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# Lecture 2: Sensors

15-491, Fall 2007

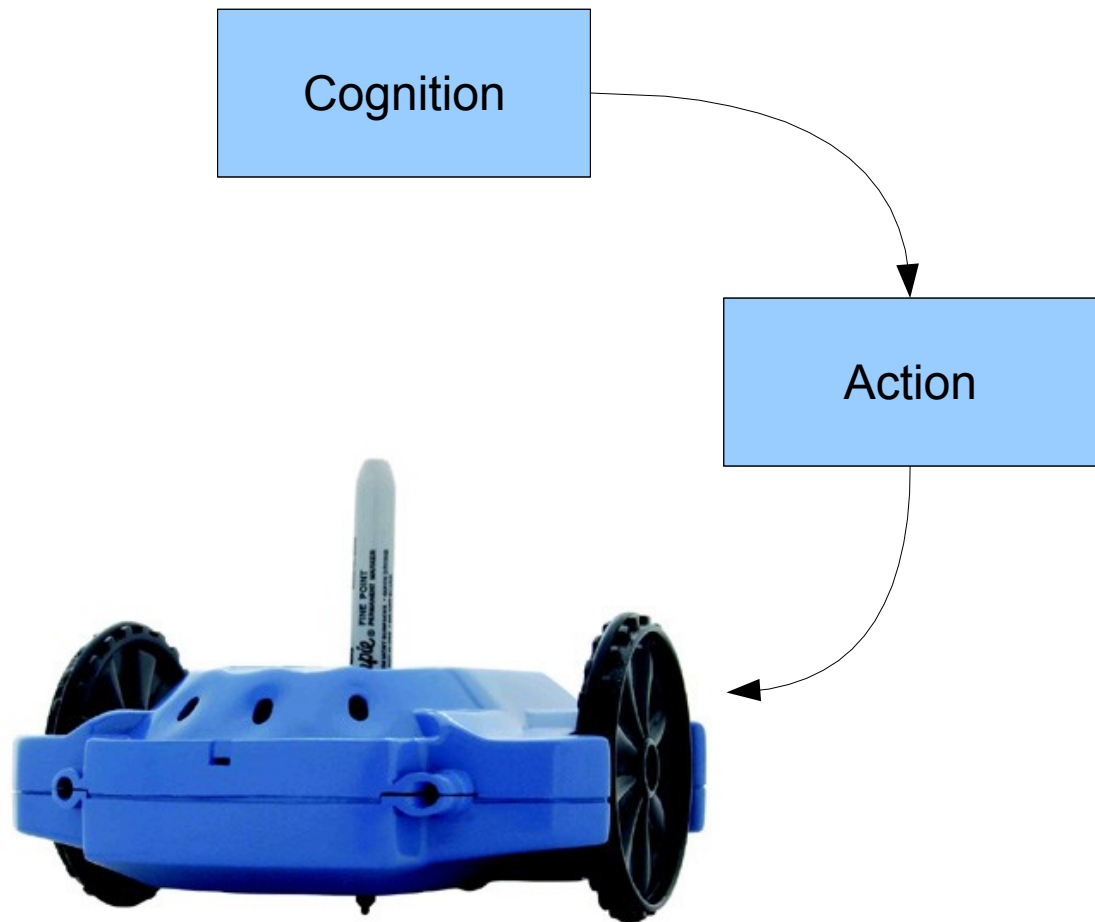


# Outline

- Sensor types and overview
- Common sensors in detail
- Sensor modeling and calibration
- Perception processing preview
- Summary

# Open Loop Control

- No sensing input



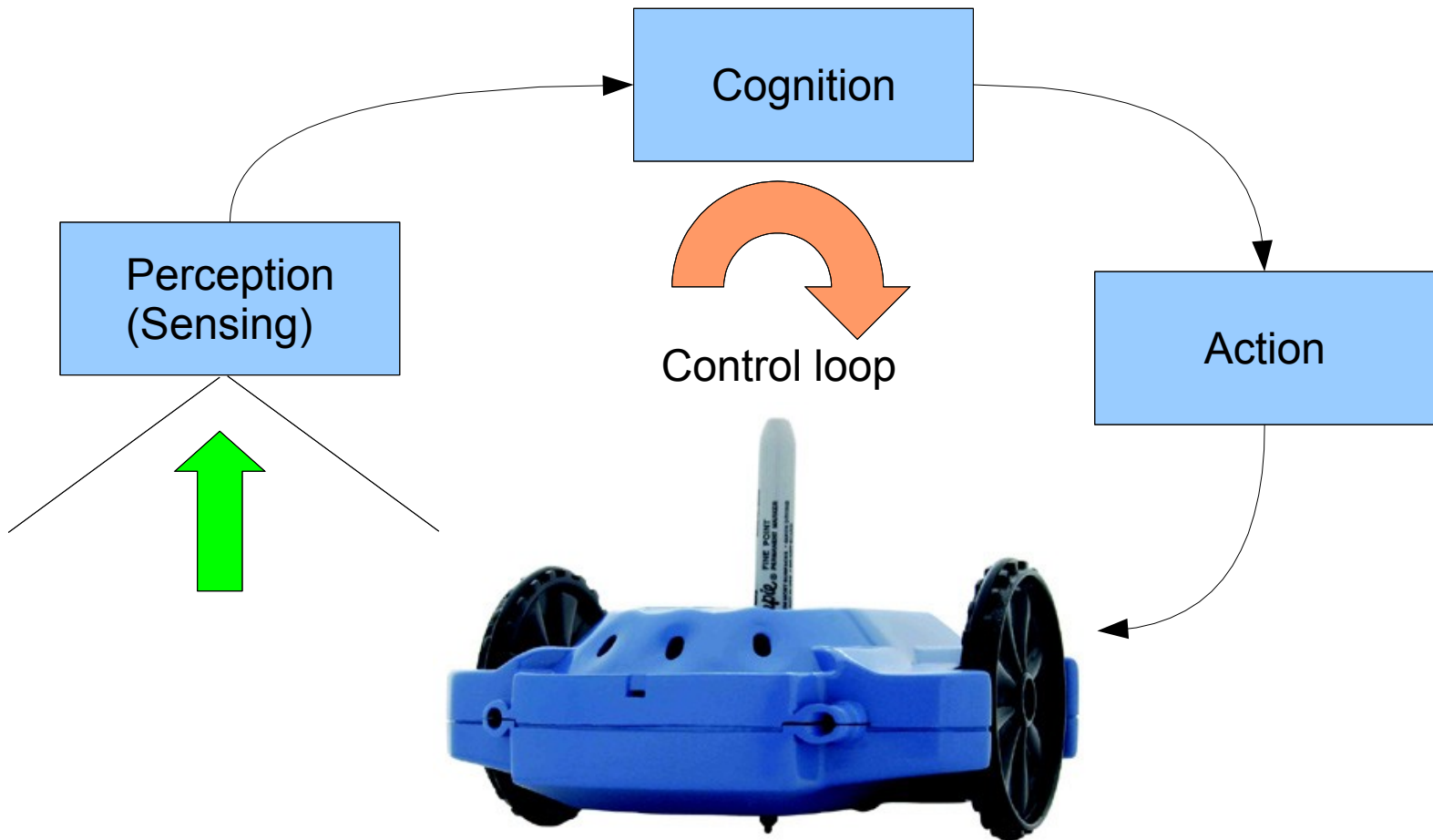
# Why Sense?

- To acquire information about the environment and oneself
- Open loop control suffers from
  - Uncertainty, changes in the world
  - Error detection and correction



# The Sensing Loop

- “Feedback” control



# Issues to Address

- What sensors to use?
- How to model the sensor?
- How to calibrate intrinsic/extrinsic models?
- What low-level processing?
- What high-level processing (perception)?

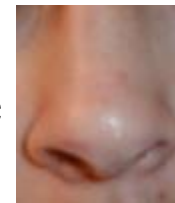
# Comparison: Human Sensors

## Sense:

- Vision
- Audition
- Gustation
- Olfaction
- Tactition

## Sensor:

- Eyes
- Ears
- Tongue
- Nose
- Skin



# Robot Sensors

## Sense:

- Equilibrioception
- Proprioception
- Magnetoception
- Electroception
- Echolocation
- Pressure gradient

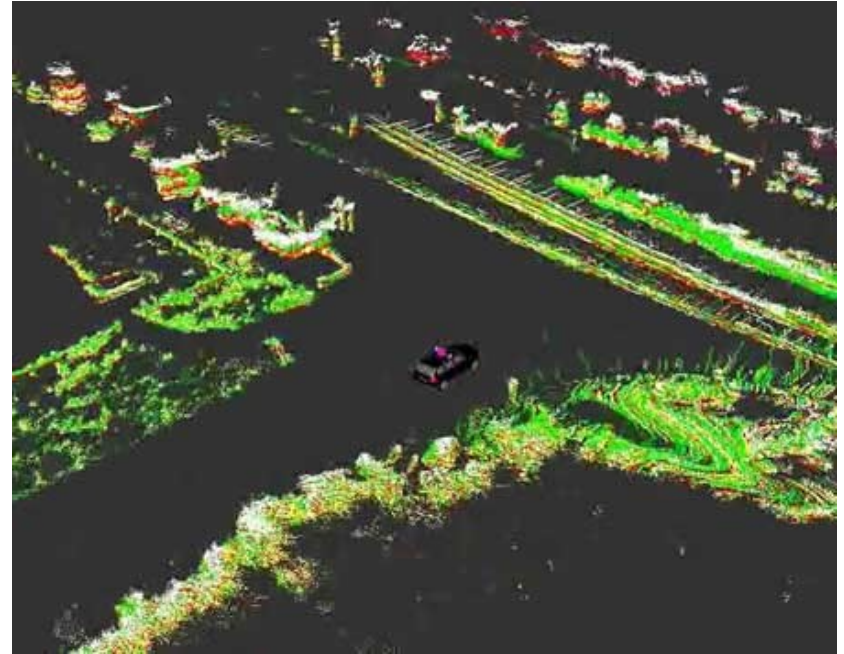
## Sensor:

- Accelerometer
- Encoders
- Magnetometer
- Voltage sensor
- Sonar
- Array of pressure sensors





# LiDAR Sensing



# LiDAR Variations

Tartan Racing Team



Boss vehicle

# Sensor Examples

- (CMU) Tartan Racing Urban Challenge vehicle
- Groundhog, subterranean mapping (CMU)
  - Carnegie Mellon Mine Mapping Project
- Ocean explorer [www.oceanexplorer.noaa.gov](http://www.oceanexplorer.noaa.gov)



