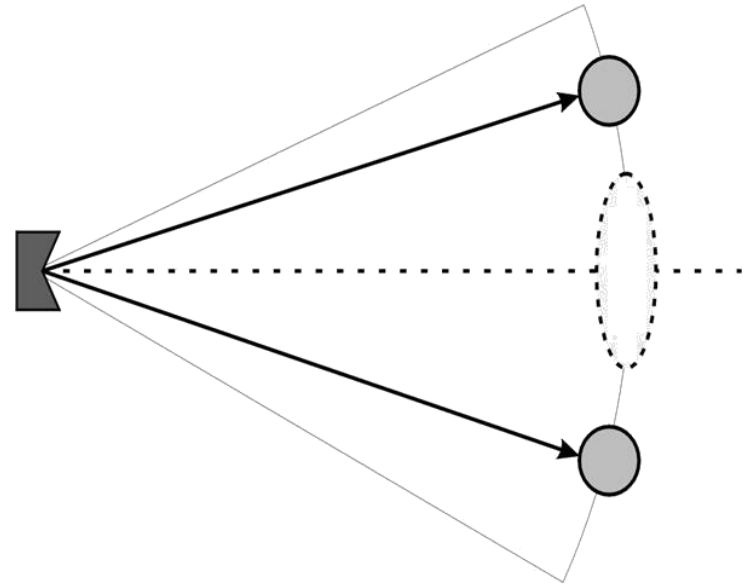
## Problems: Myopia (Near-sightedness)

- On diagonal objects waves are reflected at different points in time
- The larger the opening angle, the worse the possible error
- Diagonal objects appear closer than they are



## Problems: Virtual Obstacles

- Several obstacles at the same distance may be interpreted as a single object
- Can be avoided when more than one sensor is used
- The bigger the opening angle, the bigger the likeliness for a “virtual wall”

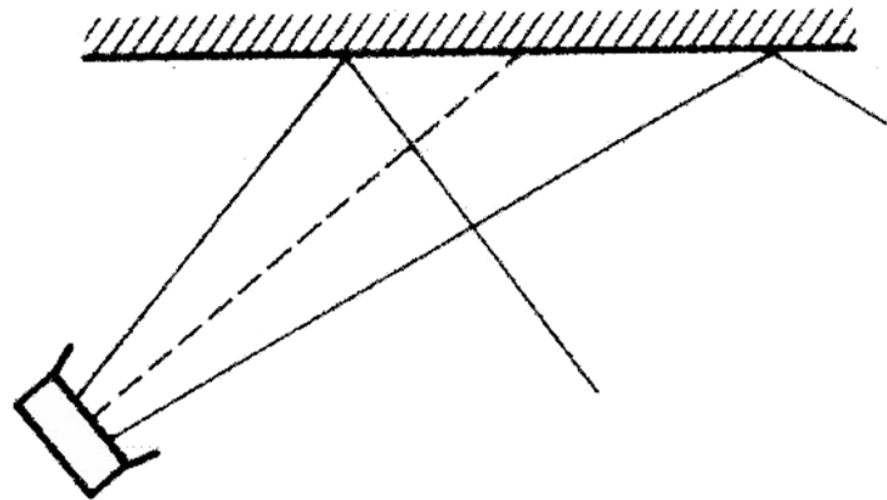
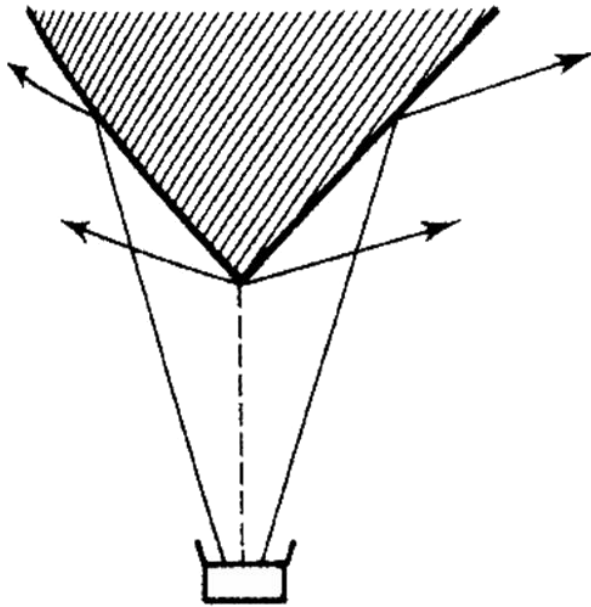


Virtual obstacle is indicated by the sensor



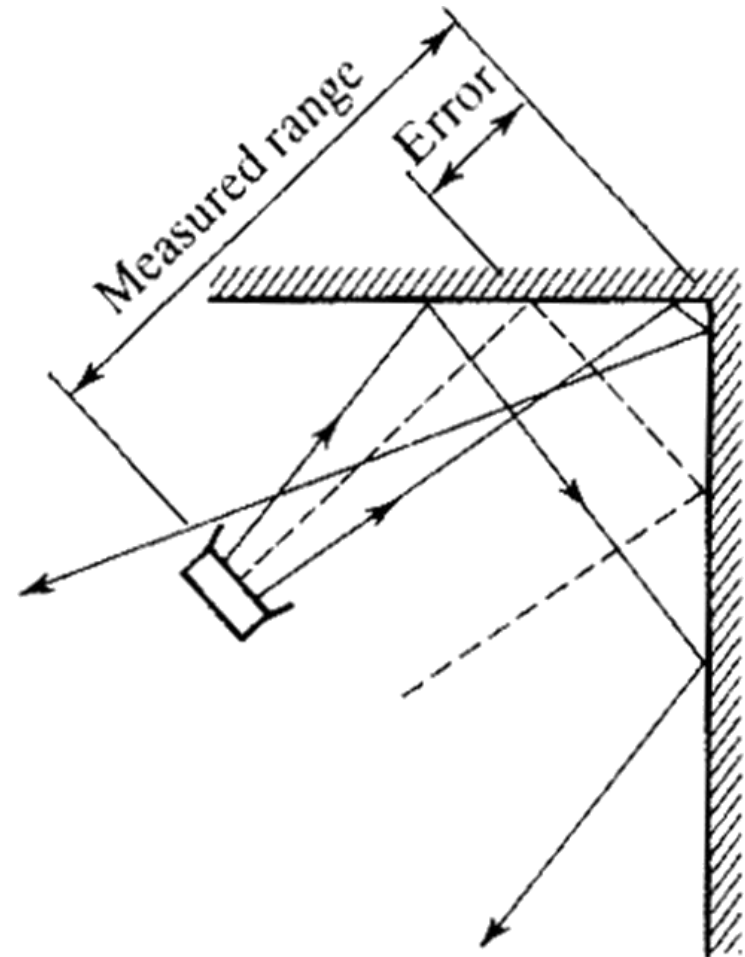
## Problems: Total Reflexion

- At unfavorable angles the sound waves are completely reflected away
- In certain situations walls might not be detected



## Problems: Multiple Reflexions

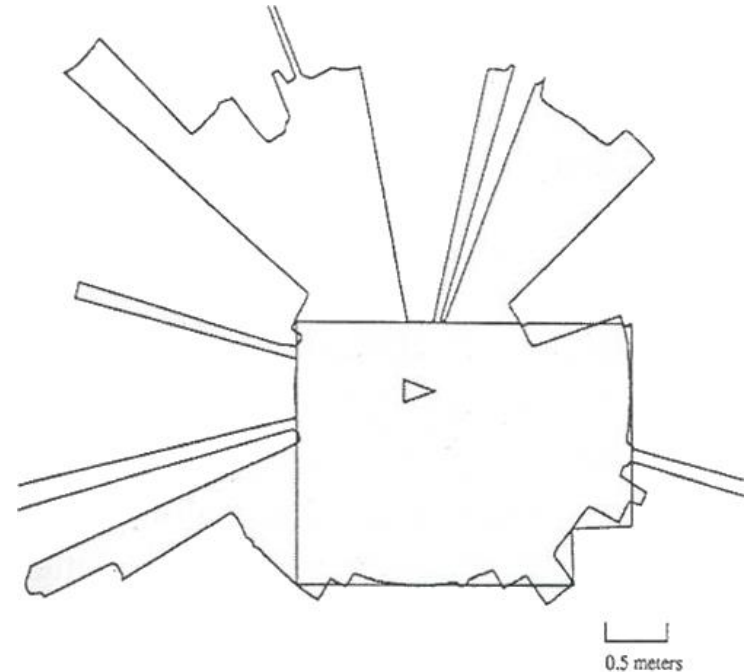
- Alike total reflexion, the sound waves are not directly reflected back to the sensor
- Through reflexions on several walls the wave finally returns to the sensor
- Obstacles appear to be farther away than they are



Occurrence of errors  
caused by multiple  
reflexions

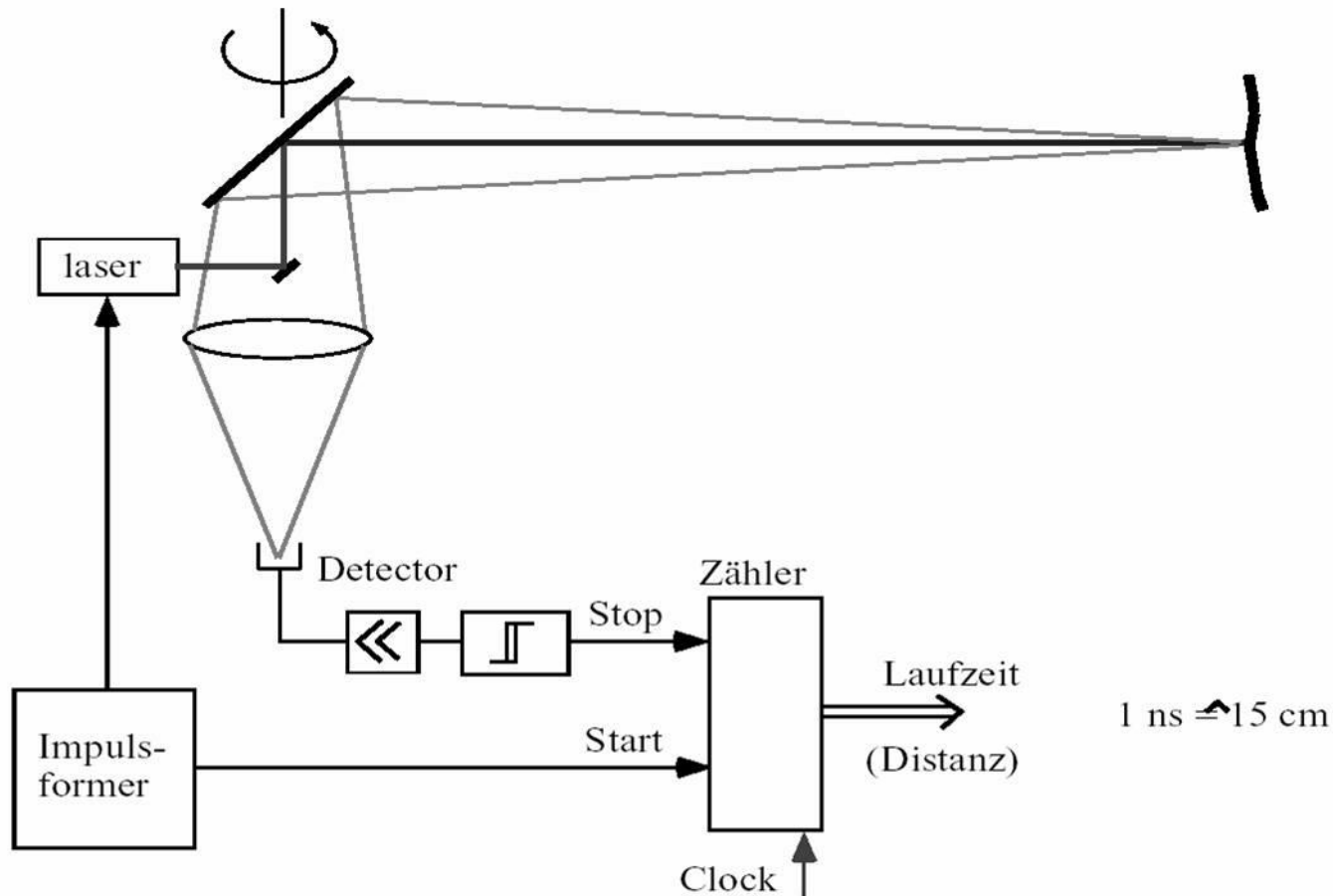
## Ultrasonic Snapshot of a Room

- Typical measurement of a room with ultrasound sensors
- Serious problems at the corners
- No point measurement — cone measurement



Recorded sensor data in comparison to real room dimensions

# Laser Distance Detection



Principle of active distance measurement employing a laser

## Example: SICK Laser Scanner

- Impulse length:  $\approx 1\text{ns}$
- Impulse power: 10 W
- Rate: 18000/s
- Scan angle:  $180^\circ$  in 20 ms
- Angular resolution:  $0.5^\circ$
- Detector clock: 3 GHz
- Range: 0–4–12 m
- Distance increment: 5 cm
- Distance error:  $\pm 2.5\text{ cm}$
- Detectable objects: 1.8 % reflection at 4 m



