

# INTRODUCTION

## Machine Learning for Autonomous Robots

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Motivation

# Machine Learning

*How can computers learn to solve problems without being explicitly programmed?*

Arthur Samuel (1959)

## Lecture Overview

# Lecture Outline

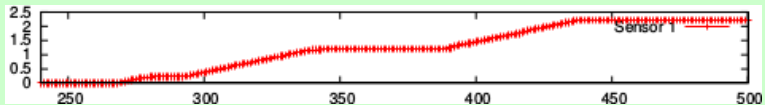
- ▶ Preprocessing
- ▶ Evaluation and Metrics
- ▶ Clustering
- ▶ Classification
- ▶ Regression
- ▶ Neural networks
- ▶ Deep Learning
- ▶ Applied Machine Learning

## Feature Generation and Preprocessing

1. The sensor data, autonomous robots have to decide on can be **simple and “ready to use”**.
2. However, often the available sensor signals have to be **preprocessed** to be usable.
3. Or there is even **no sensor existing** to deliver the needed information.

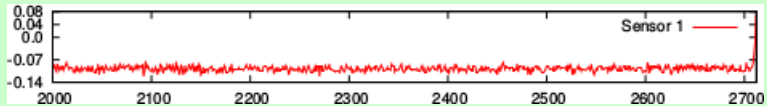
## Examples

- ▶ Wheel speed measurement for a speed controller:



## Examples

- ▶ Noisy signal of an Inertial Measurement Unit (IMU):





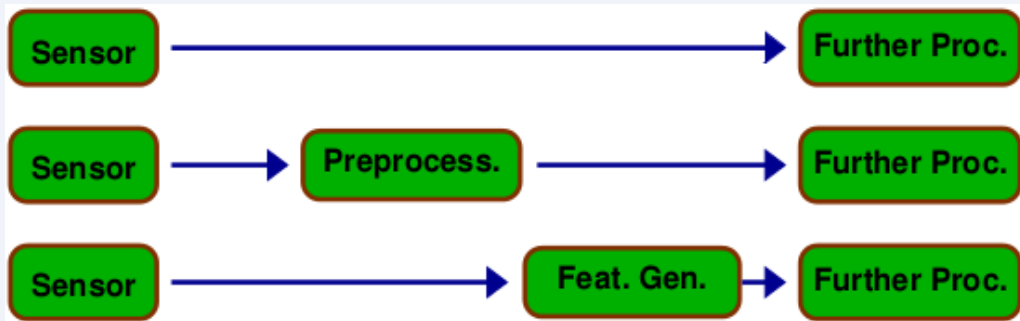
## Examples

- ▶ Sensor for  
“large rock in camera image”:



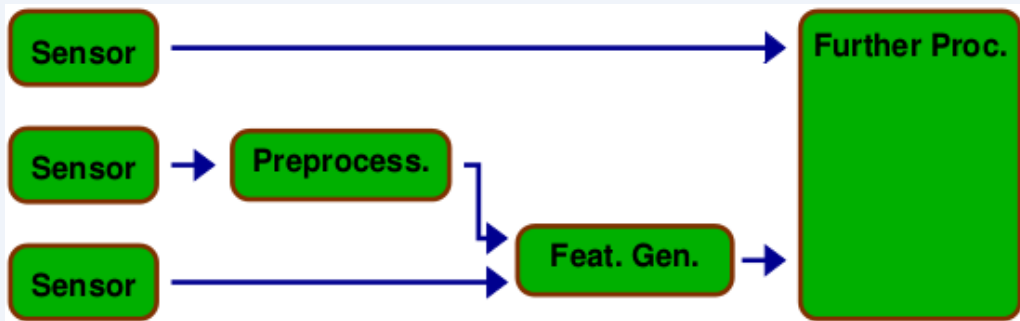
## Data Processing Chain

In general we can find these setups (partly or in parallel):



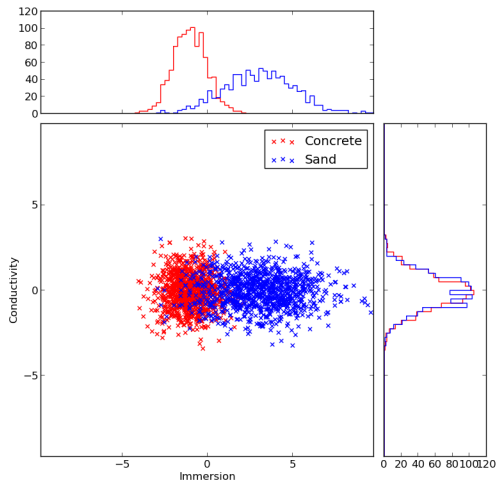
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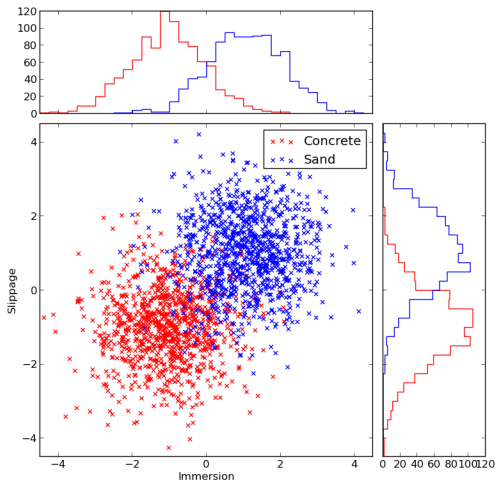
# Preprocessing