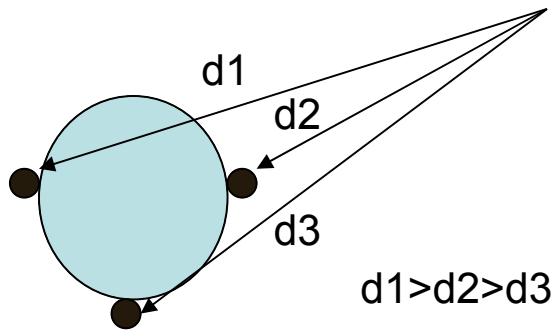
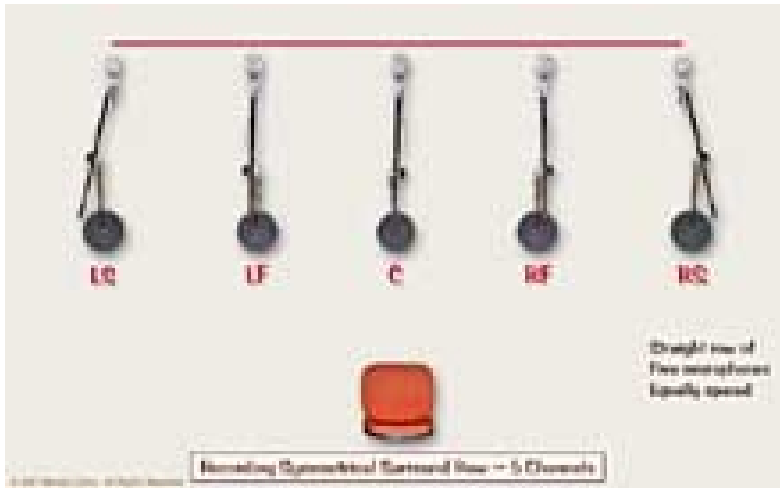


# Popular Sensors in Robotics

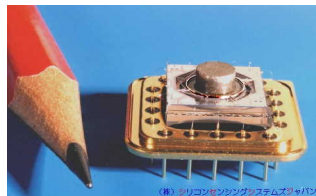
- LiDar
- Infrared
- Radar
- Sonar
- Cameras
- GPS
- Accelerometers
- Gyros, encoders
- Contact switch



# Auditory



# Other Robot Sensors



Gyroscope



Lever Switch



Linear Encoder



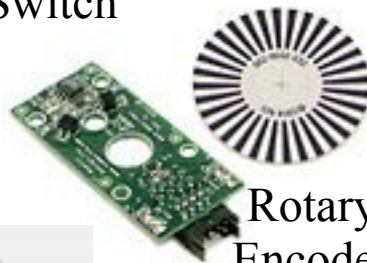
GPS



PIR



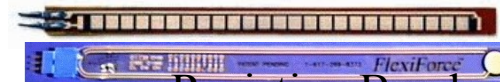
Piezo Bend



Rotary Encoder



Accelerometer



Resistive Bend



Pendulum Resistive Tilt



Pyroelectric Detector



Gas



Radiation



Pressure



UV Detector



IR Modulator Receiver



Metal Detector



CDS Cell



Compass



Magnetometer



Magnetic Reed Switch

# Sensing Classification

Exteroceptive

Proprioceptive

Active

Passive

- Laser/LiDar
- Sonar
- Radar
- Structured light
- InfraRed

- Vision
- Microphone array
- Chemical sensors
- Tactile sensor

- Gyroscope
- Accelerometers
- Odometers
- Voltage sensors
- Stress/strain gauge

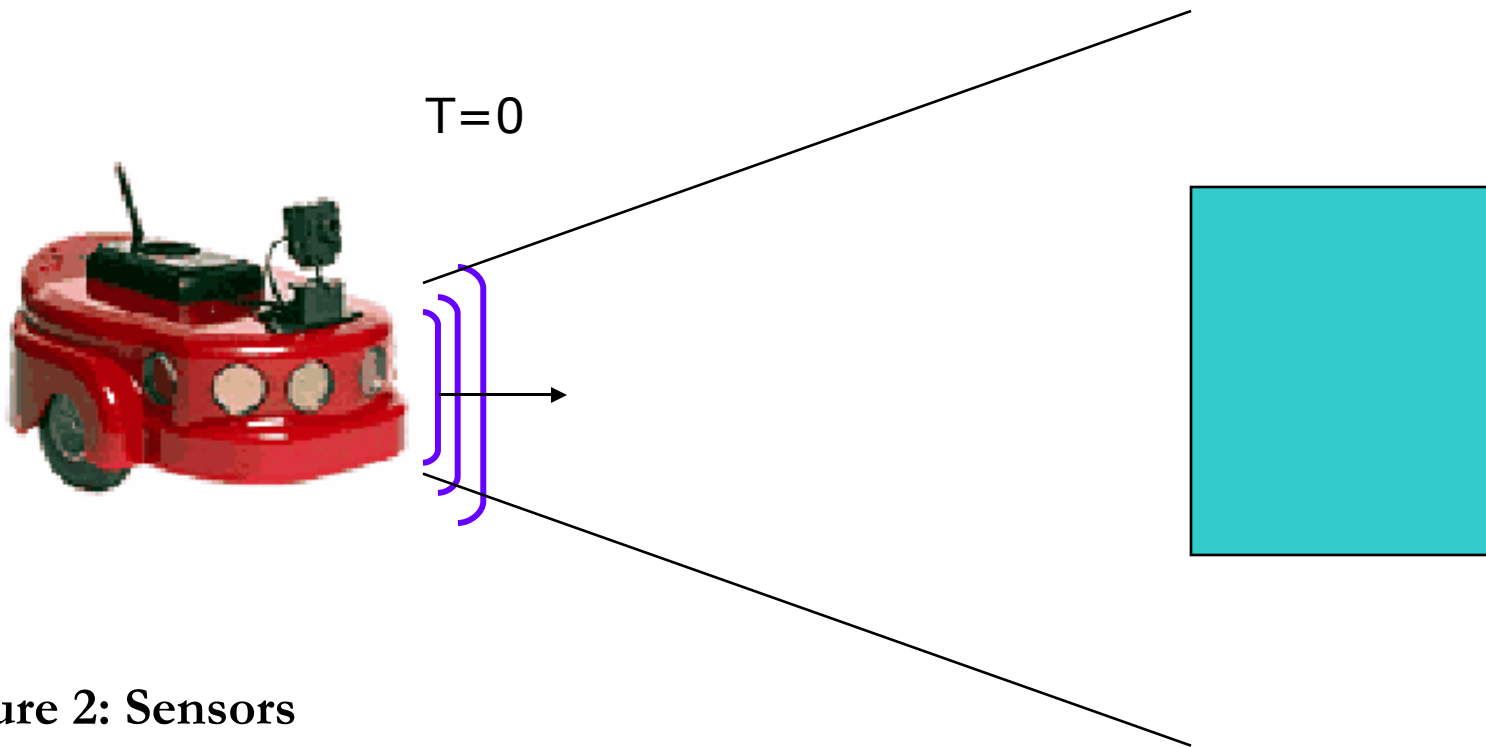
# Sensors We Will Look At Today

- Exterioceptive
  - Sonar, LiDar, IR
- Proprioceptive
  - Encoders
  - Accelerometers
  - Gyroscopes
  - GPS (hard to categorize)
  - Micro-switch