SICK Laser Scanner

## Example: SICK S3000 Sicherheitslaser

- Wave length: 905nm
- Scan angle: 190 ° in 20 ms
- Angular resolution: 0.25 °
- Max. Distance: 49m
- 2 Safety zones: 15 m
- Nr. of field sets: 16 and 32
- Resolution: 30 mm – 150 mm



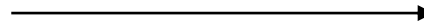
Sick S3000 Anticollision

## Solid-State LiDAR

- Solid-state := no large rotating mirror for beam steering
- Smaller, as no actuation is necessary
- Can be produced in large scale (MEMS chips)
- Field of view is restricted (no 360° )



Velodyne HDL-32E



Innoviz Pro

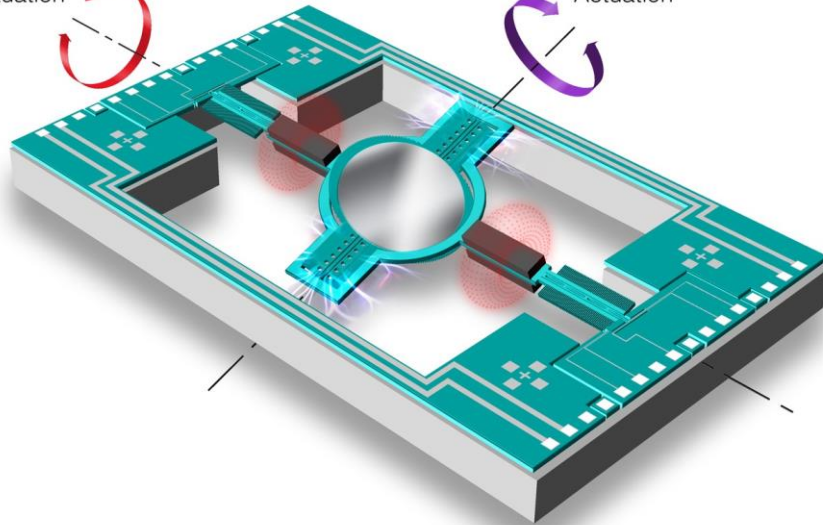
# Alternative Steering Technologies

- MEMS
  - Micro-mirror on small chip (1x1cm) → mass production
  - Mirror is moved electro-mechanical
  - Fast, sine-shaped trajectories
- OPA (Optical Phased Array)
  - Principle known from antennas
  - Interference of light waves
  - Steering via phase shift
  - Low energy consumption, as light beam is not pulsed.
  - No mechanical parts at all

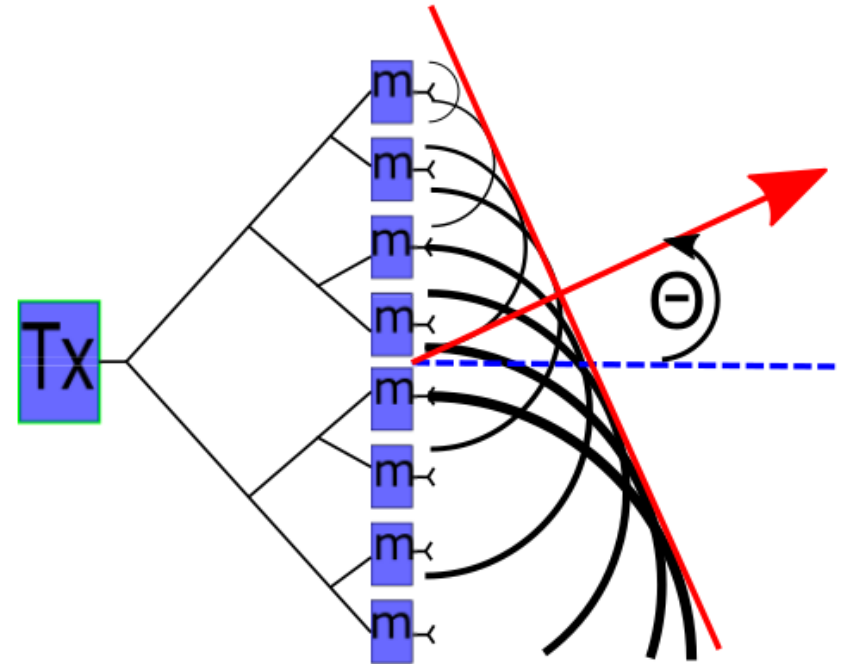


Electromagnetic  
Actuation

Electrostatic  
Actuation



MEMS



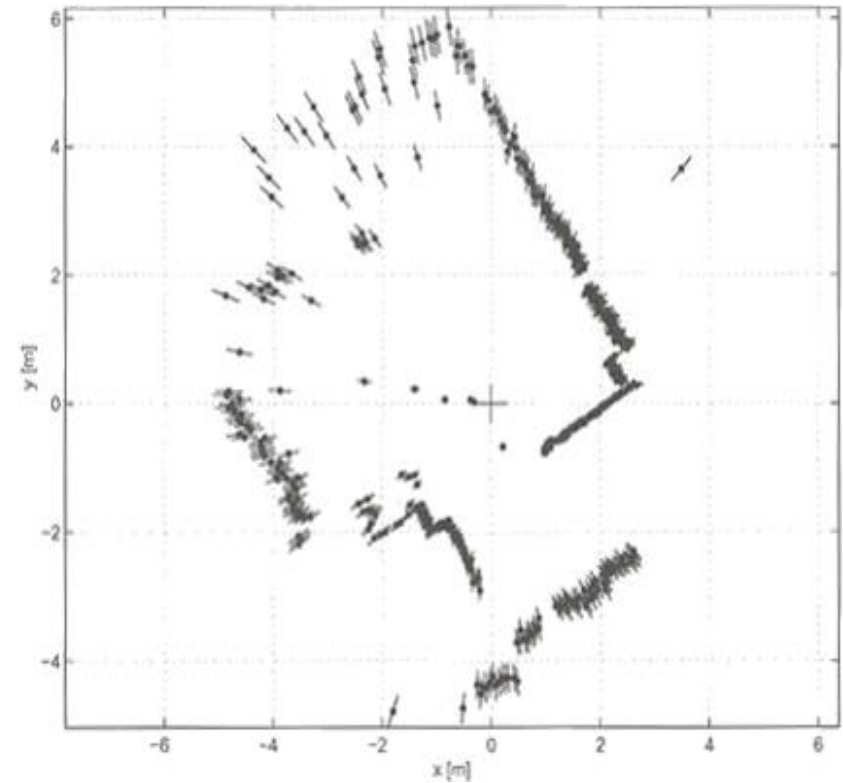
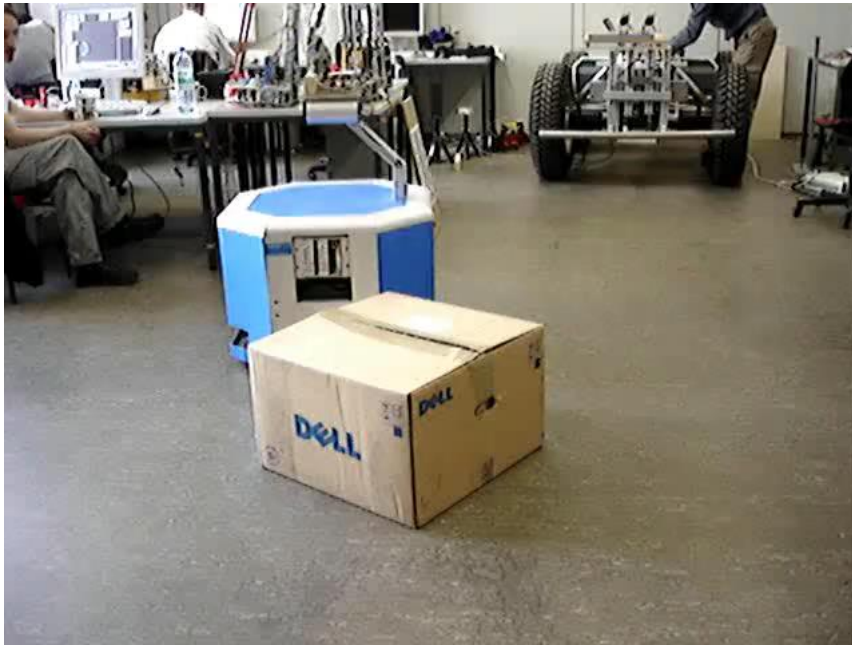
OPA

## Innoviz Pro: MEMS-based LiDAR (2020)

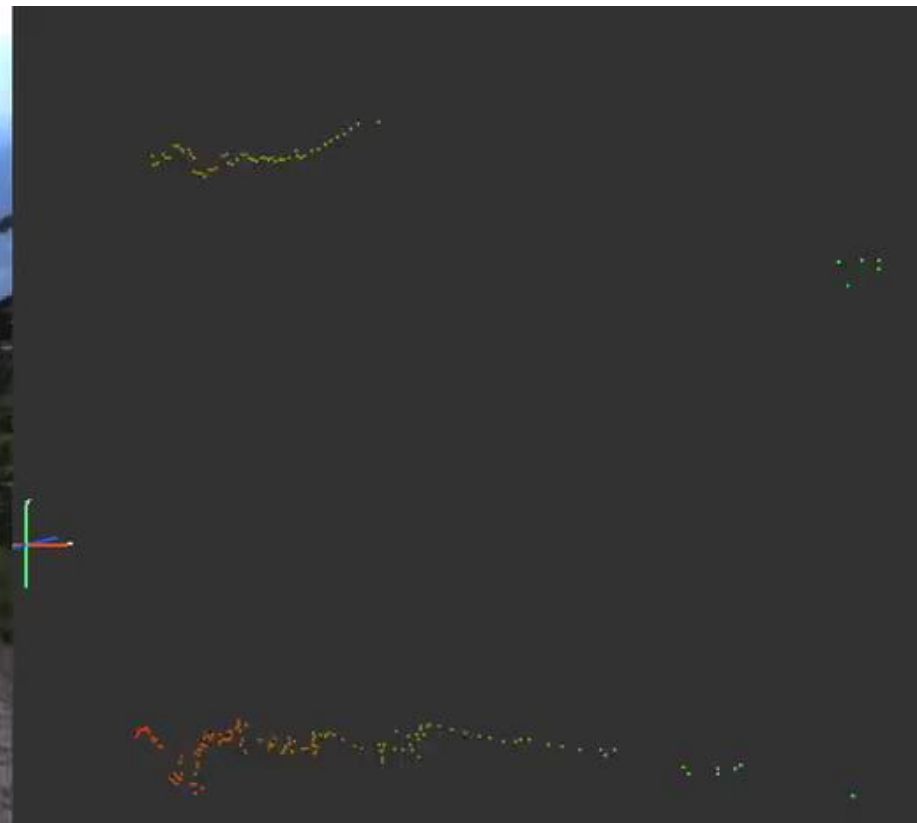
- Field of View:  $72^\circ$  Hx $18.5^\circ$  V
- Angular resolution:  $0.18^\circ$  Hx $0.4^\circ$  V
- Frame rate: 16Hz
- Range: 105m
- Dimension: 73x66x165mm
- Wavelength: 905nm
- Range Accuracy: 5cm
- Minimum range: 2.1m