Find/construct features that contain useful information for distinguishing different situations



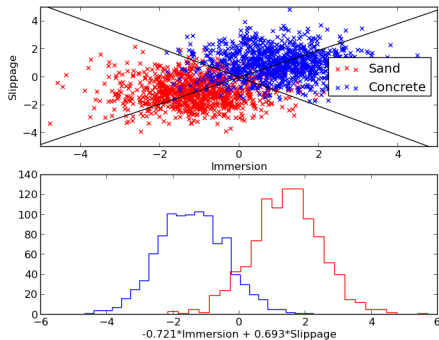
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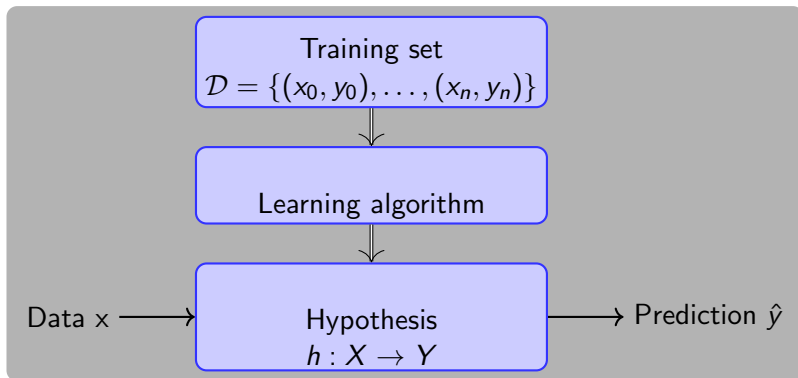
## Applications in robotics:

- ▶ Determine relevant sensors (reduce sensors and save money)
- ▶ Reduce dimensionality of data (e.g. for memory efficient storing or for speed up of further processing)
- ▶ Improve data processing

## Further applications:

- ▶ Data mining
- ▶ Computer Vision

## Supervised vs. Unsupervised Learning

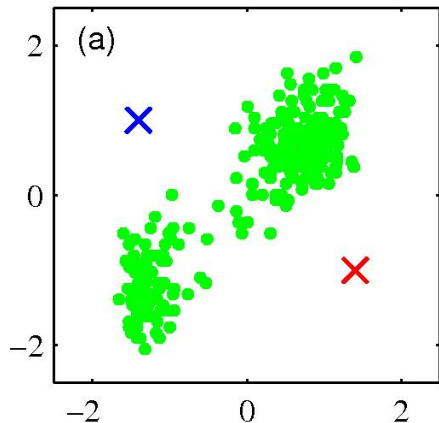


- ▶ If  $Y$  is a discrete domain: classification
- ▶ If  $Y$  is a continuous domain: regression
- ▶ If we don't have the  $y_i$  in training: unsupervised learning



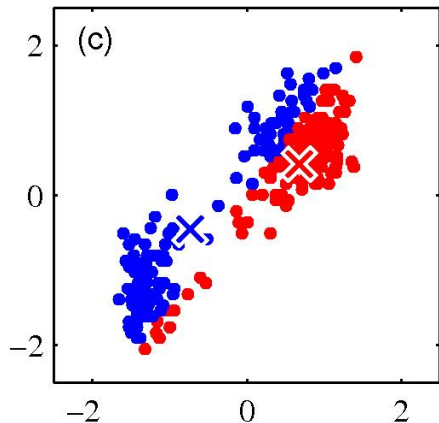
## Clustering

Find clusters such that the within-cluster similarity is larger than the across-cluster similarity