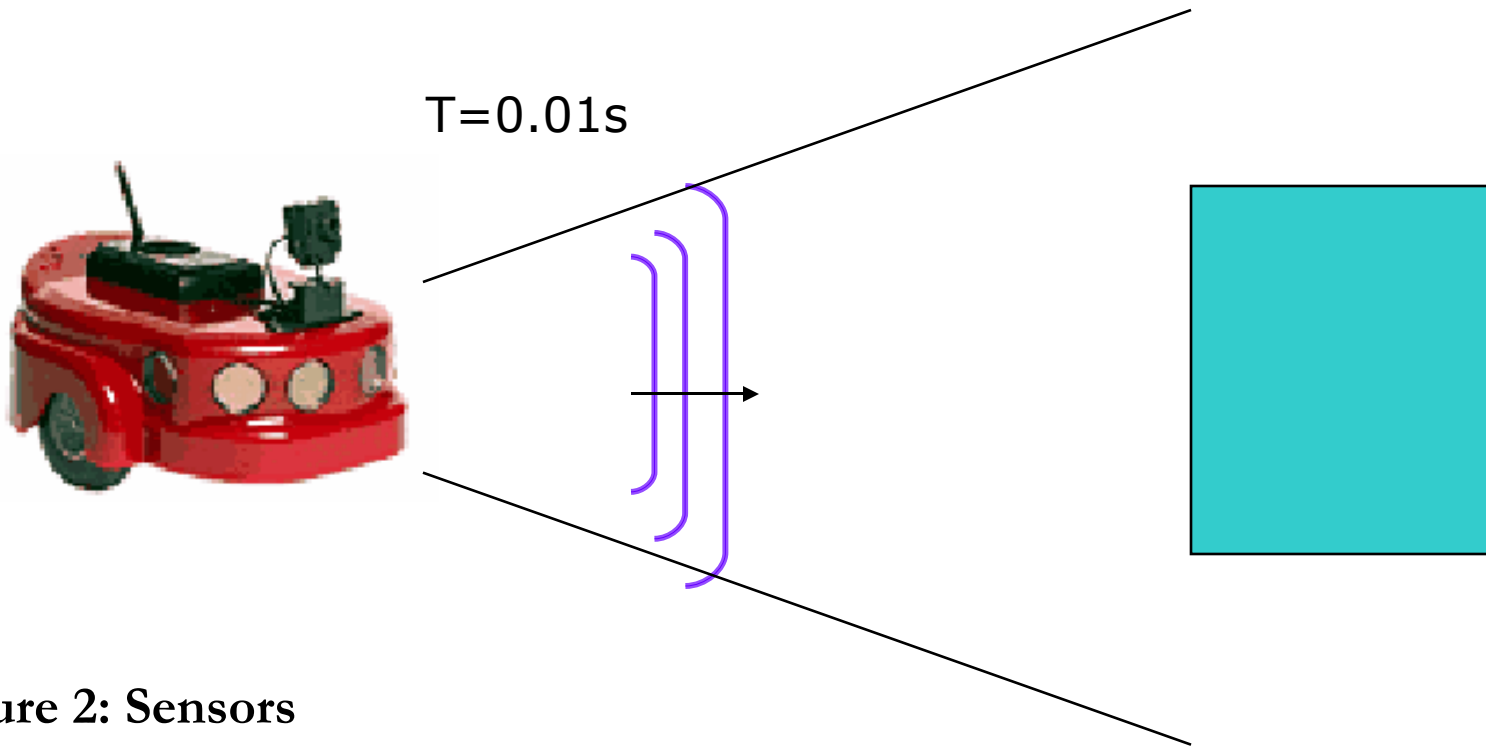


# SoNaR: Sound Navigation and Ranging

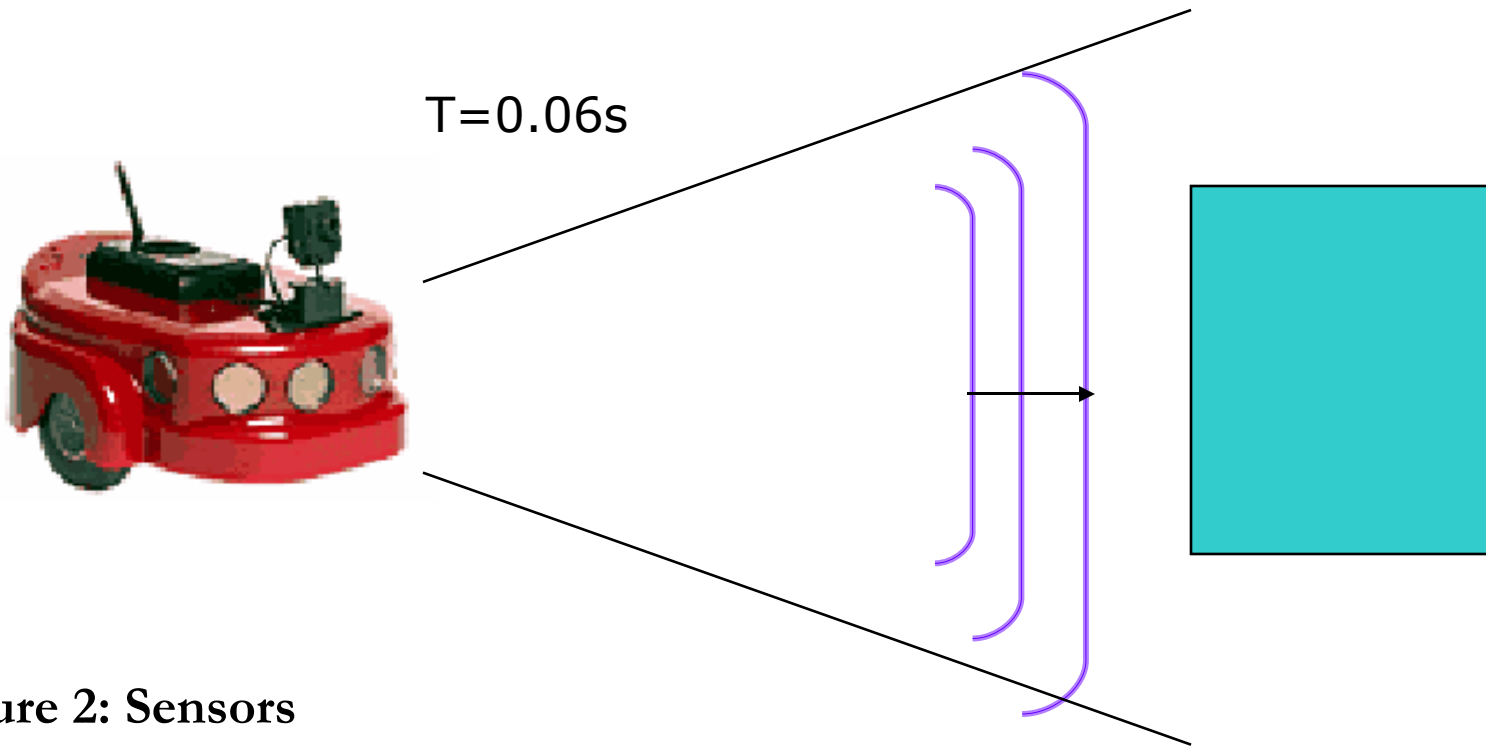
- Often called sonar, ultrasound, Sodar
- Emit a directional sound wave, and listen for echo(s), time the response



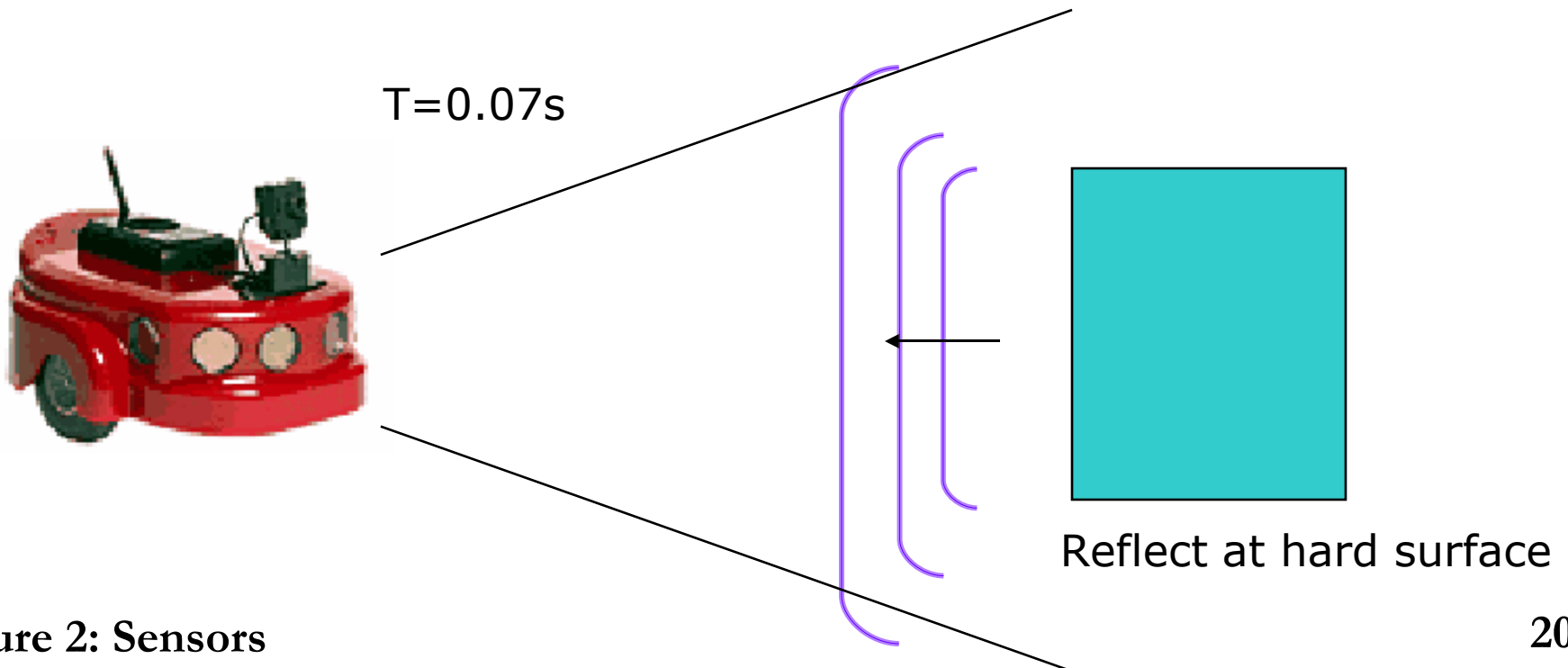
# Sonar Sensors



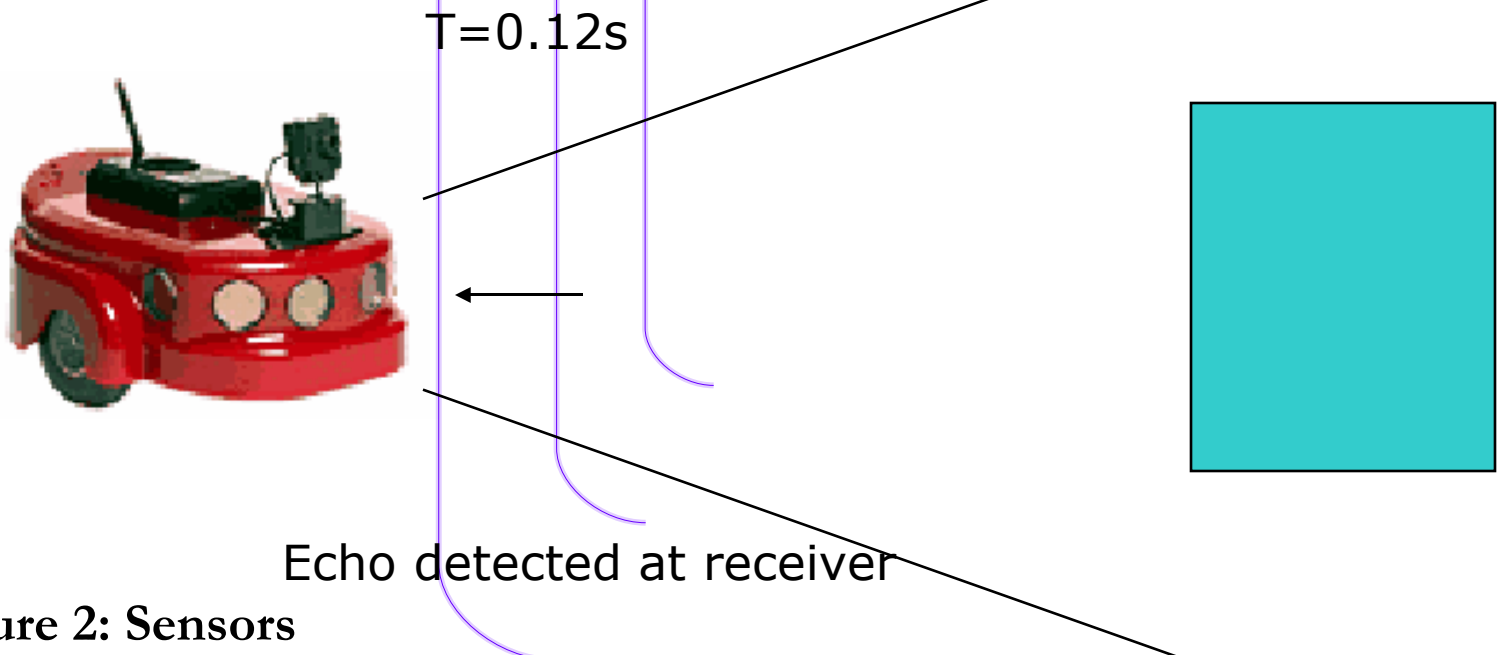
# Sonar Sensors



# Sonar Sensors



# Sonar Sensors



# Sonar Sensors

- Key assumption: sound travels at constant speed
- $v=344$  m/s (dry air, 21C, sea-level)
- So we have