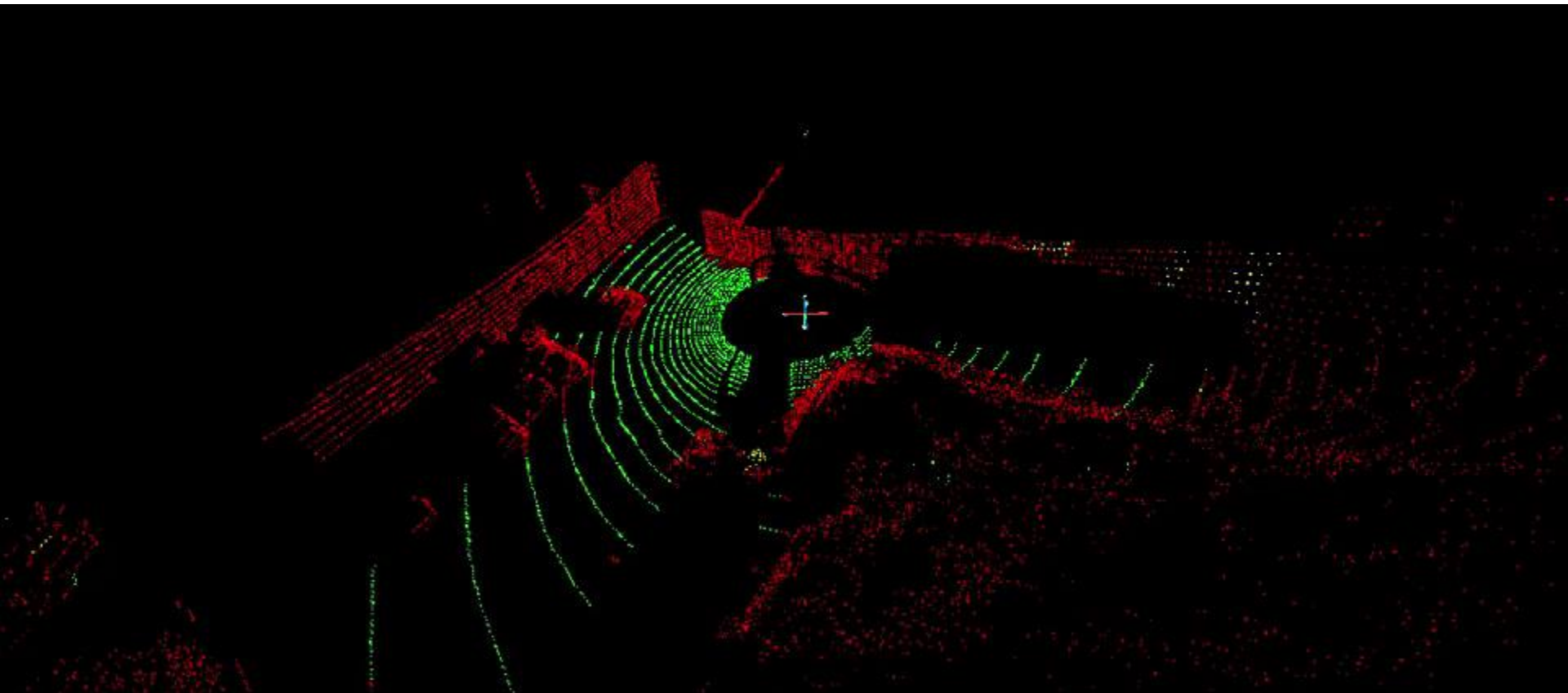
# Wall Detection with a SICK Laser Scanner



# 2D Laser Range Finder (SICK LMS151)

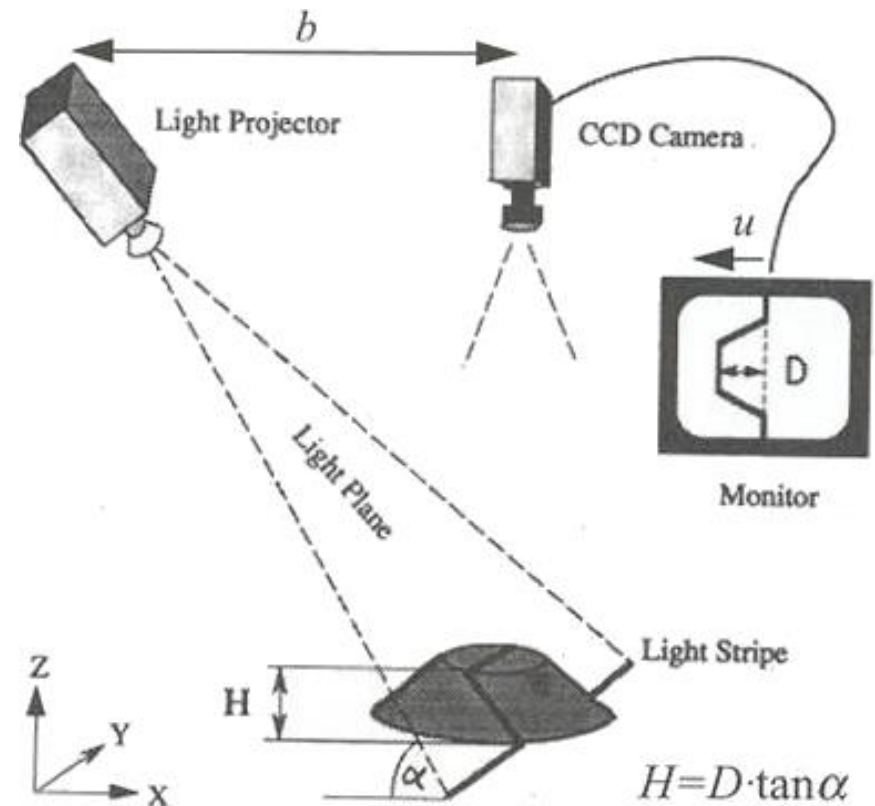


# 3D Laser Range Finder (Velodyne HDL-32)



# Active Triangulation

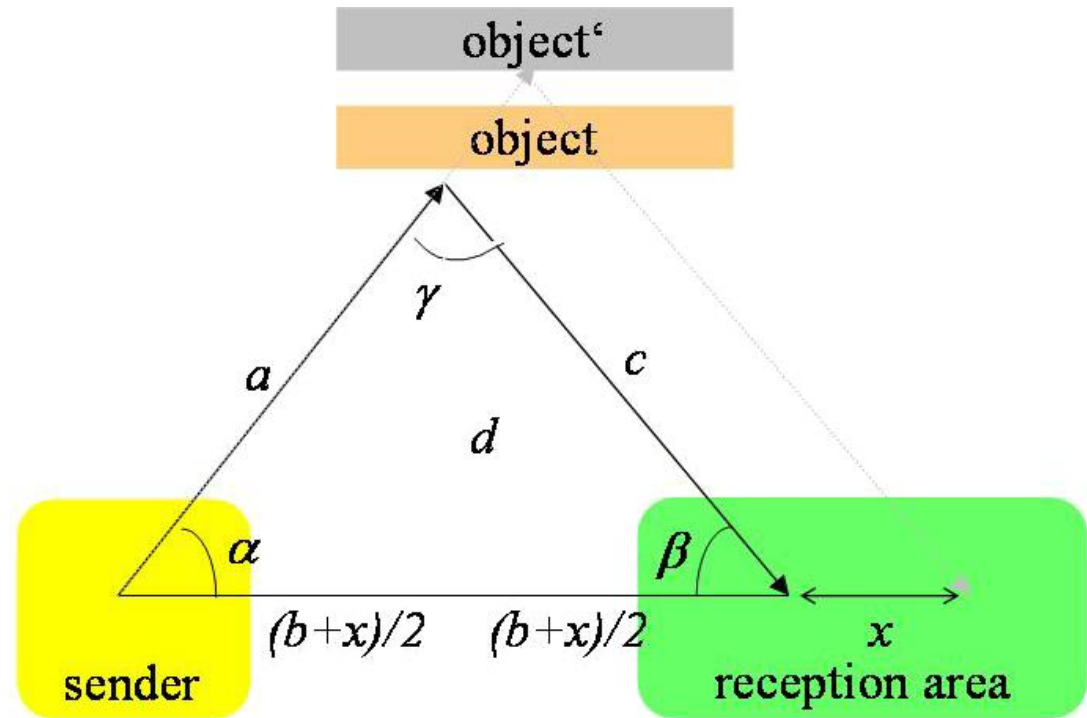
- Sender and receiver with known distance
- Sender emits beam (e. g. laser) onto the object
- Receiver (e. g. CCD-cam, PSD) measures displacement  $x$  indirectly



Setup for active triangulation

# Active Triangulation

- Assumption:  
symmetric setup (i.e.  
 $a = c, \alpha = \beta$ )
- Distance to object:  
$$d = \frac{1}{2}(b + x) \cdot \tan \alpha$$
- With increasing  
distance the  
resolution degrades  
(approaching pole of  
 $\tan \alpha$  at  $90^\circ$ )

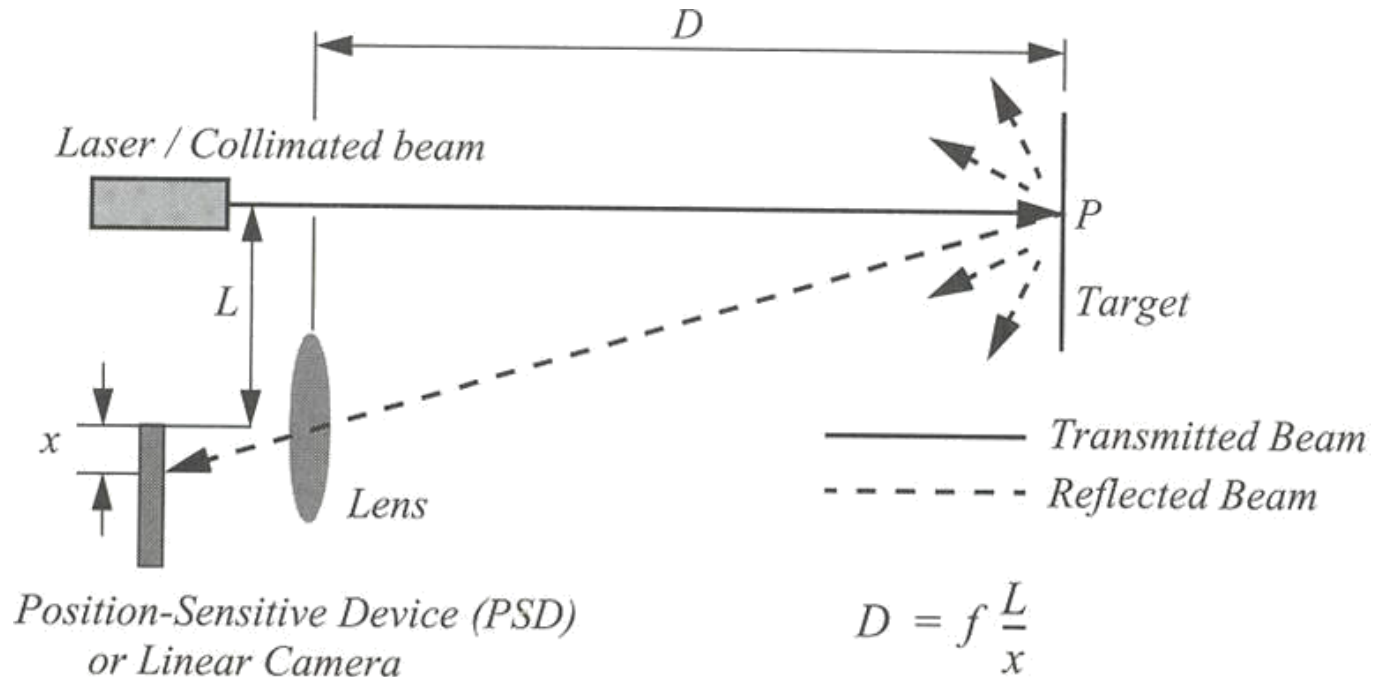


Distance computation



# 1D Distance Measuring

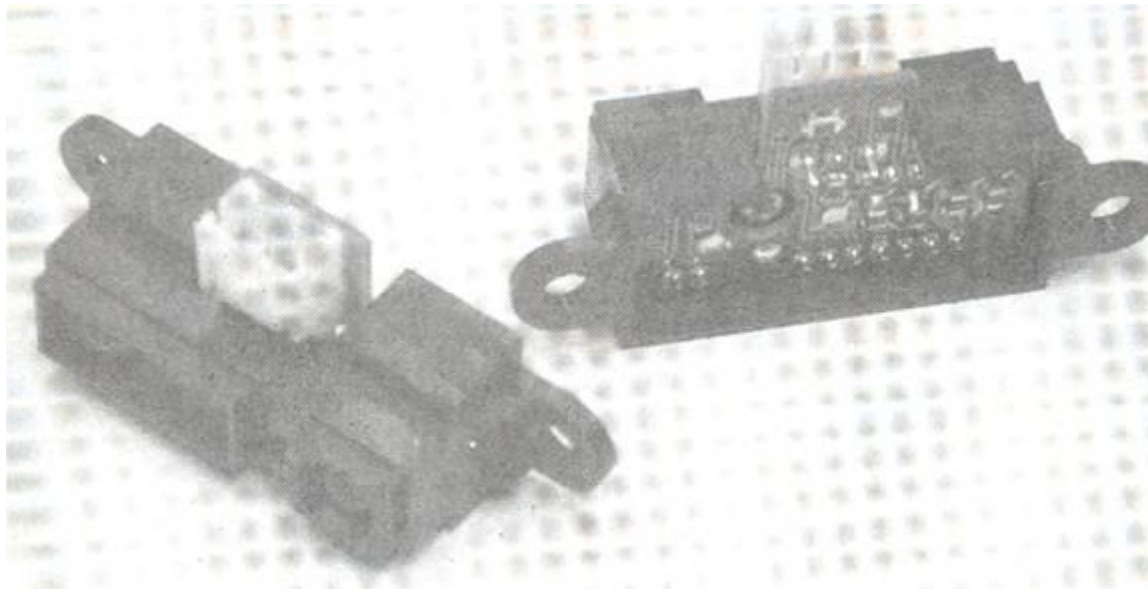
- Triangulation to determine position
- Close-up range (8 – 80 cm)
- High precision and resolution





# 1D Distance Measuring

- Reflected light is absorbed by PSD or 1D CCD-camera
- Distance is proportional to  $1/x$
- $f$  = focal length

