

Pattern Analysis and Machine Intelligence

M. Matteucci, Luigi Malagò, Davide Eynard

matteucci@elet.polimi.it
Dipartimento di Elettronica e Informazione, Politecnico di Milano
Artificial Intelligence and Robotics Lab

Pattern Analysis and Machine Intelligence



A novel course ... more or less

- Originally named as Methodologies for Intelligent Systems
- New name, new program, new teachers (more or less ... 2nd edition)

Lectures given by:

- Matteo Matteucci (Lecturer) http://www.elet.polimi.it/people/matteucc +39 02 2399 3470 matteucci@elet.polimi.it
- Luigi Malagò (Teaching Assistant) http://www.elet.polimi.it/people/malago malago@elet.polimi.it
- Davide Eynard (Teaching Assistant) http://www.elet.polimi.it/people/eynard davide.eynard@polimi.it



Course website: https://chrome.ws.dei.polimi.it (or from my dei web page)

Material & Schedule

Course Material on Machine Learning (tentative)

 The Elements of Statistical Learning, T. Hastie, R. Tibshirani, J.Friedman, Springer, 2008

- Great book!
- Available at the Polimi library
- Available online as pdf on the book website!
- Additional material on the course website so keep checking the course website
- Only few slides available, you need to take notes!!!

Robert Tibshirani Jerome Friedman The Elements of **Statistical Learning** Data Mining, Inference, and Prediction

Course schedule

- Monday from 13:15 to 15:15 room 3.8 (teaching assistants)
- Tuesday from 13:15 to 15:15 room 4.1 (teacher)

More Important Stuff ...

The goal(s) of the course

- Introduce most used techniques from <u>Machine Learning</u> and Pattern Recognition
- Provide a <u>sound (statistical) background</u> to understand them
- Introduce <u>Data Mining</u> basics

Evaluation and Grading!!

- Oral (or written?) final examination with theory questions and simple exercises [70% of grading].
- Homework(s) to integrate theory [30% of grading].
 - One single homework due in 15 days
 - Three homeworks due in 5 days (10% each)

Detailed schedule and topics ...

- Published on the website as soon as we decide for the class days
- Selected chapters from the book and additional material

A Proposal for the Dartmouth Summer Research Project on Artificial Intelligence

J. McCarthy, Dartmouth College M.L. Minsky, Harvard University N. Rochester, I.B.M. Corporation C.E. Shannon, Bell Telephone Laboratories **August 31, 1955**

We propose that a 2 month, 10 man study of artificial intelligence be carried out during the summer of 1956 at Dartmouth College in Hanover, New Hampshire. The study is to proceed on the basis of the conjecture that every aspect of learning or any other feature of intelligence can in principle be so precisely described that a machine can be made to simulate it. An attempt will be made to find how to make machines use language, form abstractions and concepts, solve kinds of problems now reserved for humans, and improve themselves. We think that a significant advance can be made in one or more of these problems if a carefully selected group of scientists work on it together for a summer.

http://www-formal.stanford.edu/jmc/history/dartmouth/dartmouth.html

Email SPAM

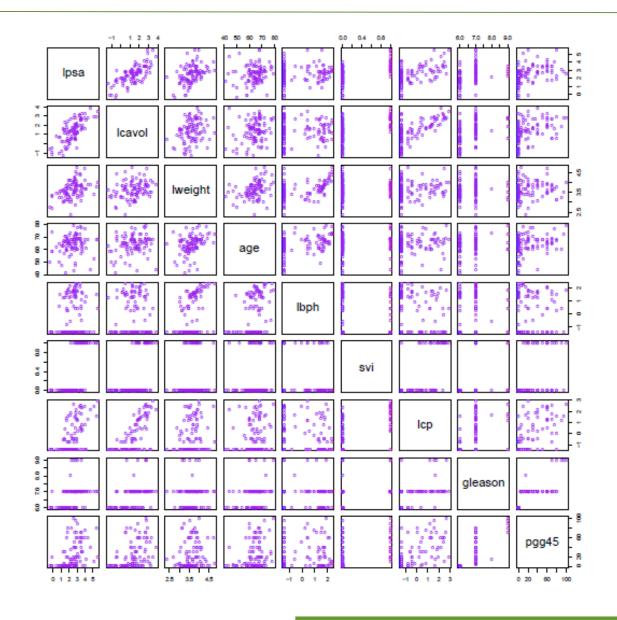
TABLE 1.1. Average percentage of words or characters in an email message equal to the indicated word or character. We have chosen the words and characters showing the largest difference between spam and email.

	george	•	•	_		-					
spam	0.00	2.26	1.38	0.02	0.52	0.01	0.51	0.51	0.13	0.01	0.28
email	1.27	1.27	0.44	0.90	0.07	0.43	0.11	0.18	0.42	0.29	0.01