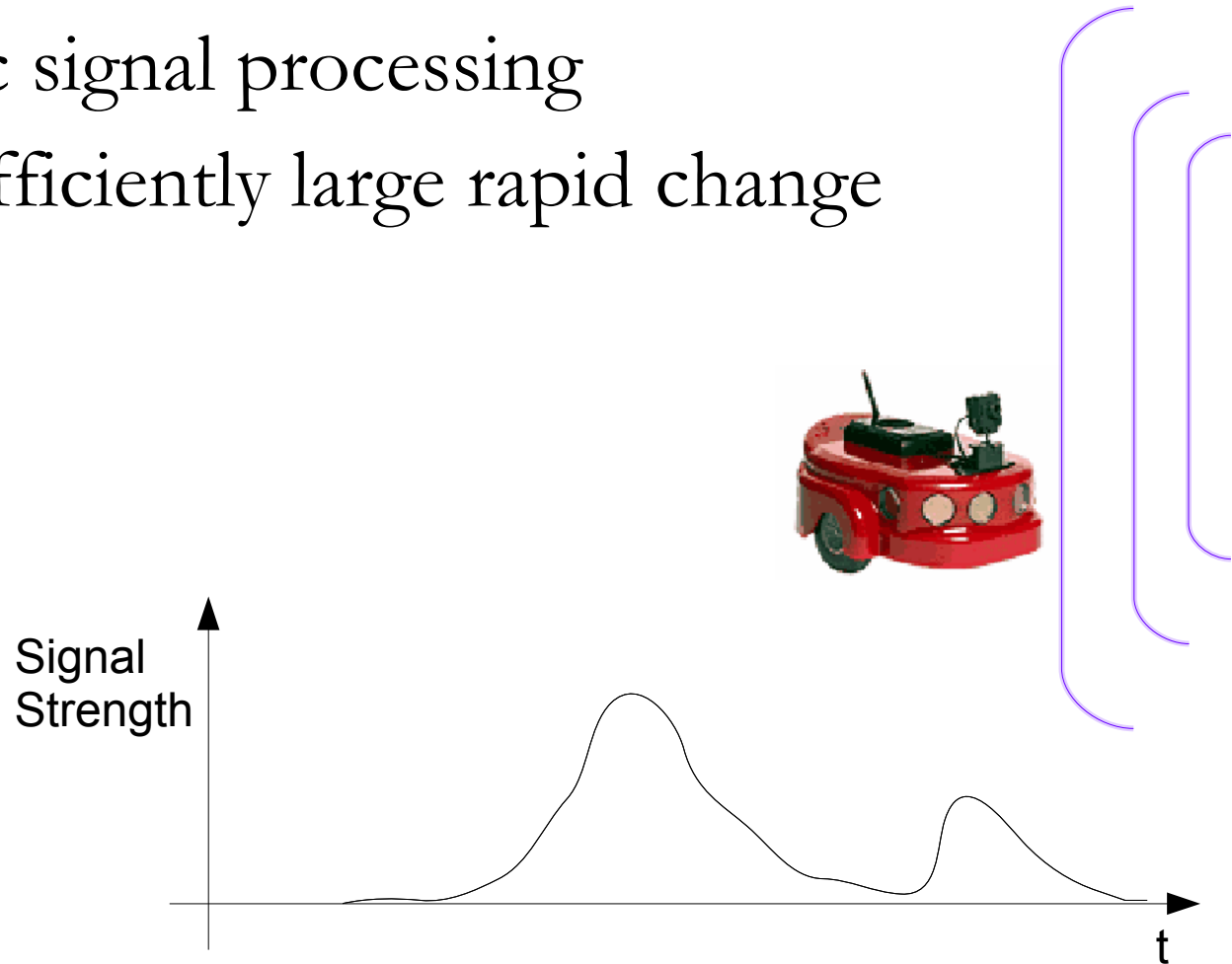


$$d = \frac{1}{2} v T$$
A horizontal double-headed arrow pointing from the toy car to the right, indicating the distance  $d$ .



# How To Detect the Echo?

- Electronic signal processing
- Detect sufficiently large rapid change



# Imperfect Sensing

- What can go wrong?
  - Speed of sound changes with temperature, pressure, humidity

$$v_{ideal} = \sqrt{\frac{\gamma k T}{m}}$$

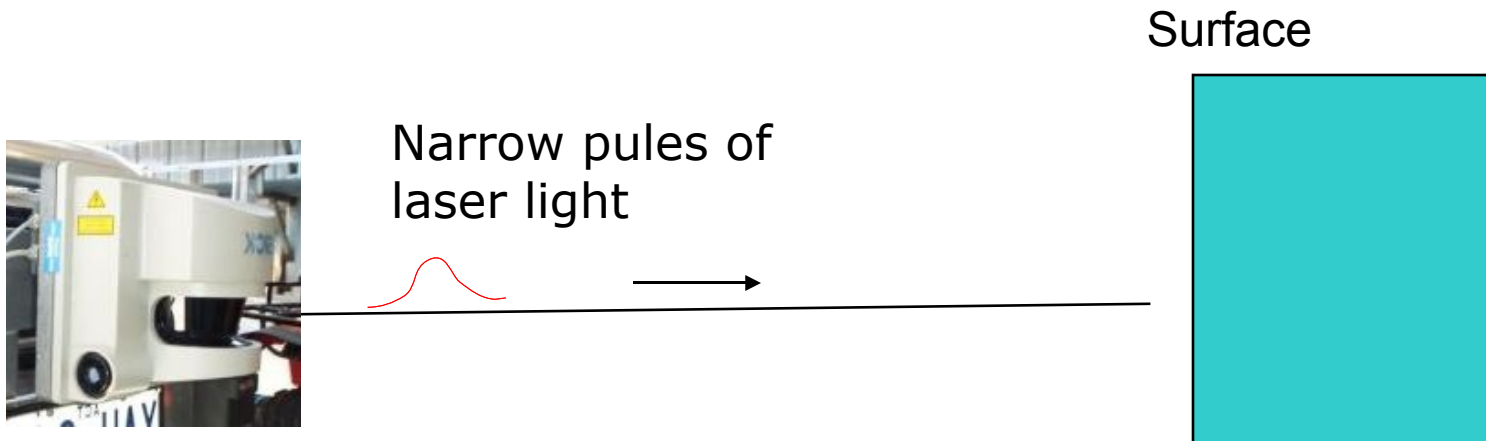
*See wikipedia*

- Surface reflection properties
- Atmospheric attenuation (finite range)
- Multiple echos (multi-path)
- Quantization in timing
- Inaccuracies in detecting response signal onset



# LiDar

- Light Detection and Ranging
- Different variants, we'll focus on time to return
- Same model as Sonar



# LiDar

- Timed “echo” from reflection

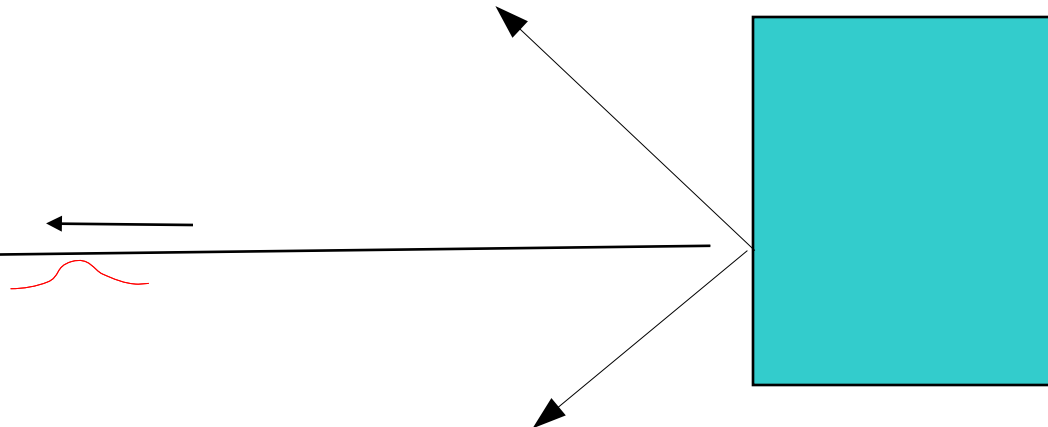
$$c_{\text{vacuum}} = \frac{1}{\sqrt{\mu_0 \epsilon_0}} \approx 3 \times 10^8 \text{ m.s}^{-1}$$

$$d = \frac{T}{2c}$$



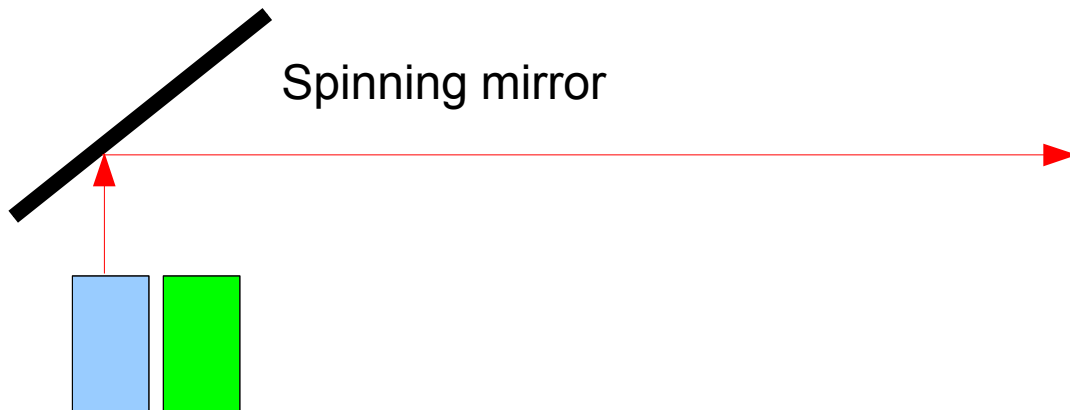
Reflected light

Surface



# SICK LiDar

- Very common unit
- Spinning mirror assembly gives line scan
  - Ranges vary (90, 180 degree, 50+m)
  - Scanning rates vary (e.g. 20Hz, 75Hz)
  - Resolutions (e.g. 0.25 degree, 10mm)
  - Accuracy  $\sim$ 30mm in range