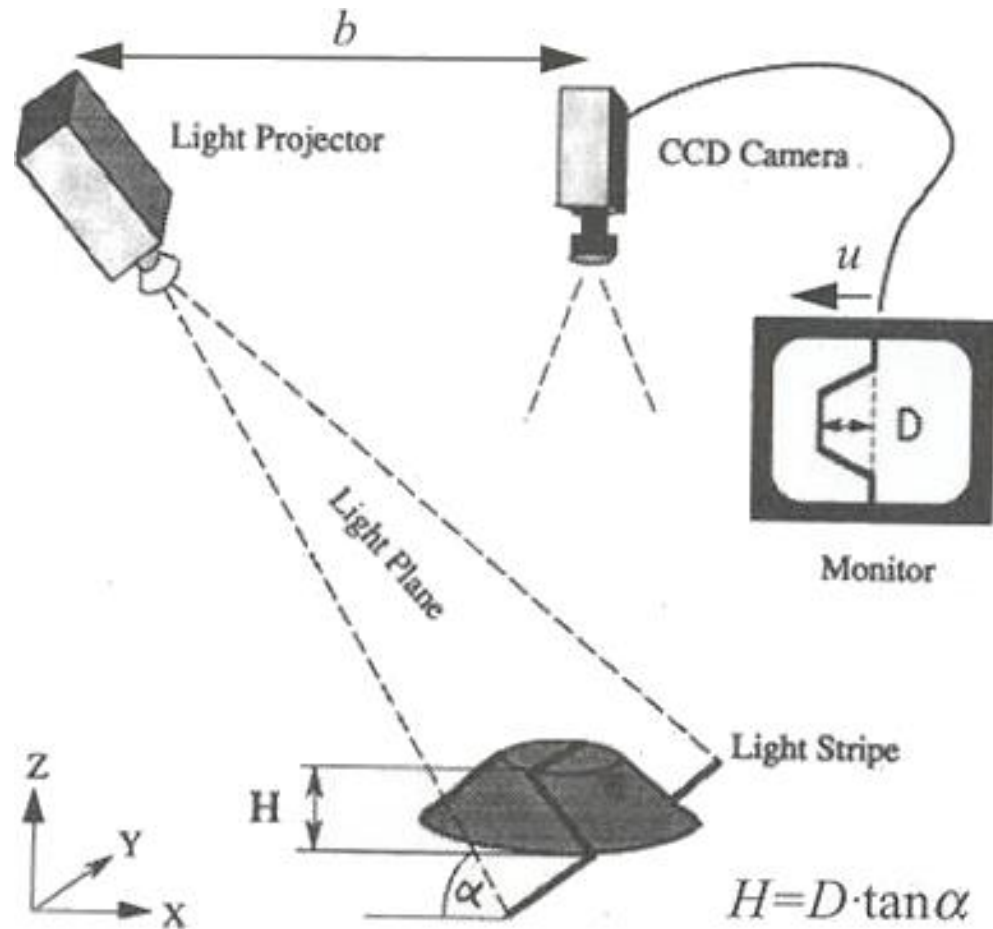


Sharp infrared sensor

# Structured Light

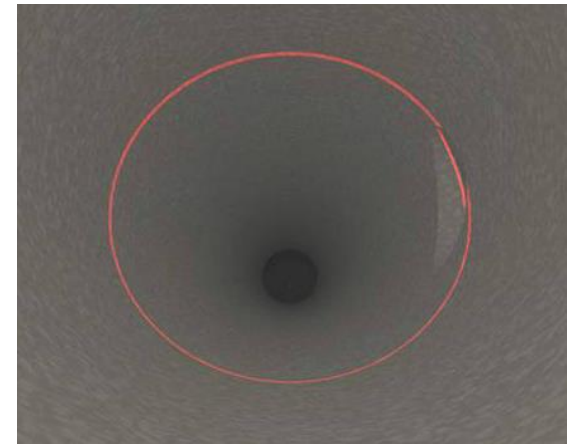
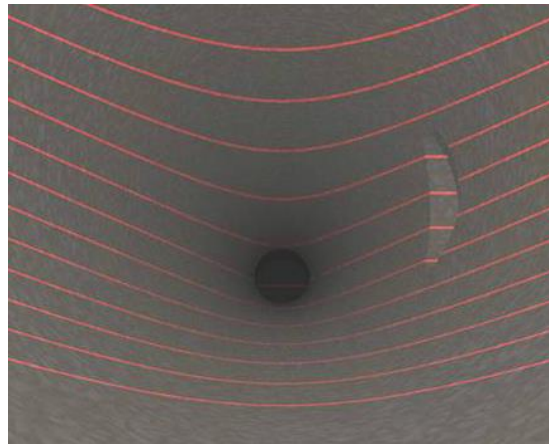
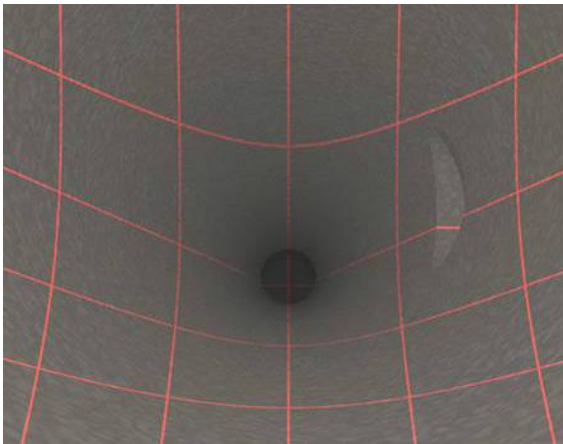
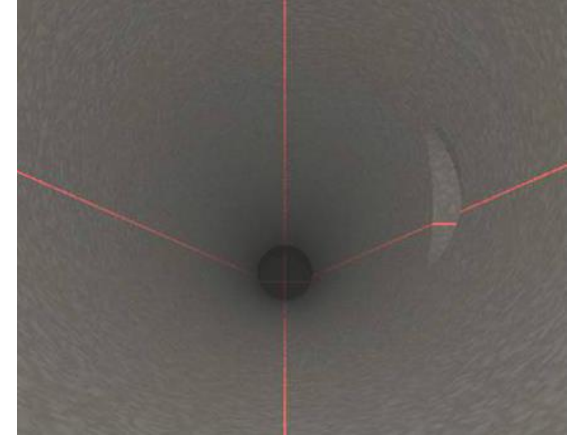
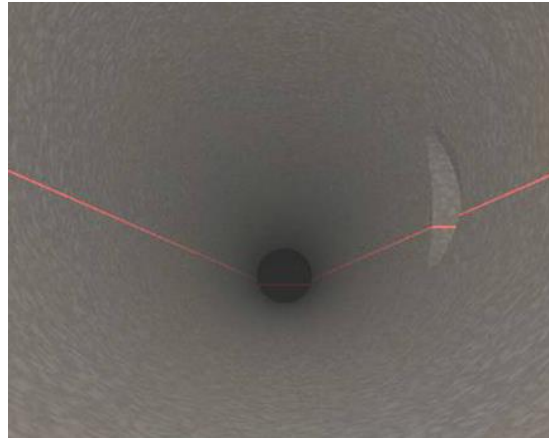
$$x = \frac{bu}{f \cdot \cot \alpha - u}$$

$$y = \frac{bf}{f \cdot \cot \alpha - u}$$

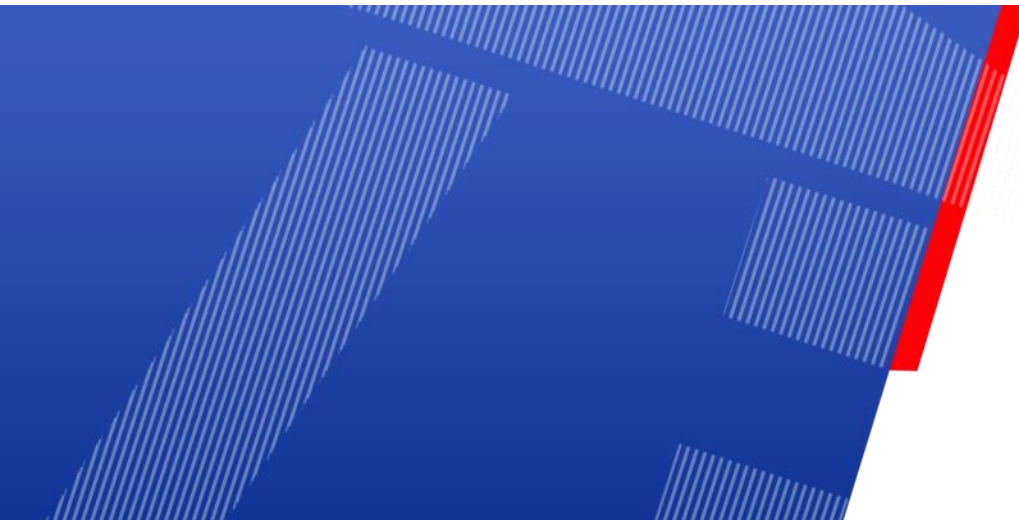


Basic setup to use structured light as surface sensor

# Structured Light for Sewer Inspection

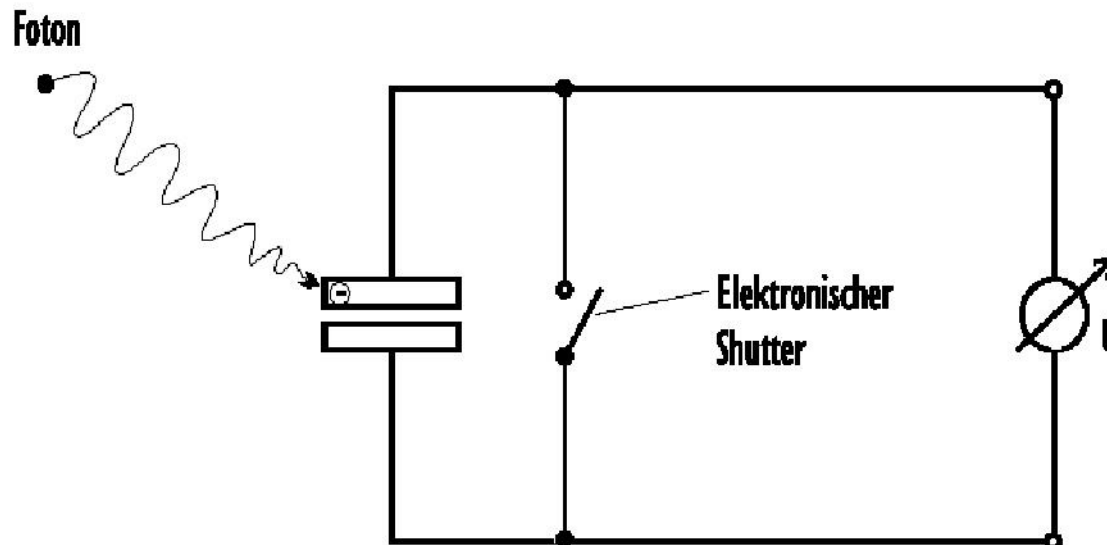


# Vision Sensors



# CCD Cameras

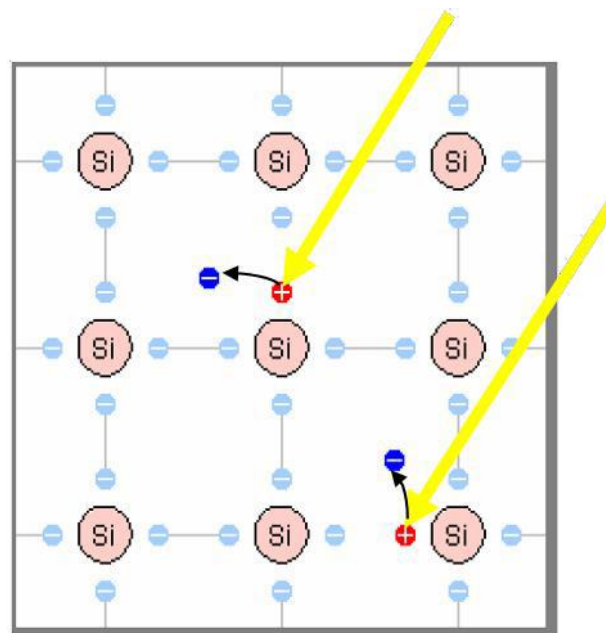
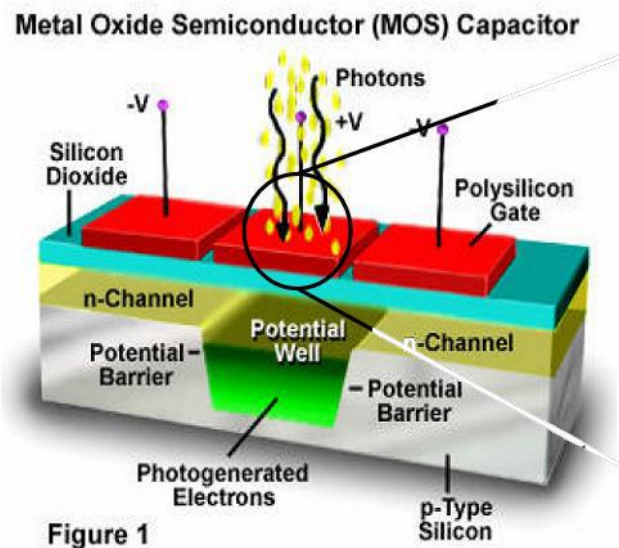
- Photon beam induce charge, that is collected over a fixed period of time
- Electric Shutter exposure time
- Low noise level