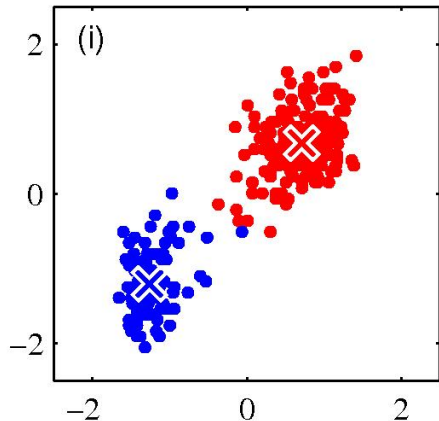
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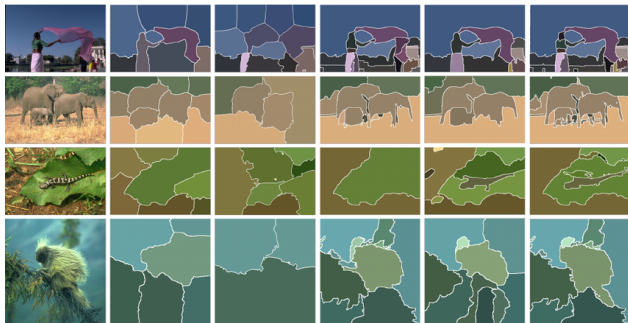
# Clustering

## Applications in robotics:

- ▶ Cluster different substrates a robot has walked over
- ▶ Cluster different objects a robot can interact with into different categories

## Further applications:

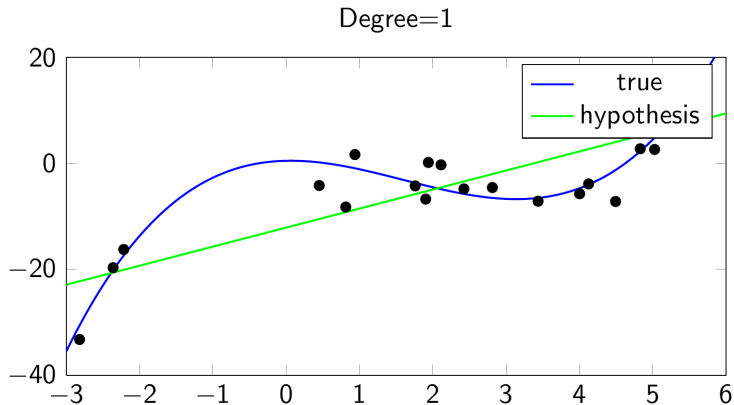
- ▶ Computer vision (segmentation)
- ▶ ...



[https://www.researchgate.net/figure/285926394\\_fig3\\_Figure-6-Comparison-of-segmentation-results-Spectral-clustering-uses-the-mPb-affinity](https://www.researchgate.net/figure/285926394_fig3_Figure-6-Comparison-of-segmentation-results-Spectral-clustering-uses-the-mPb-affinity)

## Regression

- ▶ Uncover functional relationships
- ▶ Curve fitting



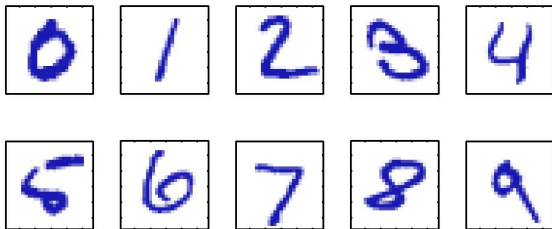
# Regression

Applications in robotics:

- ▶ Learning a model of the dynamics of a robot
- ▶ Modeling of sensors and actuators: detect failures and wear-off

# Classification

Searching for known classes, how can we label our data best:



# Classification

## Applications in robotics:

- ▶ recognize objects that need to be manipulated correctly
- ▶ know the type of terrain from sensor data
- ▶ allow a robot to understand speech
- ▶ recognize the owner/user and his intentions
- ▶ anomaly and novelty detection

## Further applications (not exhaustive):

- ▶ spam detection
- ▶ handwriting recognition
- ▶ speech recognition
- ▶ fraud detection (e.g., credit card fraud)



## (Artificial) neural networks

- ▶ ... are loosely based on the animal brain
- ▶ ... can be used for regression, *feature learning*, classification
- ▶ State of the art in image classification, speech recognition, ...

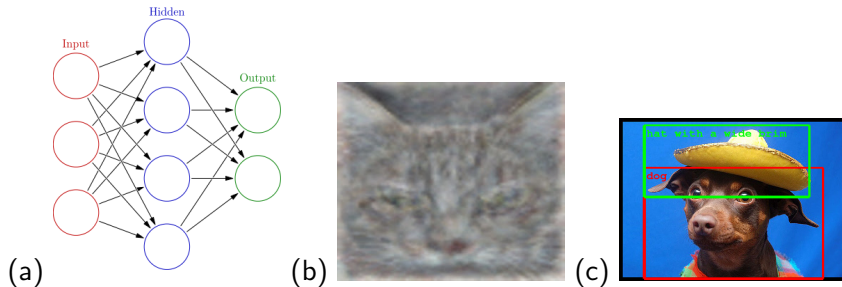


Figure: (a) Neural net (Wikipedia, CC BY SA 3.0 ) (b) Cat neuron (c) Object classification

Thank You! Any Questions?