# SICK LiDAR Internals

- From <http://web.mit.edu/kvogt/www/lidar.html>



# LiDar Variations

NREC Crusher Vehicle



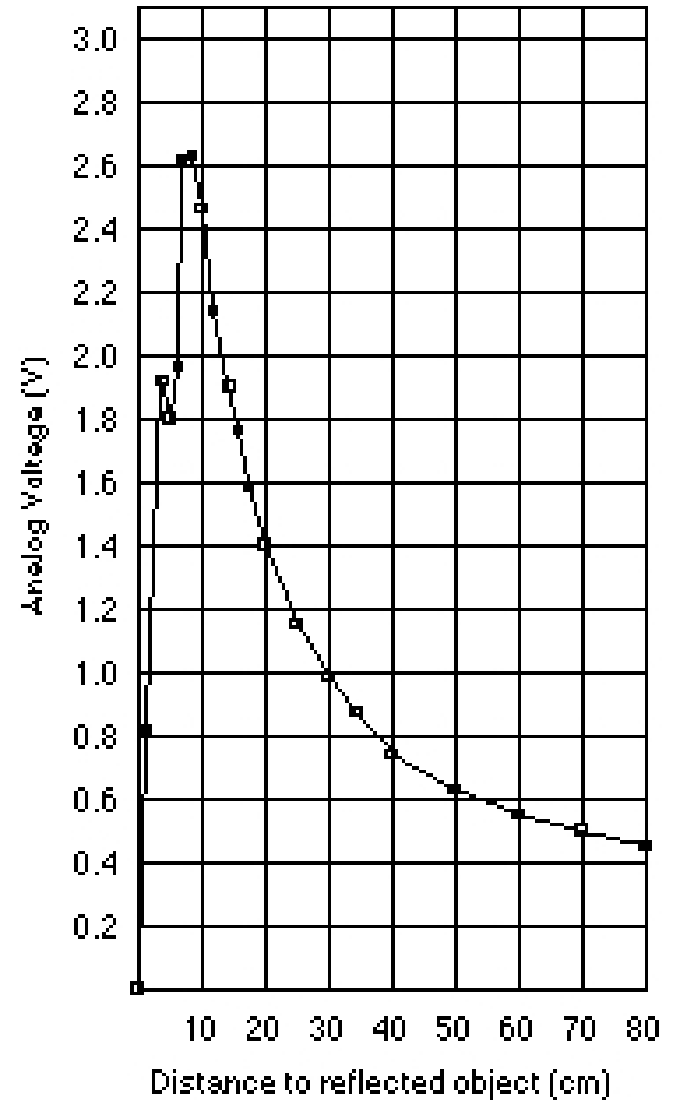
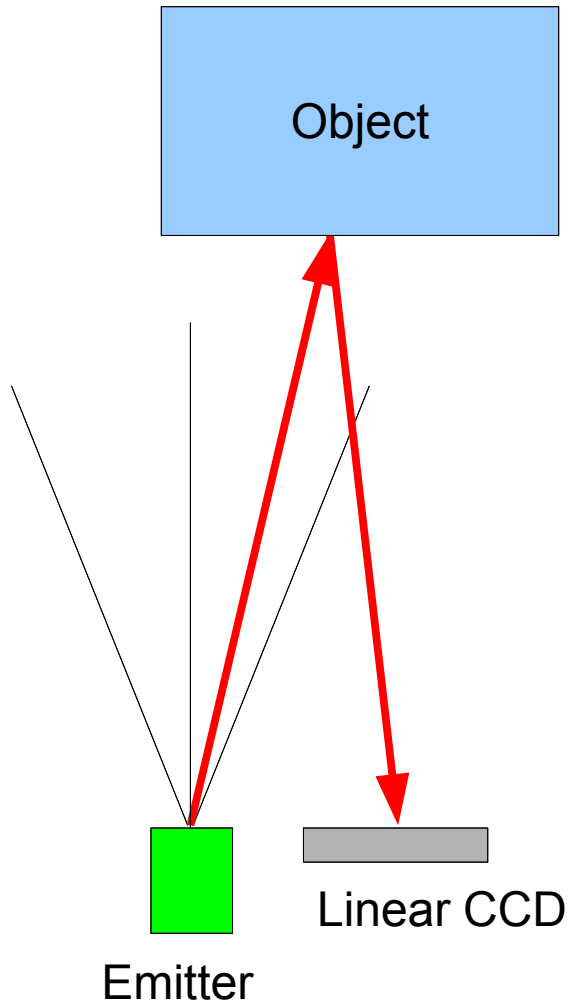
Crusher with sensors

# InfraRed

- Emitter/detector pair
- Output type
  - Digital (strength of return threshold)
  - Analog range using triangulation
- Usually short-range (<1m)
- Can be sensitive to IR sources e.g. sun

# Sharp IR Sensor

<http://www.acroname.com>

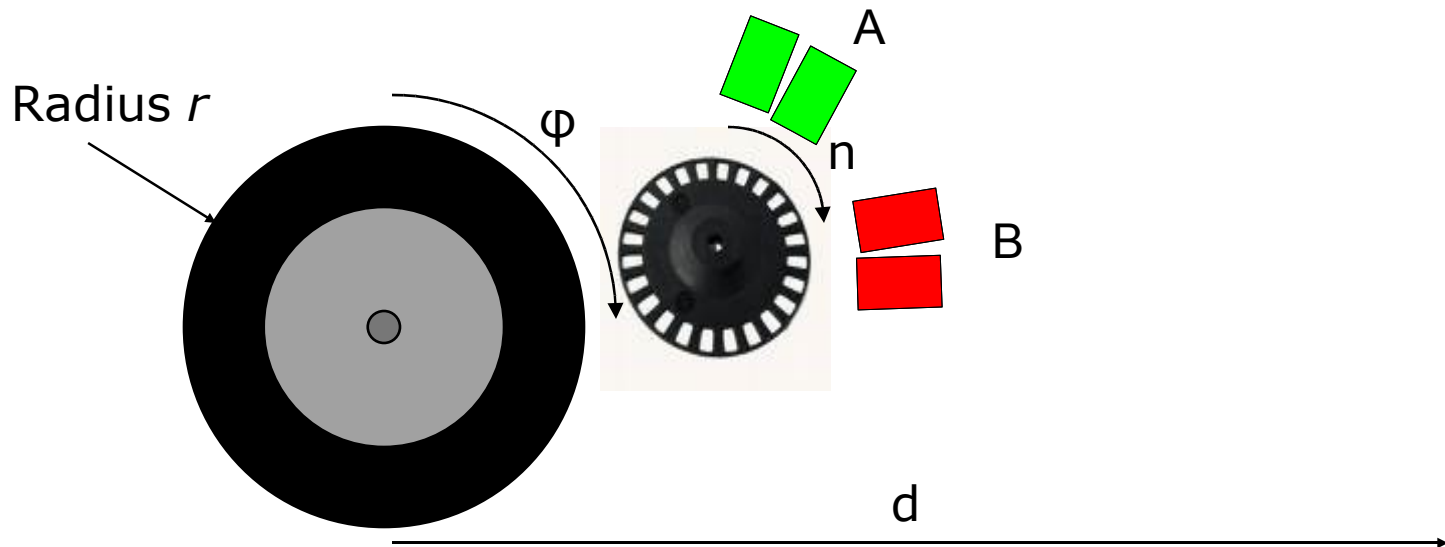


# Proprioceptive Sensors



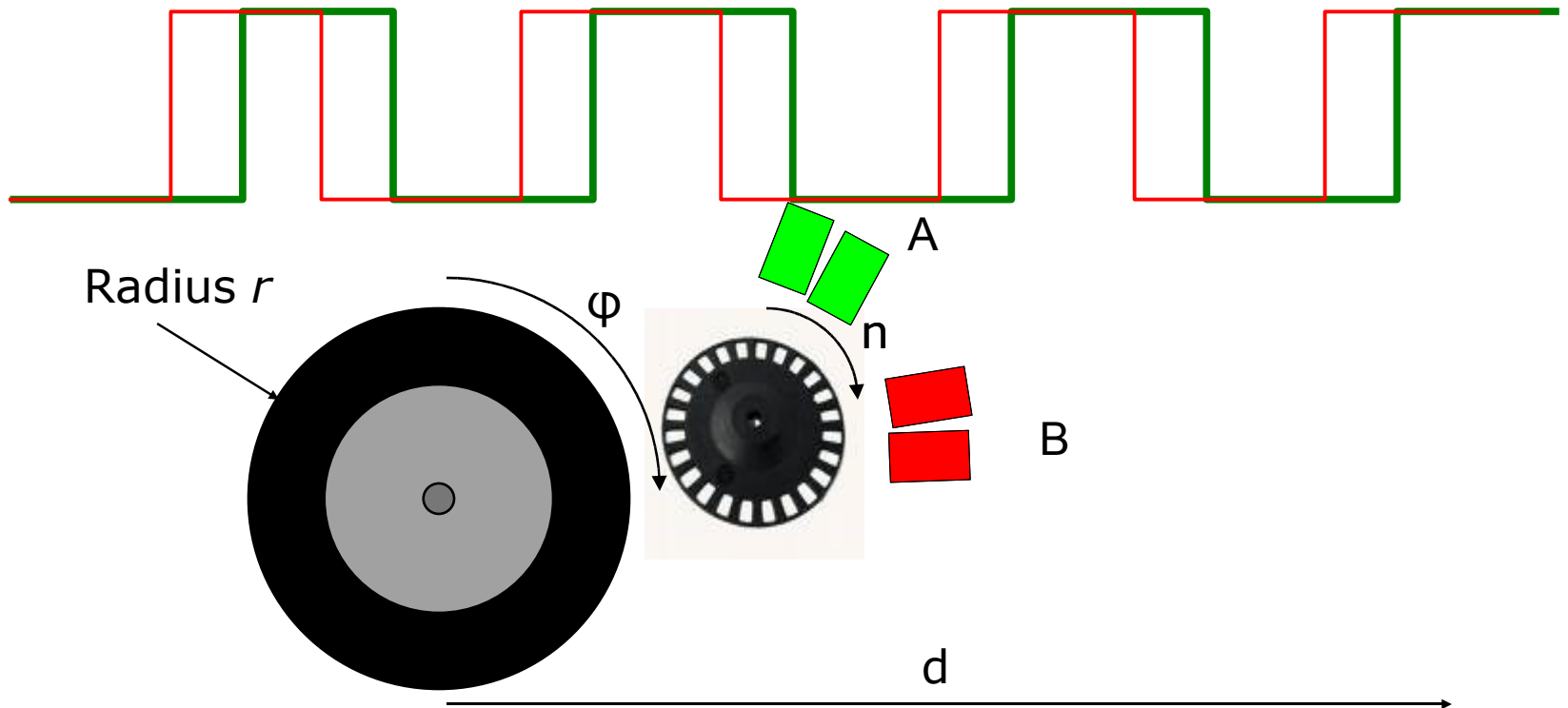
# Optical Encoders

- Disc to measure *rotational* motion
- Out of phase IR emitter/detector pair



# Optical Encoders

- Direction and amount of rotation from edge transitions



# In Practice

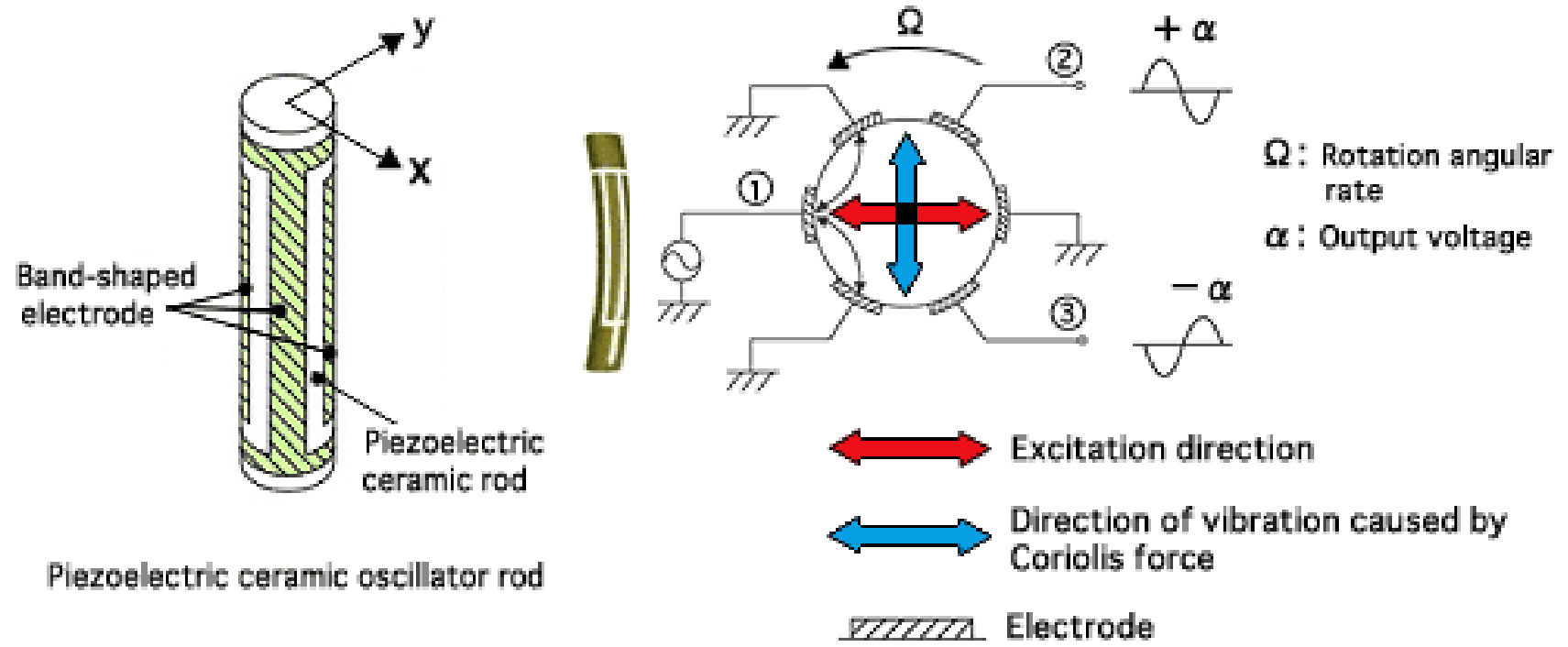
- Electronic hardware (MCU or ASIC) provides counting, de-bouncing
- Estimate speed by sampling encoder counts
  - Model to provide wheel speed from encoder counts
- How to get vehicle speeds from wheel speeds?
  - This is kinematics! (Later in the course)