Working principle of CCD camera

# Working Principle of CCD Cameras

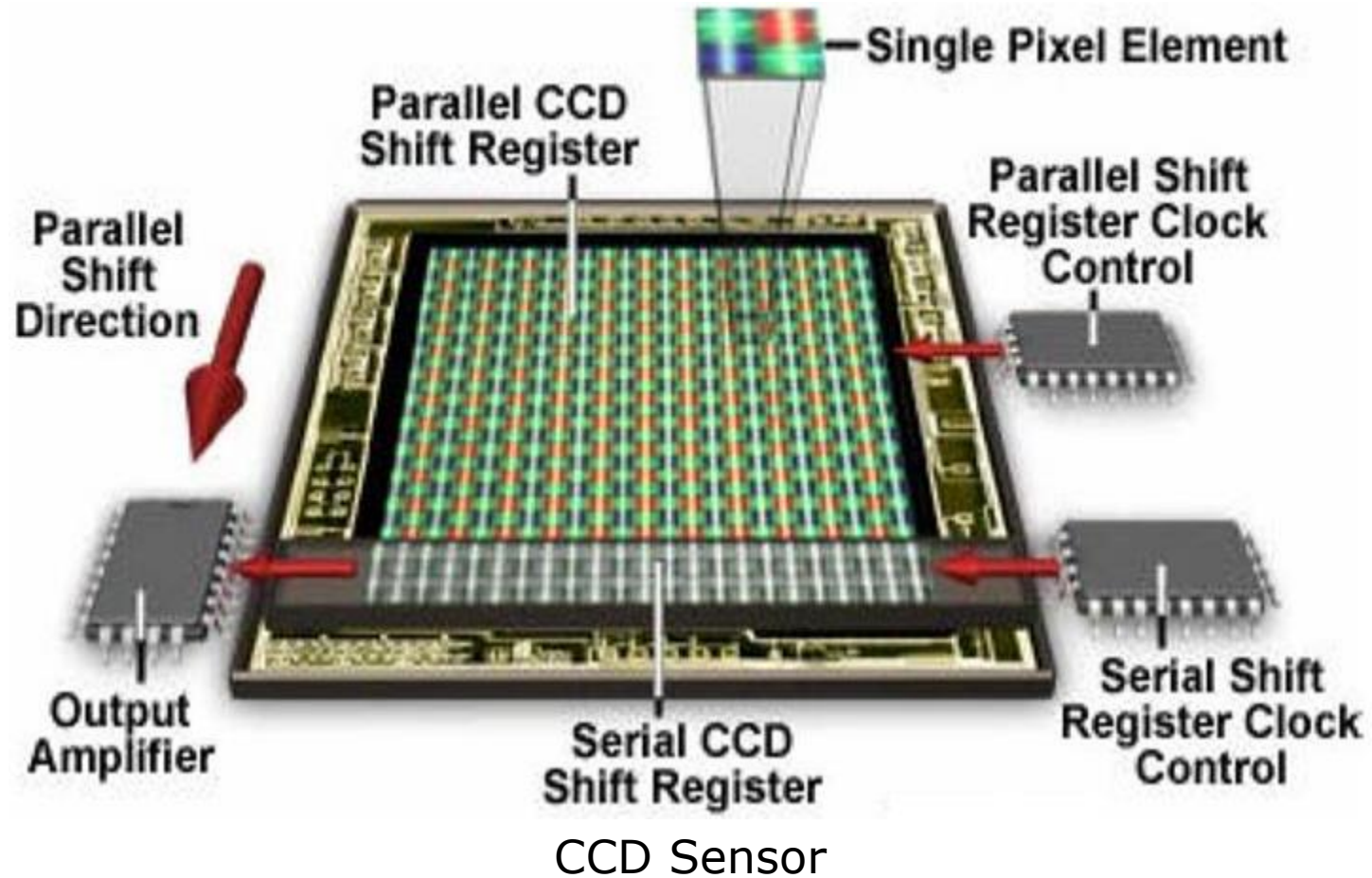
- Basis of semiconductor cameras: “inner photoelectric effect”
- Through stimulation (light) electrons are lifted from the valence band (bound) to the conduction band (free charge carriers)
- Free electrons are gathered in a charge pool



Working principle of CCD cameras

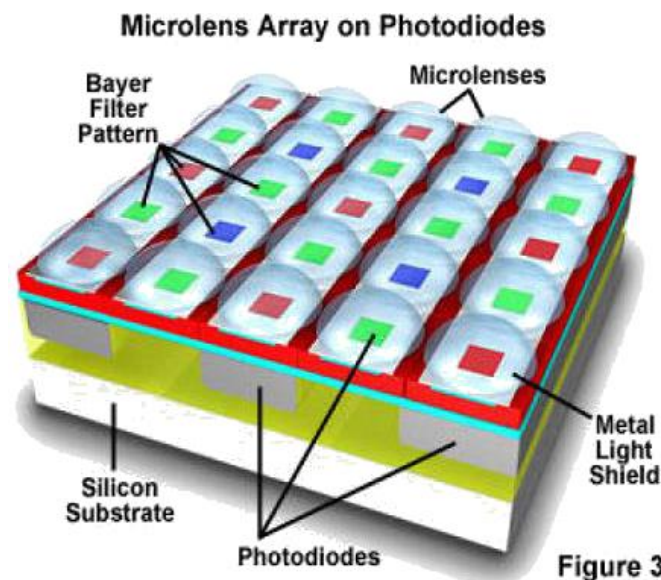
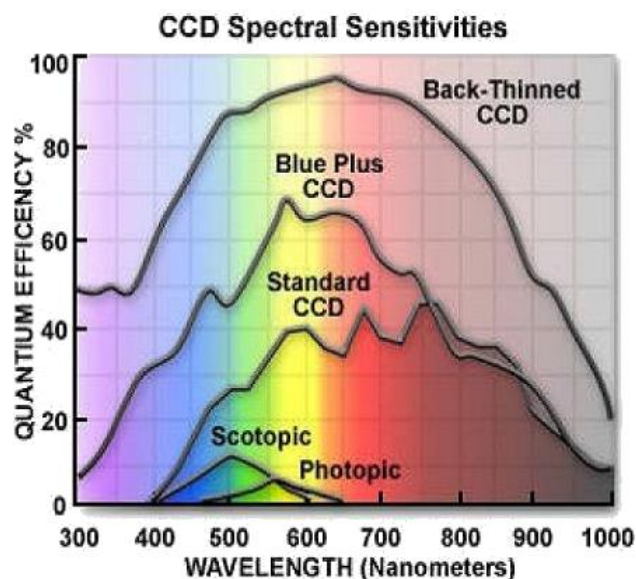


# Readout of CCD Chips



# Color

- CCD Chips are sensitive to the complete visible spectrum, but especially to red light
- Color images through application of RGB-filters and following combination of 4 photo diodes for 1 pixel
- Micro lenses increase light efficiency

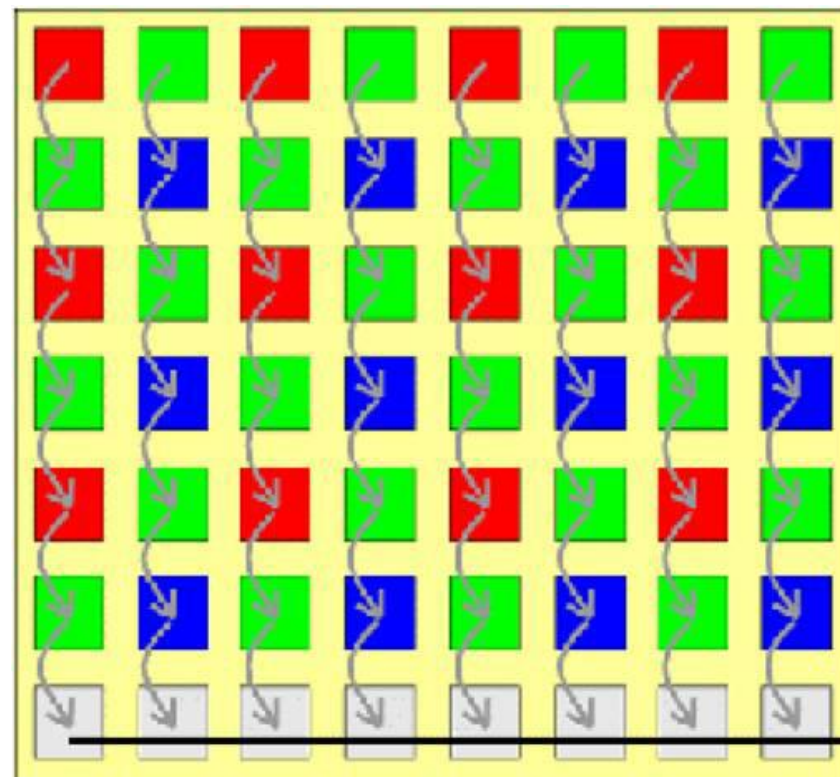


## Color capturing basics



# Color

- Photo diodes just store charge
- Evaluation is performed by a output amplifier per column
- Charge is transported there by “shifts”
- Pixels not individually addressable
- Single amplifier, compact design



Schematics of CCD chip surface

# Blooming

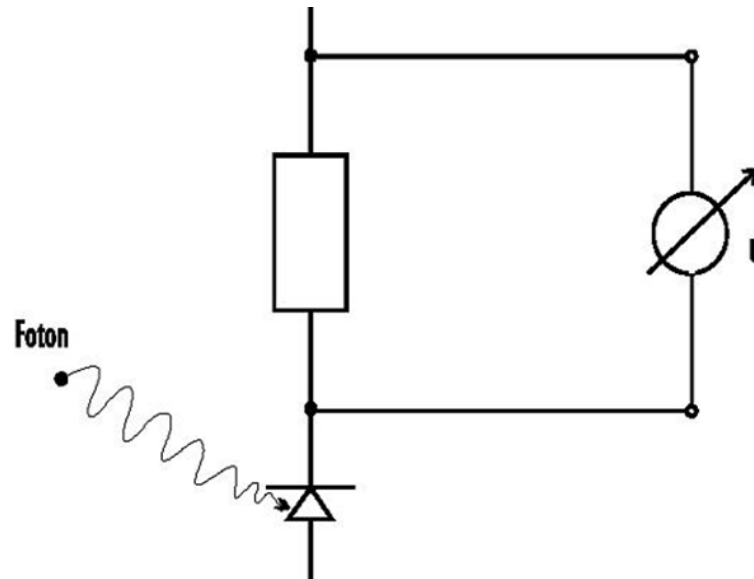
- During integration of charge the charge pool may be flooded ⇒ “blooming”
- Effects nearby pixels
- Effects diodes in current column
- Avoidance of Blooming
- “drain canals” on the chip
- Reduction of exposure time
- Reduction of shutter opening



Examples of  
blooming effects

# CMOS Cameras

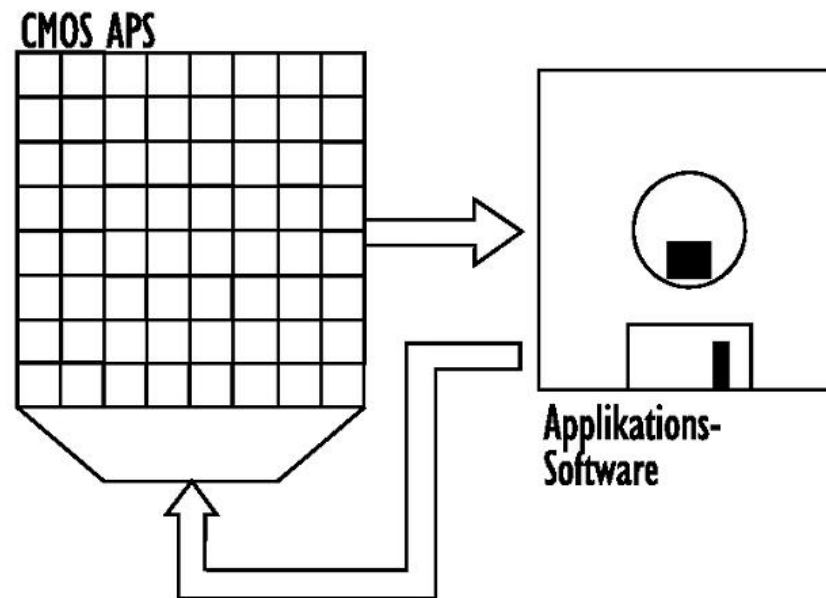
- Photo diode serial to resistor
- Continuous conversion of the photon beam into output voltage
- Severe noise



Measuring principle of a CMOS camera

# CMOS Cameras

- Direct access to single pixel with 5 MHz
- Example: 500 pictures/sec at  $100 \times 100$  pixel resolution



Data flow of a CMOS camera

# Comparison of CCD and CMOS

- Competing technology to CCD: CMOS
- Separate amplifier at each photo element
- No Integration of charge, but continuous transformation

Pros of both technologies in direct comparison:  
CMOS

- Small size
- No blooming
- Bigger dynamics

CCD

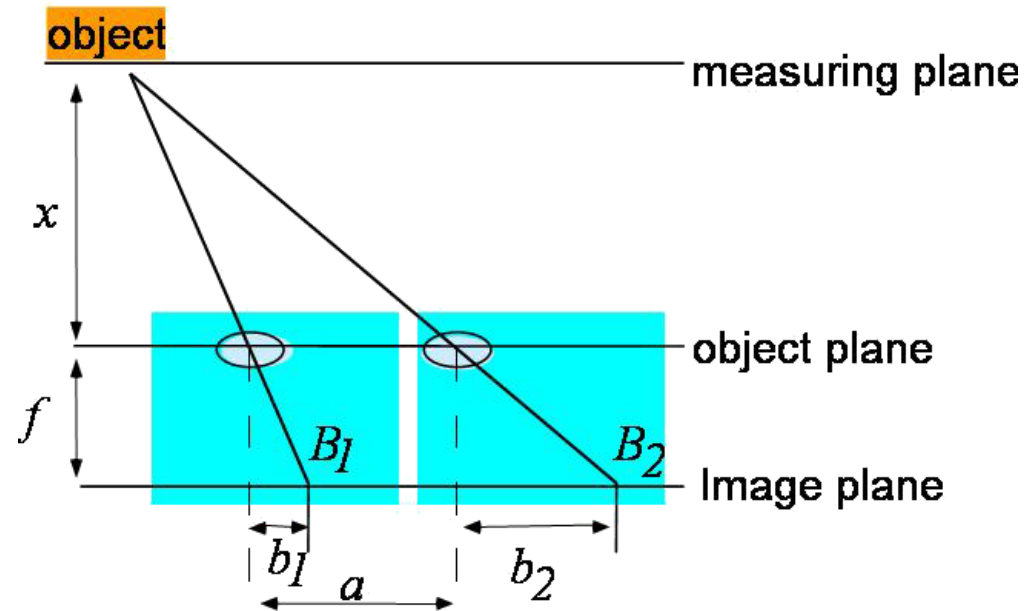
- Higher photo sensitivity
- Higher uniformity
- Less noise

# Passive Triangulation

- Object is projected onto the image plane at different coordinates
- Theorem of intersecting lines

$$x = \frac{a \cdot f}{b_2 - b_1} = \frac{a \cdot f}{\beta}$$

- Focal length  $f$
- Stereoscopic displacement  $\beta$
- Binocular or trinocular systems



Principle of passive triangulation

## Passive Triangulation - Example



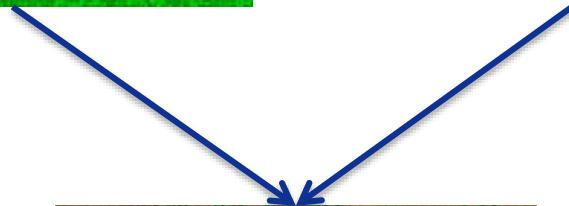
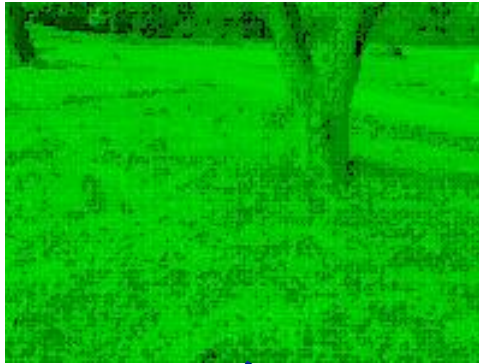
Stereo Camera Bumblebee 2 und 3

### Measurement Problems:

- Correspondence: What are the corresponding points in the image plane that characterize the same point?
- Resolution degrades with increasing distance



# Fundamentals of Stereo Image Processing

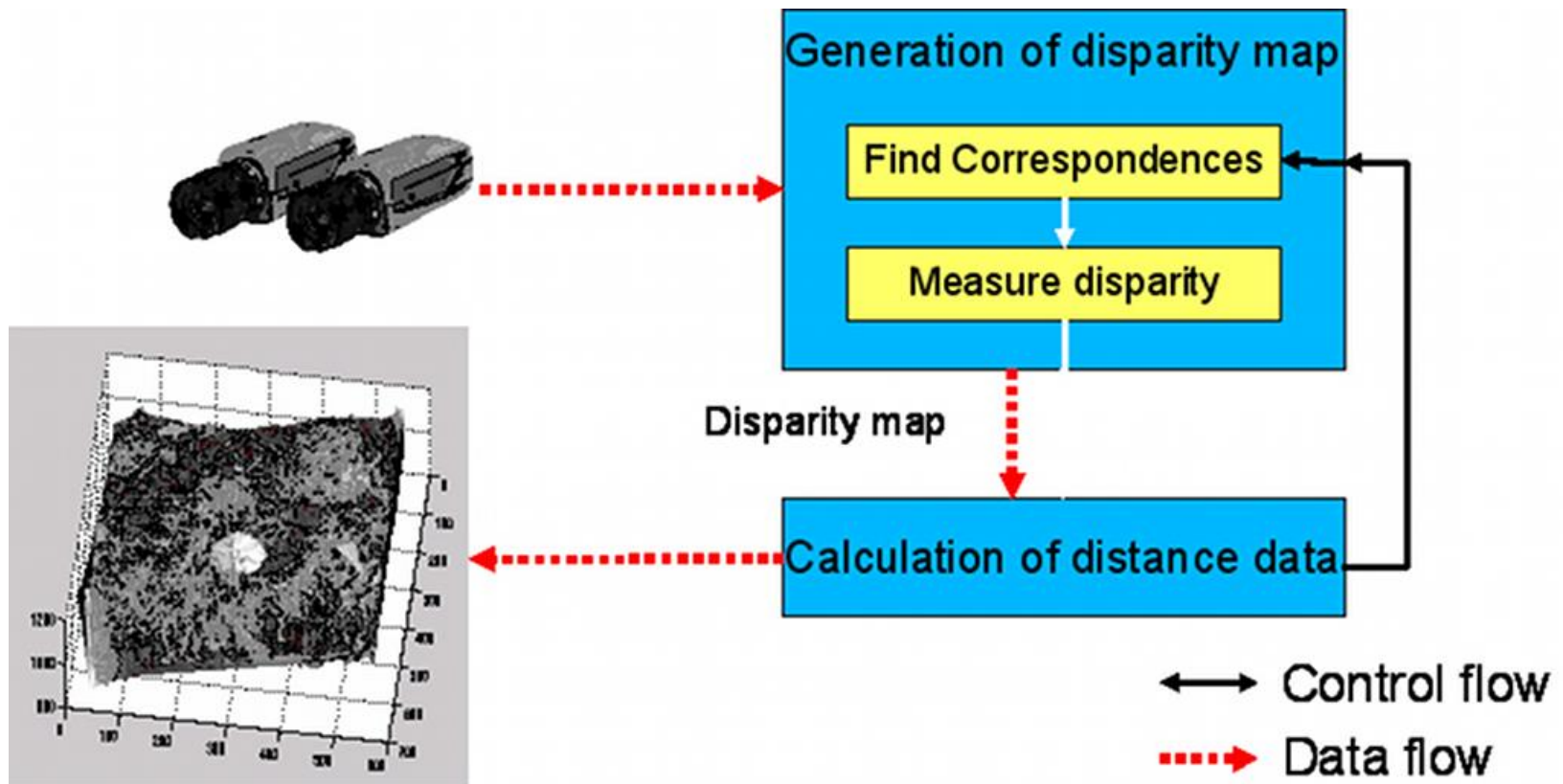




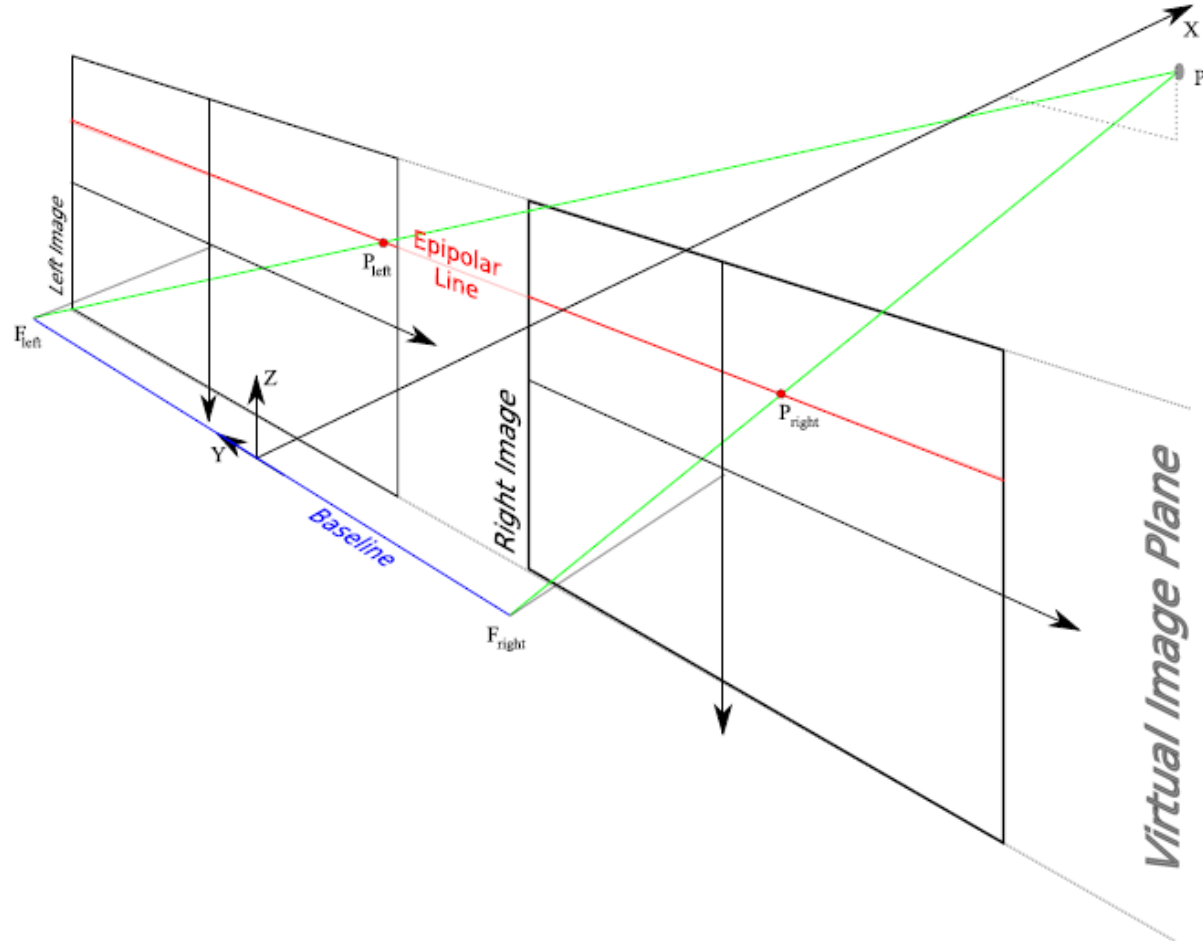
# Fundamentals of Stereo Image Processing

- Objects appear in the left image more to the right than in the right picture  $\Rightarrow$  Disparity between pixels representing the same object
- Processing of disparity data allows it to calculate distance
- The closer the object, the bigger the disparity
- 3D reconstruction
  - Geometry must be given
  - Calculation through triangulation

# General Approach



# Canonical Stereo Geometry



Binocular stereo vision setup

# Canonical Stereo Geometry

## Definitions

- Baseline: Line connecting the lens centers
- Optical Axis: Line connecting the focal points of a lens system
- Point of origin: Origin of stereo camera coordinates system

## Geometry

- The optical axis are parallel to each other
- Baseline is perpendicular to both optical axes
- Monotony of disparity
- Disparity of objects closer to the camera is bigger
- Disparity of objects away from the camera is smaller