# Gyroscopes

- Proprioceptive sensor
- Maintaining estimate of orientation
  - Mechanical devices
  - Fiber optic gyroscope
  - Vibrating gyroscope (e.g. MEMS)

## Rotational Angular Velocity Sensor

Operation principle : An angular velocity sensor that works by using the phenomenon generated by **Coriolis force** when angular velocity is applied to a moving object in relation to velocity and orthogonal directions.

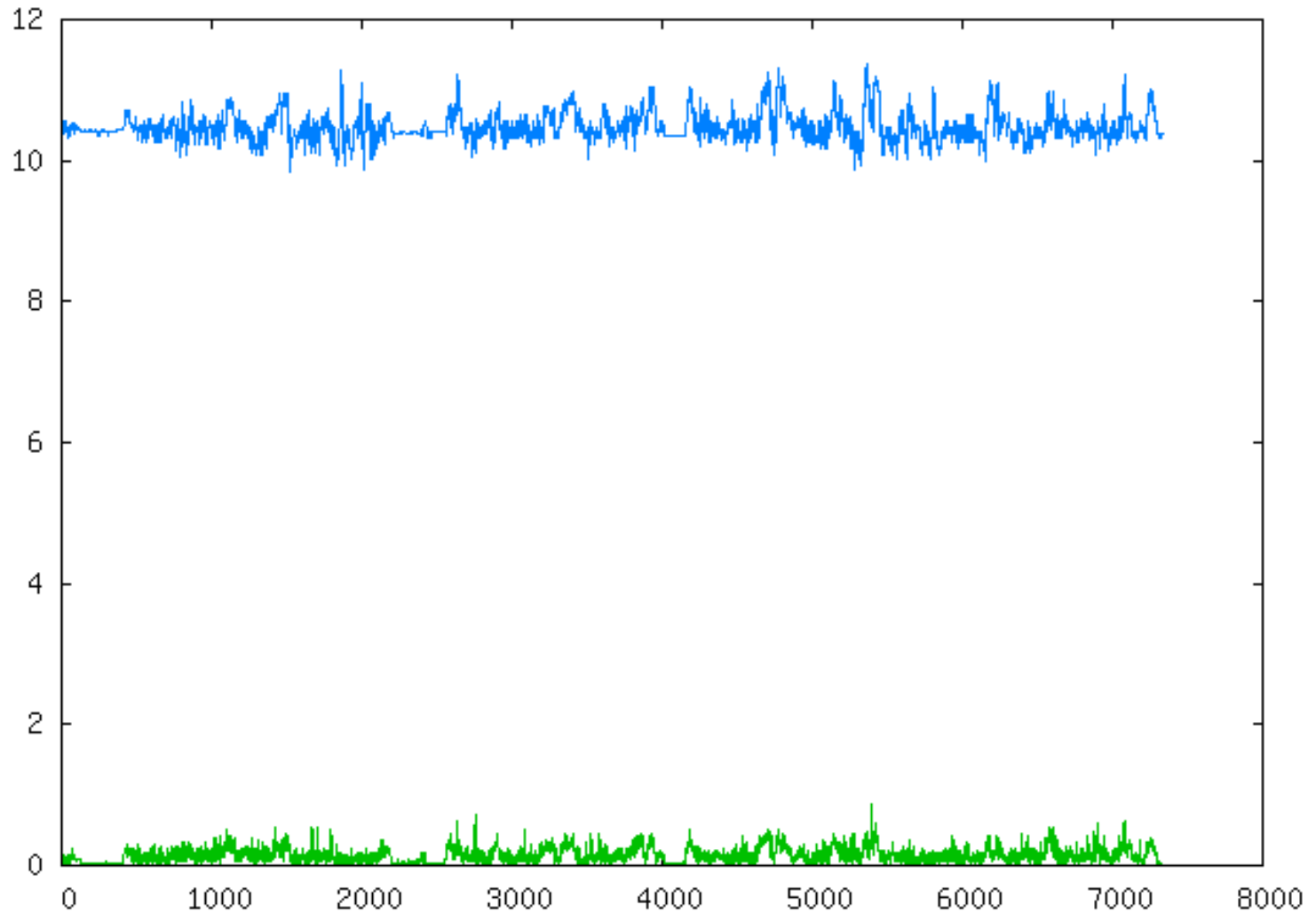


# Accelerometers

- Measure acceleration in a direction of travel
  - Typically MEMS device
- Also measures gravity
  - Good old relativity...
  - Can use with gyroscopes to remove gravity component
- Typically very noisy
- Need to double integrate to get position

# Accelerometers

Sensor acceleration, mid-term accel



# Issues With Accelerometers / Gyros

- Noise
  - Output readings may have approximately additive Gaussian noise
- Drift
  - Signal drifts from true value over time – Gyro heading
  - Usually need to integrate accelerometers



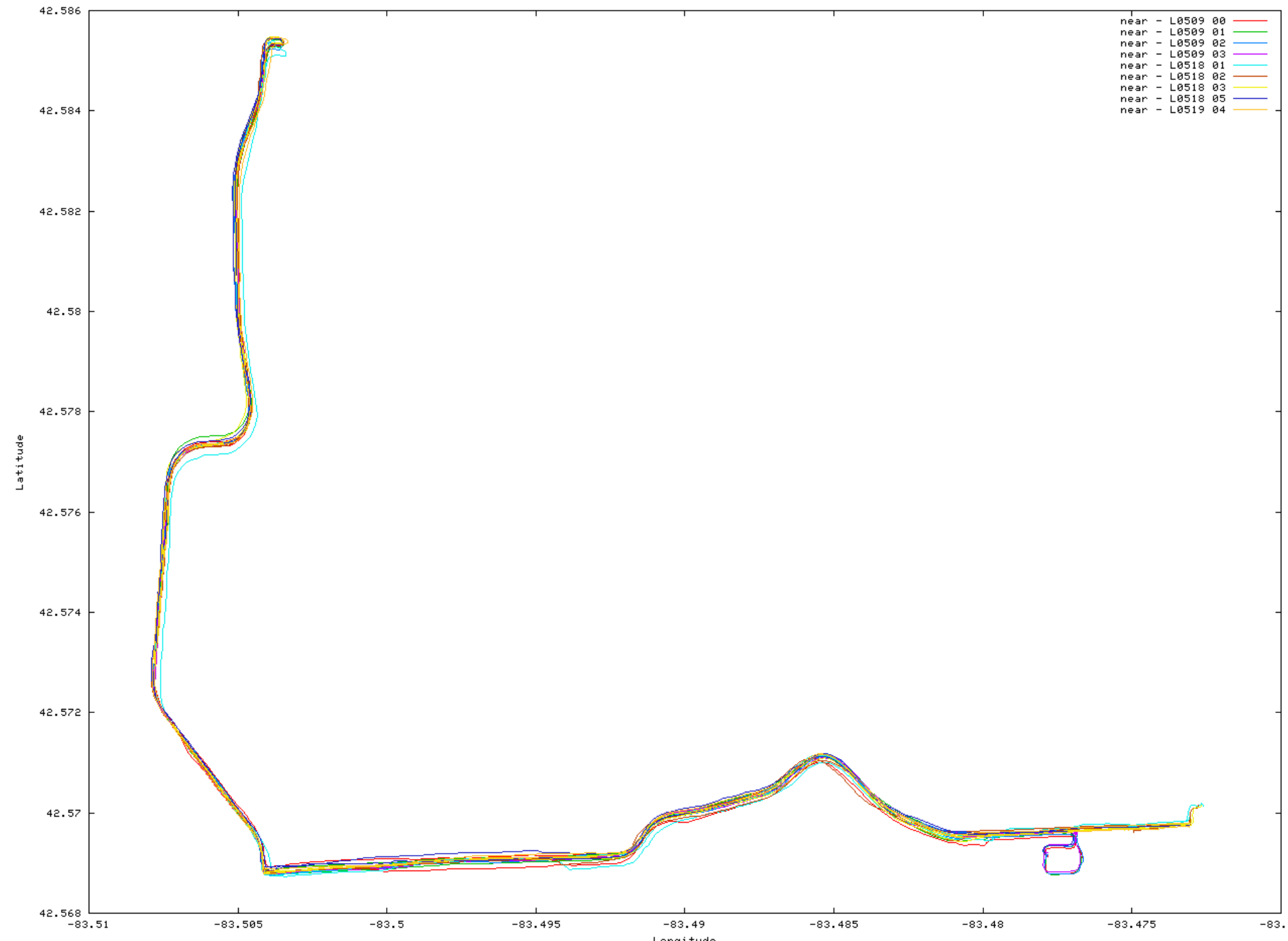
# GPS / Glonass / Galileo

- Orbiting satellites
  - Known trajectories
  - Highly precise timers
- Transmit data in Ghz band
  - Ephemeris information
  - Develop pseudo range to satellite
- Solve for receiver position
- Can also solve for velocity