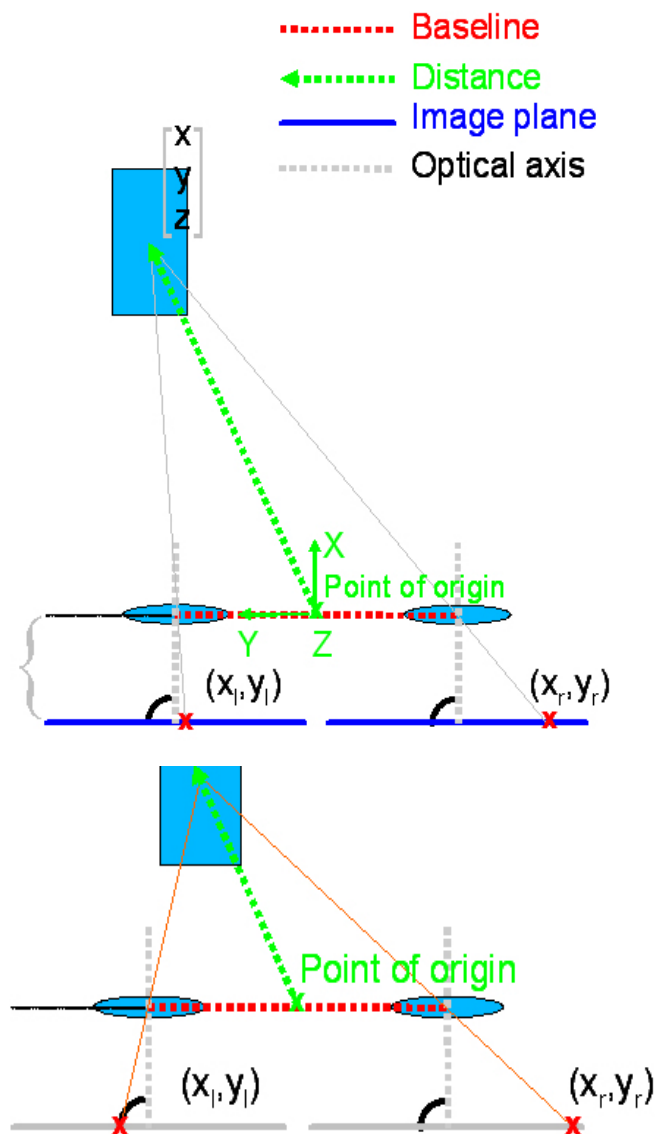
# Calculation of Distance Values

- Input: disparity map
- Parameter
  - Focal length  $f$  in pixels
  - Length of baseline  $b$
- Formulas

$$x = \frac{b \cdot f}{x_r - x_l}$$

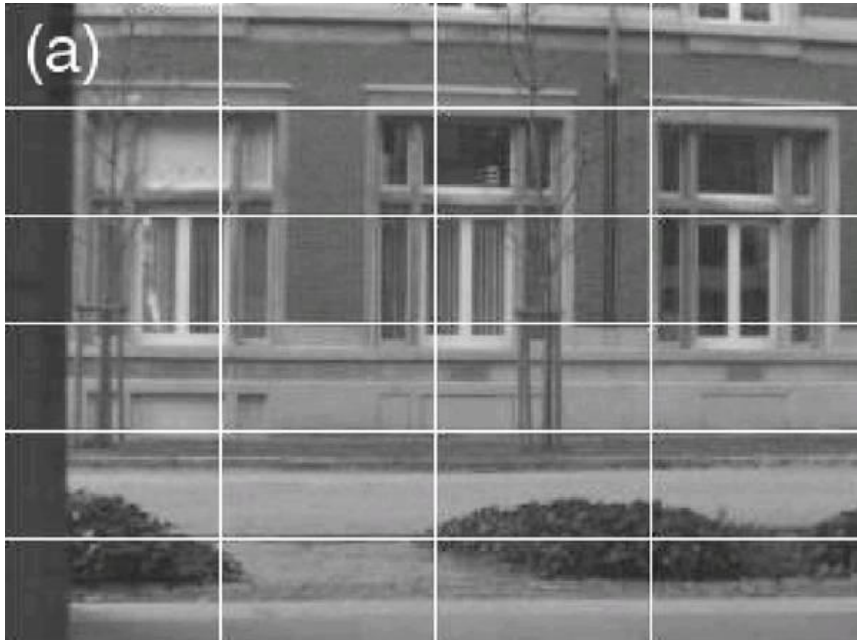
$$y = \frac{b}{2} \frac{(x_l + x_r)}{x_r - x_l}$$

$$z = \frac{b \cdot y_l}{x_r - x_l}$$

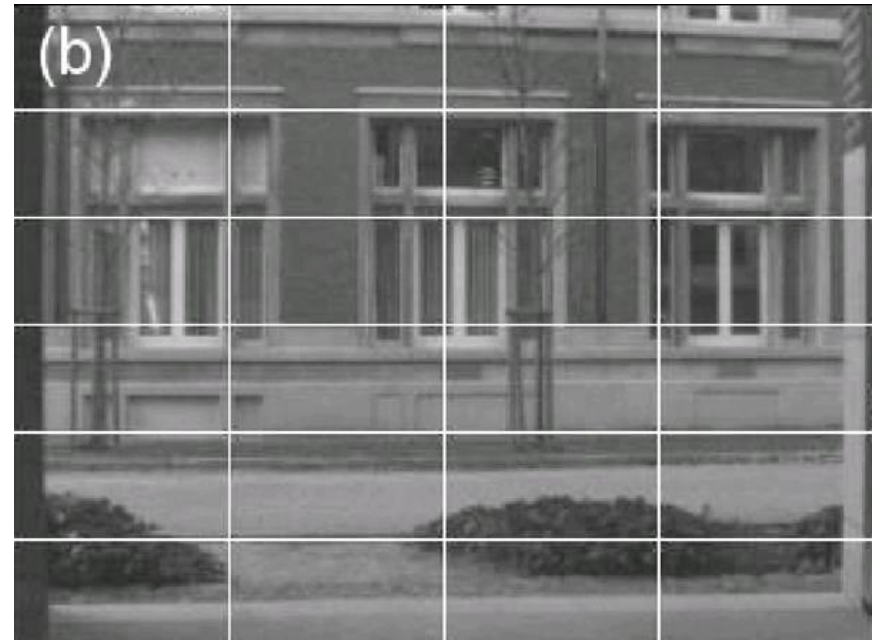


Far and near objects

# Epipolar Constraint



Left stereo image



Right stereo image

# Epipolar Constraint

- Features of an object in different image planes are located at specific locations
- Canonical case: Epipolar lines (horizontal)
- This assumption reduces the search area tremendously
- In this context disparity is the distance in x-direction of the pixels
- More complex camera constellations imply more complex epipolar structures

## Problems: Camera and Stereo Geometry

- Camera distortion (intrinsic and extrinsic)
- Inaccuracies in stereo geometry



Distorted image



Rectified image



# Disparity Map Generating Algorithms

Two classes of algorithms for dense disparity

- Window-based approach
- Line-based approach

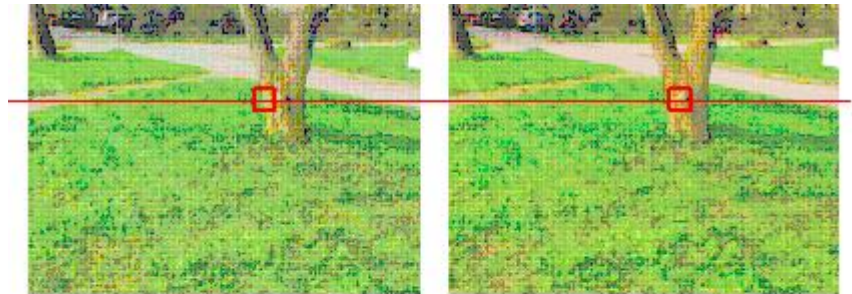
Sparse disparity vs. dense disparity

- Not all pixels are corresponded
- Example: line segment extraction  
⇒ line segments are corresponded

=> Only dense disparity will be discussed further

# Window-based Approach

- Window is shifted along the epipolar line
- Max. disparity is limited (in general 30 – 50 px)
- Patches are compared
- Best matches result in disparity values → map
- Variability: degree of similarity (e. g.: Sum of abs. diff.)
- Attempt to find local optimum



Left Sample

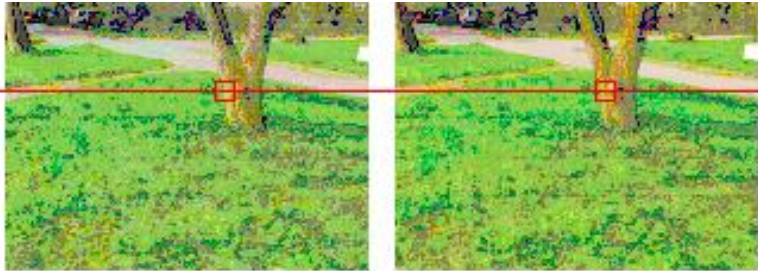


Right Samples



Window based approach

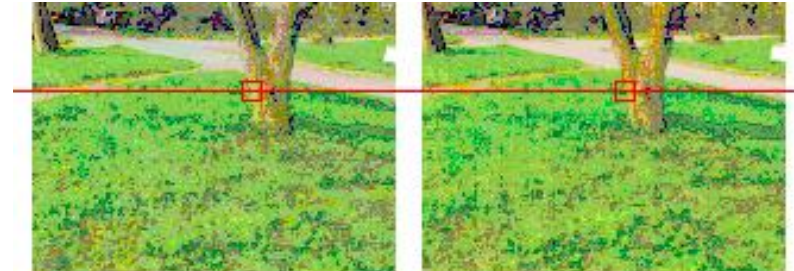
# Window-based Approach



Left Sample



Right Samples



Left Sample



Right Samples



Best Match

## Window-based Approach

ComputeDisparity ( $x, y$ , left\_img, right\_img)

- Search pixel in right\_img that corresponds with left\_img( $x, y$ )
- The window is slid over the right image from ( $x, y$ ) to ( $x - \text{max\_disp}, y$ )
- Best match concerning a suited similarity measure is returned

Common similarity measures

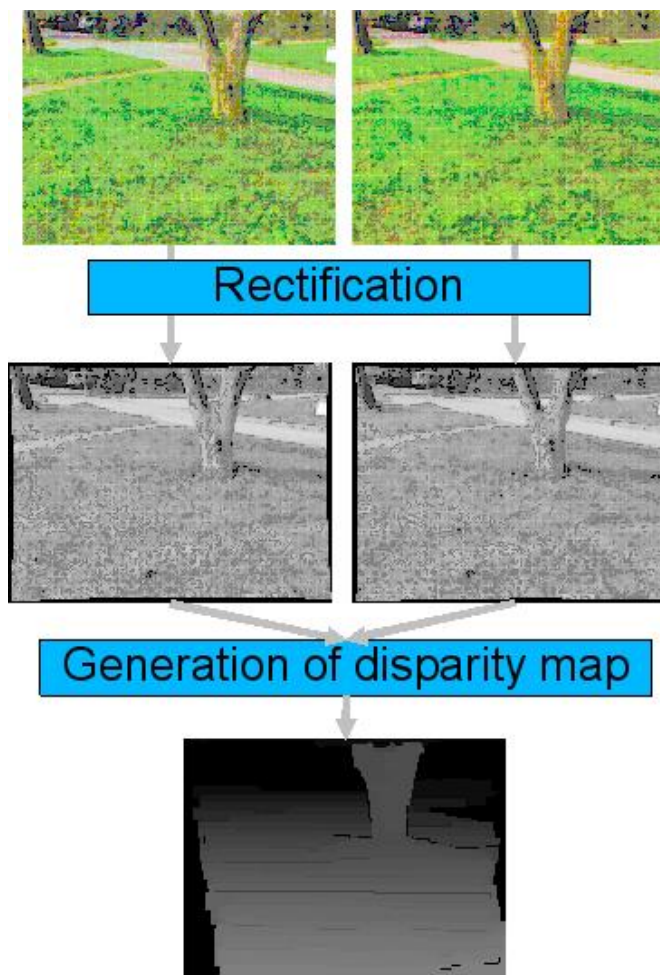
- Sum of absolute differences
- Sum of squared differences
- Correlation

## Line-based Approach

- Analysis of paired horizontal (epipolar) scan lines
- Match Sequence: set of pixel pairs
- Scores are computed for several match sequences  
→ Possible combinations are limited by max. disparity
- Global optimization attempt (for entire line)

## Exemplary Generation of Disparity Maps

- Source images
  - Light intensity calibrated
- Rectified images
  - Eliminate distortion effects
  - Compensate inaccuracies of the stereo geometry
- Disparity map
  - Disparity for each Pixel is 8 Bit coded  $\rightarrow$  0 to 255
  - Bright spots are closer, dark spots farther away



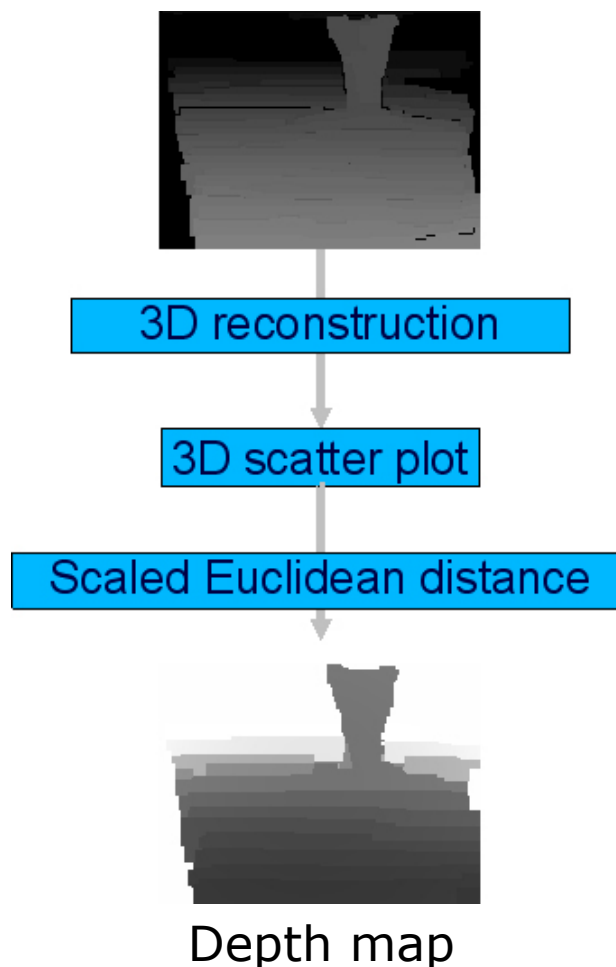
Disparity map generation

## Calculation of Distance Values

- 3D reconstruction result in 3D scatter plot
- Calculation of Euclidean distance for each pixel

$$dist = \sqrt{x^2 + y^2 + z^2}$$

- Depth map (intuitive visualization)
  - Distance values are scaled into 8 Bits  $\rightarrow$  0 to 255
  - Dark spots are closer, bright spots far away from the camera system



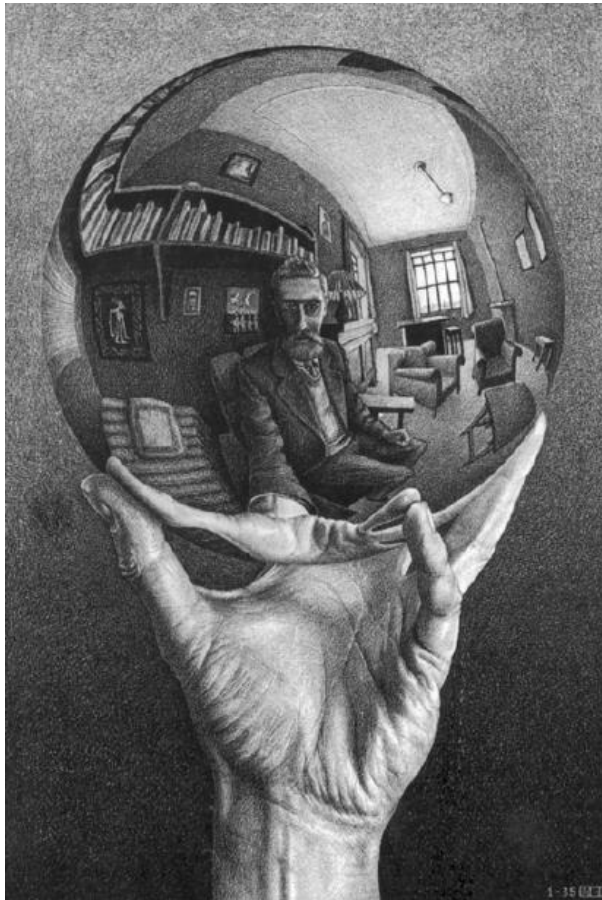


# Stereo Camera (Point Grey Bumblebee2)

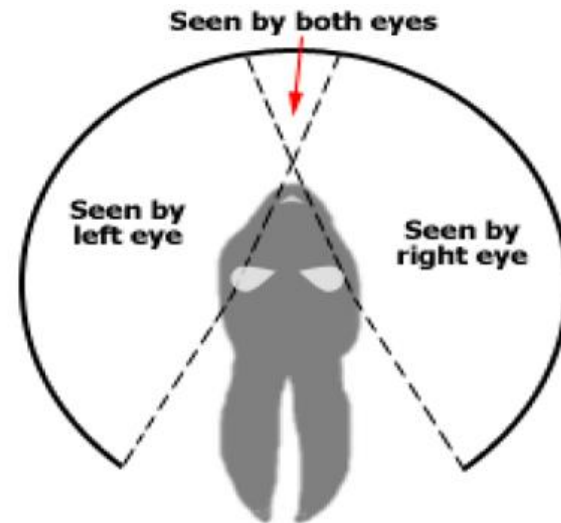




# Omnivision



Painting by M.C. Escher



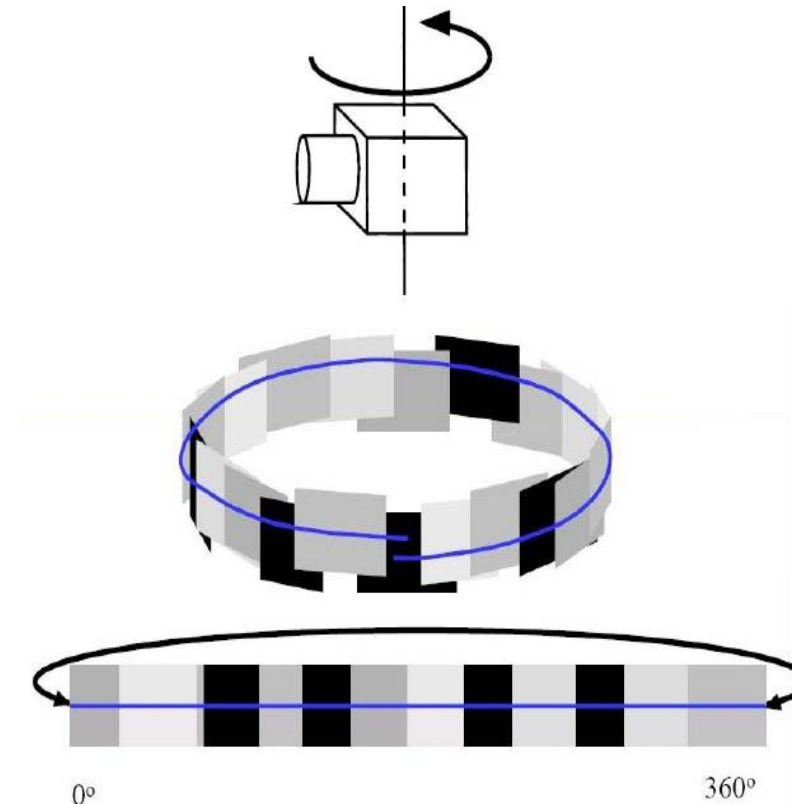
Field of vision in nature

# Rotating Camera

- High resolution image
- Single center of projection possible
- Time consuming image processing



Multicamera Systems



Stitched Images

# Rotating Camera



Stitched panorama view

# Fisheye Lens

- Hemispherical view
- No single center of projection
- Good resolution in the center
- Poor resolution in the peripheral region



Fisheye lens

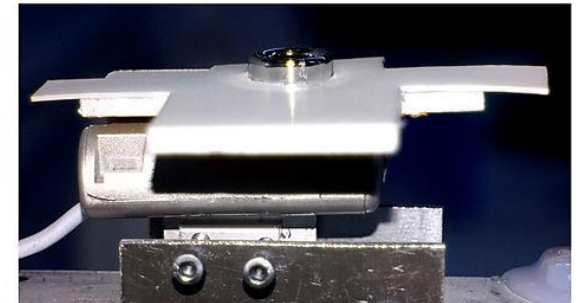
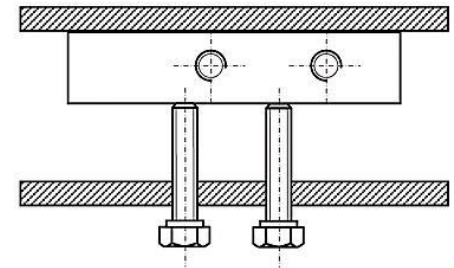
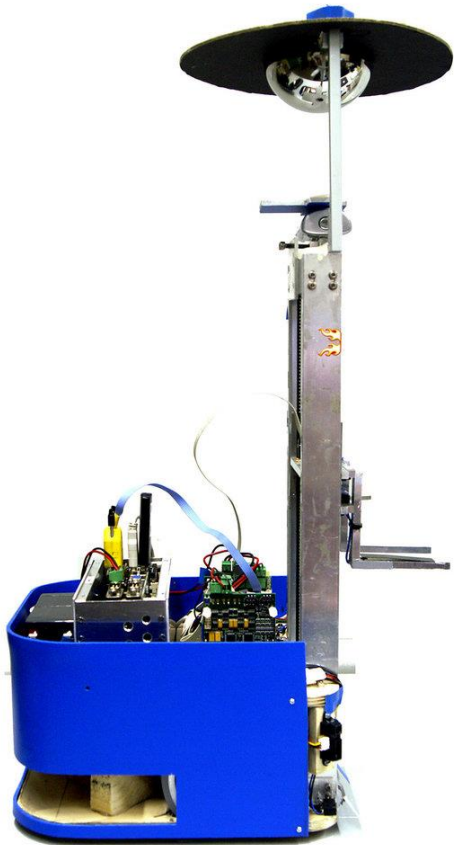


# Fisheye Lens



Image taken with a fisheye lens

# Applications of Omnivision



P.R.O.F.I labclass winter term 2006

Forklift robot equipped with Omnivision system

# Applications of Omnivision

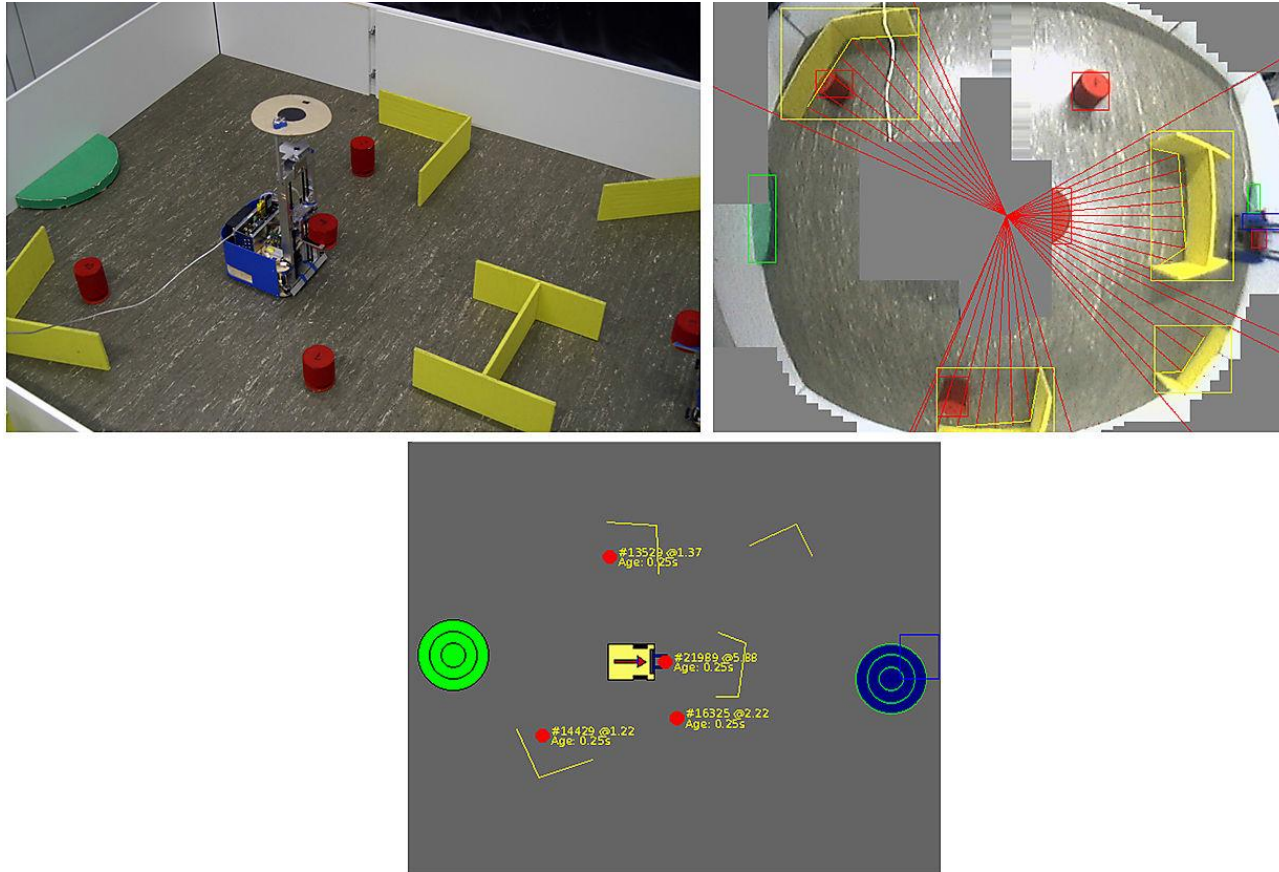


Image processing and object recognition

# Coming Next

## Modeling