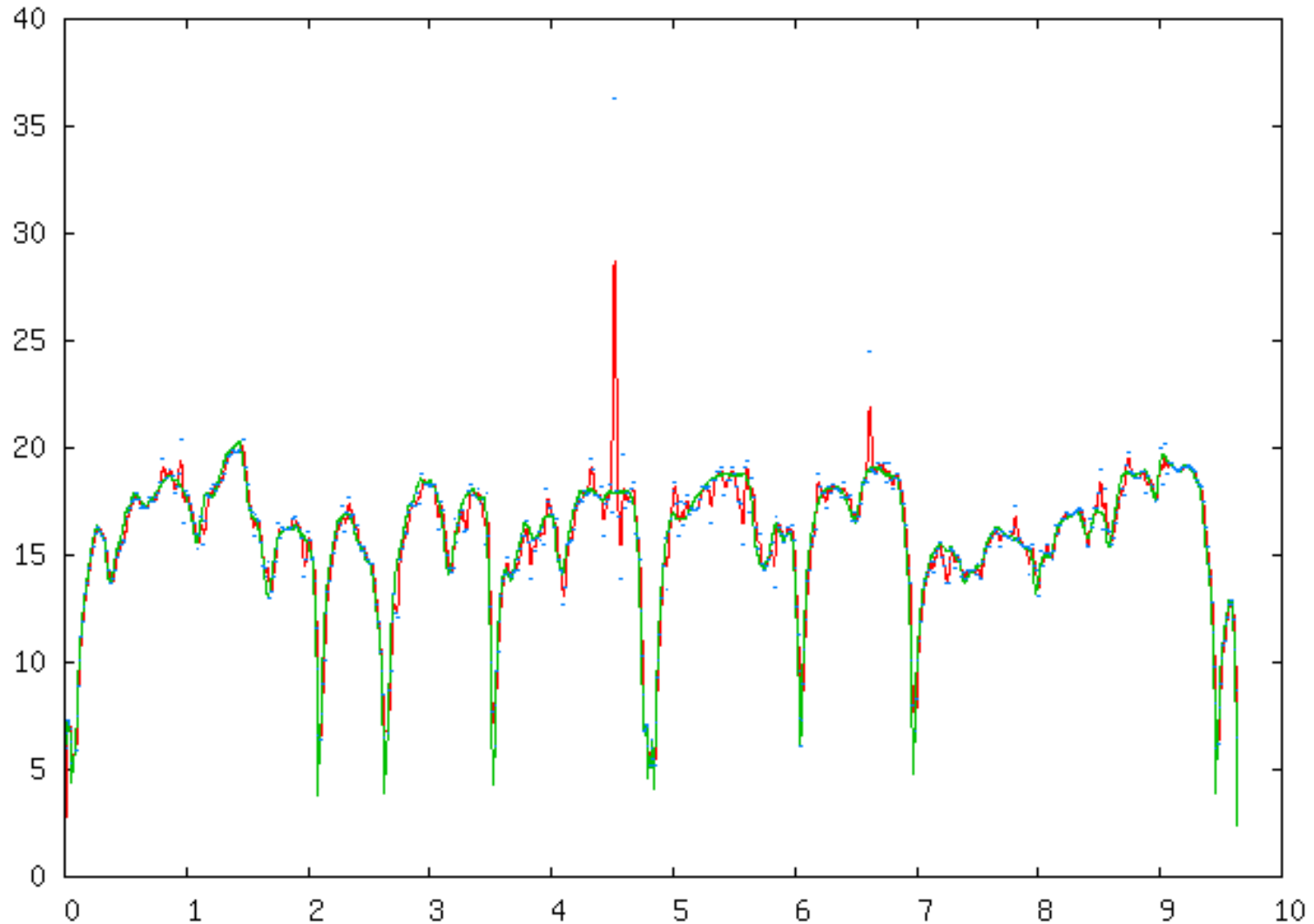
Longitude vs Latitude (near) --- All Data sets

near - L0509 00  
near - L0509 01  
near - L0509 02  
near - L0509 03  
near - L0518 01  
near - L0518 02  
near - L0518 03  
near - L0518 05  
near - L0519 04



# Ground Speed Profile

smoothed xy speed

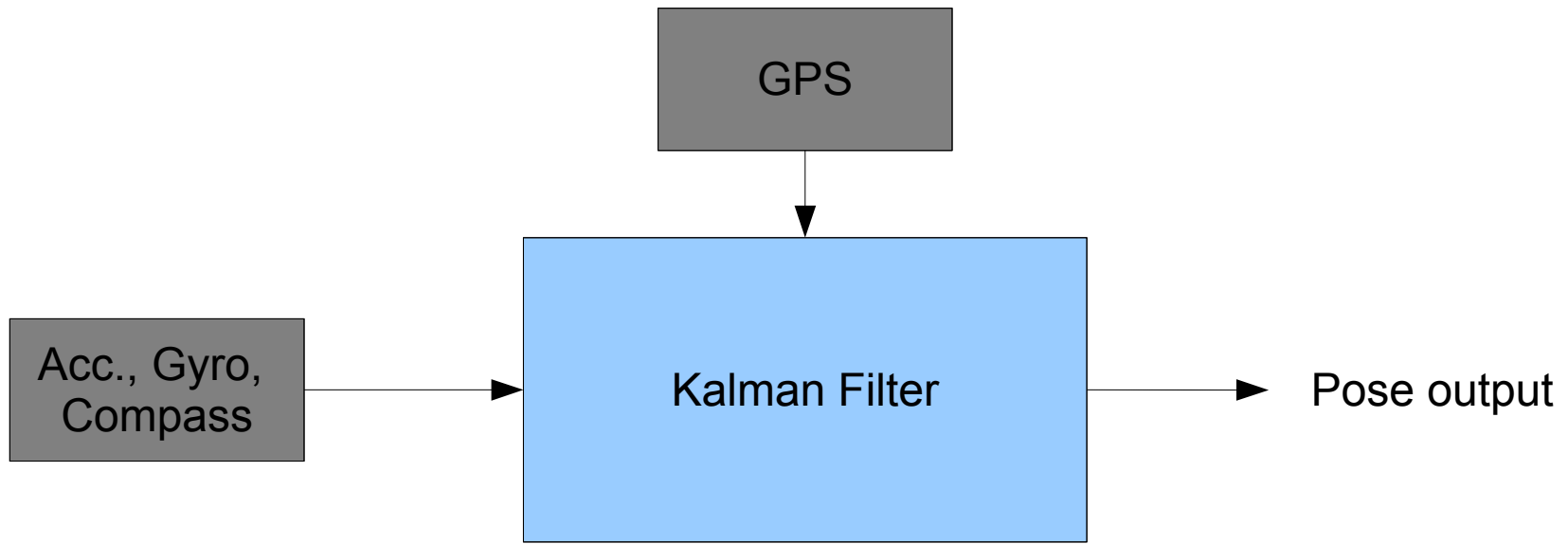


# GPS Properties

- Many causes of error
  - Ionospheric effects, line of site clearance
  - Delays in satellite positional updates, multi-path
- Is it Gaussian?
  - Over hours, approximately Gaussian errors
  - Over short time, small error but strong bias
- Improvements
  - DGPS, WAAS ( $\sim 3\text{m}$  accuracy at 3 sigma)
  - Use an INS (Accelerometers/gyros)

# GPS/INS

- Commercial solutions exist (expensive!)
- Fuse integrated INS estimates with GPS
  - A big custom Kalman filter (more later)

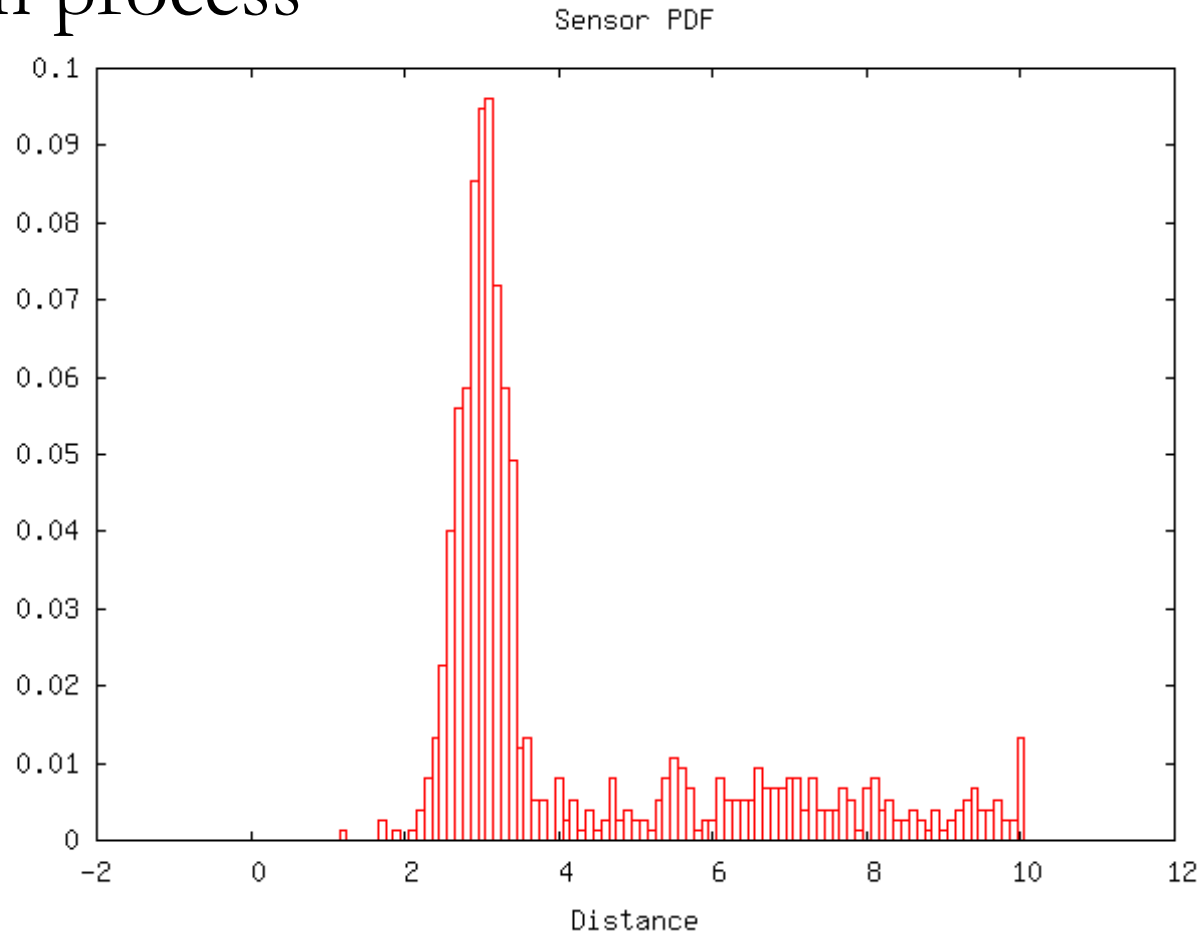
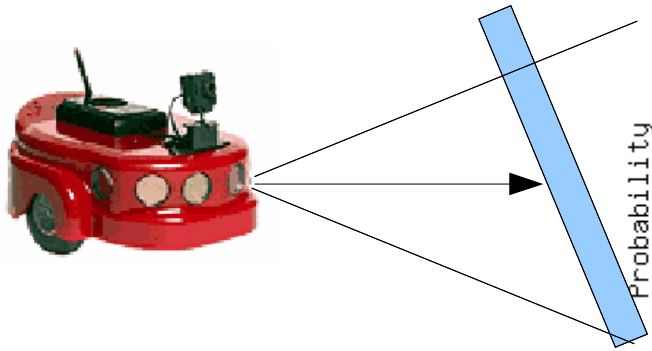


# Sensor Processing and Modeling

- Sensors are **never** perfect
- Noise
- Systematic errors (bias)
- Drift, jumps
- Unmodeled artifacts (looks like bias)

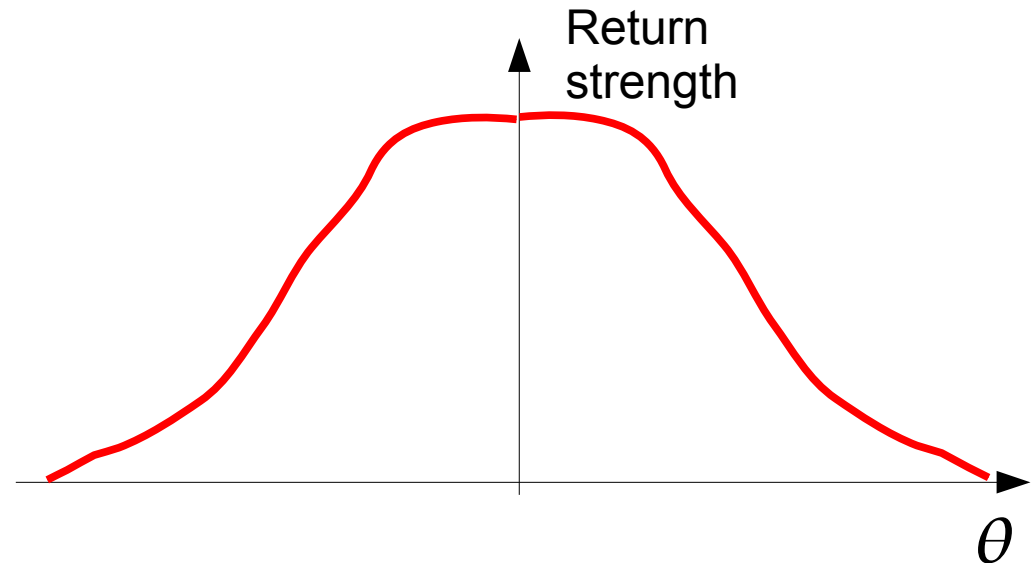
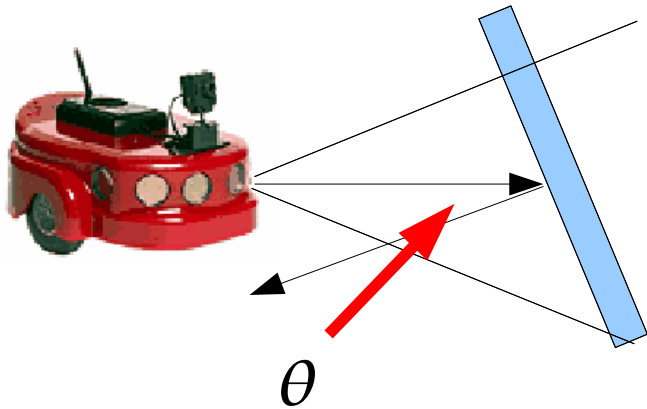
# Sensor Noise

- Fixed object, sensor returns different values over time  $\Rightarrow$  random process



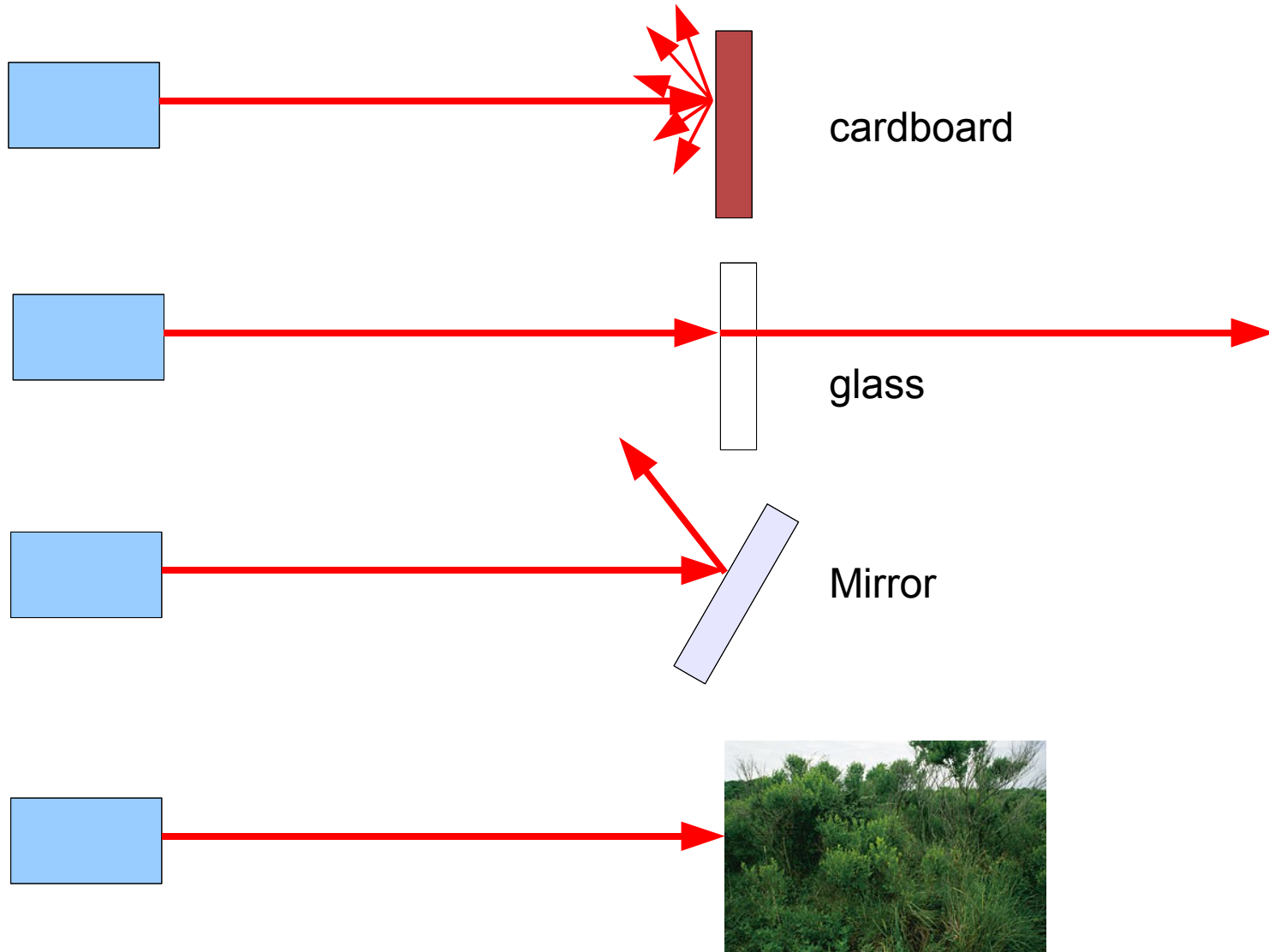
# Sensor Bias

- Return may vary as a function of physical setup
  - Surface material/color, orientation, range, atmosphere





# LiDAR Returns and Material



# Colorized LiDAR

<http://www.aerotecusa.com/>

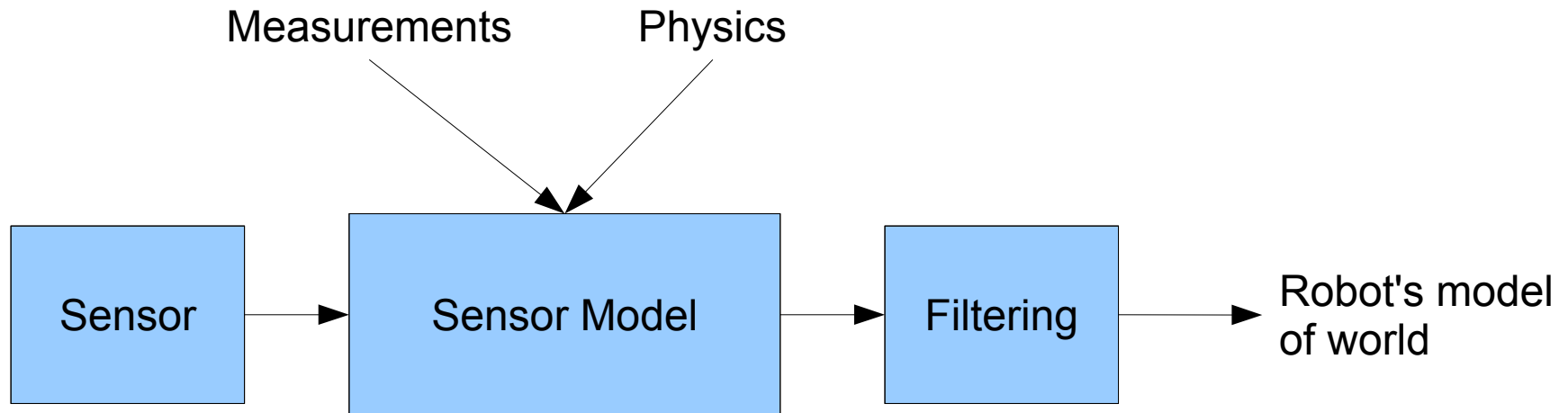


# Helicopter Example

<http://robots.stanford.edu>

# Perception

- Given sensor readings, how does robot determine the structure and content of the world?
- Usual way is to *model* the problem



# Sensor Model

- Model the device physics to obtain the expected device properties and parameters
- Collect data and *fit* model parameters
  - This is *calibration*
- Level of complexity is a trade off
  - Computation, accuracy, reliability, domain knowledge
- Often need to reason explicitly about *uncertainty*

# Sensor Model Components

- Intrinsic model
  - Model of how sensor operates
- Extrinsic model (most sensors)
  - Putting measurements into robot coordinate frame

# An Example

- IR range sensor: triangulated range
- Intrinsic model
  - Given a return, what does it mean for depth?
- Extrinsic model
  - Given depth, where is the obstacle?
- Process
  - Sample data from known “standard” configuration
  - Estimate model/parameters from the data/physics
  - Test the result

# Sensor Uncertainty

- Systematic errors (material, orientation etc.)
- Random errors (any other unknowns)
- Combine into uncertainty model
- Uncertainty model
  - Full pdf (e.g. Particles, histograms)
  - Parametric representation e.g. Gaussian
- Need to use probabilistic algorithms!



# Filtering Approaches

- Often useful to apply initial filtering to signal
  - Use known constraints: domain knowledge
- Thresholding
  - Hysteresis
  - Adaptive thresholds (hard)
- Smoothing
  - Linear filter
  - Kalman filter (later)
- Outlier rejection

# Summary

- Know about
  - A whole class of sensors
  - Typical problems with sensors, and sensor uncertainty
  - Basic approach to modeling a sensor
  - Basic filtering techniques

# Icreate and Scribbler

- ICreate
  - IR sensors
  - Bump sensor
  - Encoders
- Scribbler
  - Encoders
  - IR sensors