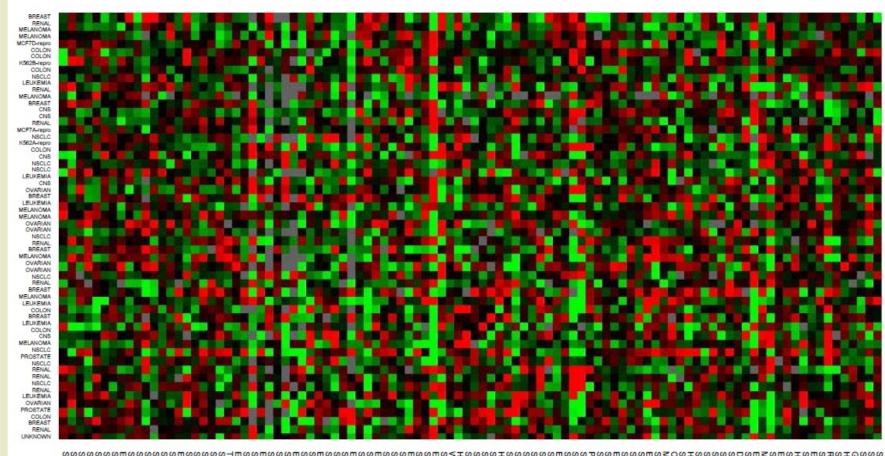
Handwritten Digit Recognition



Prostate Cancer



DNA Expression Microarrays



H. SappensmRI SID325384 RASGTPASE SID325384 RASGTPASE SIDWA7742 SIDWA77429 SIDWA77429 SIDWA77459 SIDWA77451 SIDWA77451 SIDWA77451 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA77459 SIDWA775566 SIDWA775566 SIDWA775566 SIDWA775566 SIDWA775667 SIDWA776766 SIDWA77676 SIDWA776 SIDW

Learning Paradigms

Imagine an organism/machine that experiences a series of sensory input:

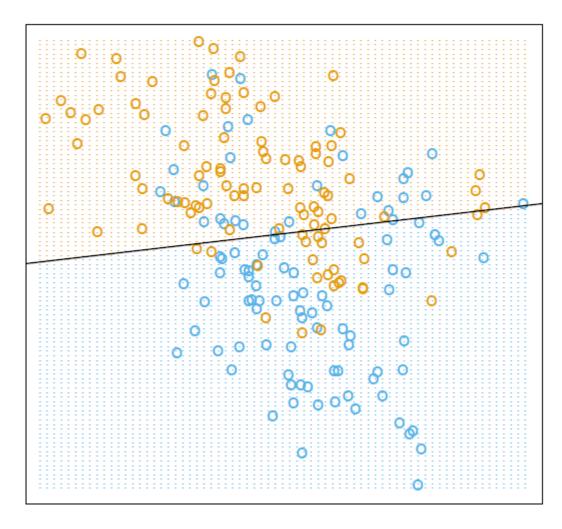
$$E = X_1, X_2, X_3, X_4, \dots$$

- <u>Supervised learning</u>: given the desired outputs y₁, y₂, . . . , learn toproduce the correct output given new input
- Unsupervised learning: exploit regularities in E to build a representation that can be used for reasoning or prediction
- Reinforcement learning: producing actions a₁, a₂, . . . which affect the environment, and receiving rewards r₁, r₂, . . . learn to act in a way that maximizes rewards in the long term

Course focus on Supervised Learning, but you'll some Unsupervised Learning as well

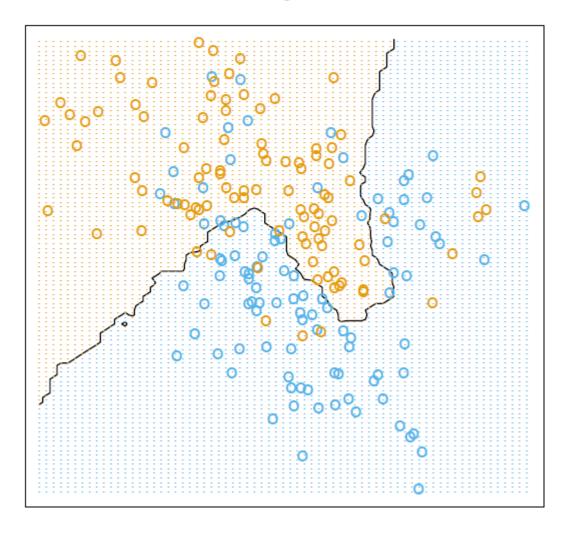
Linear Regression

Linear Regression of 0/1 Response



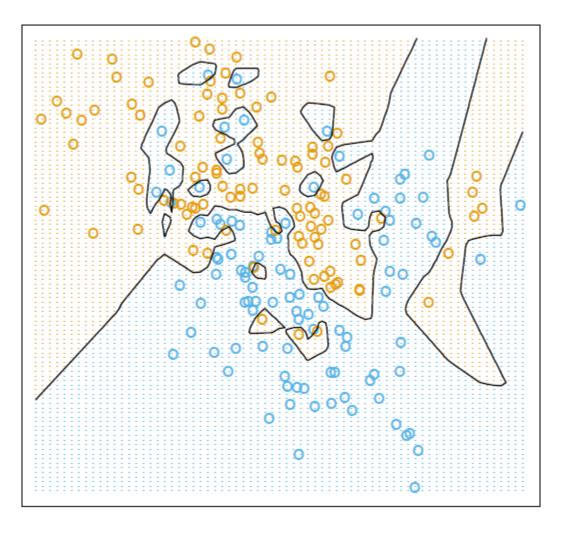
K - Nearest Neighbor Method (K = 15)

15-Nearest Neighbor Classifier

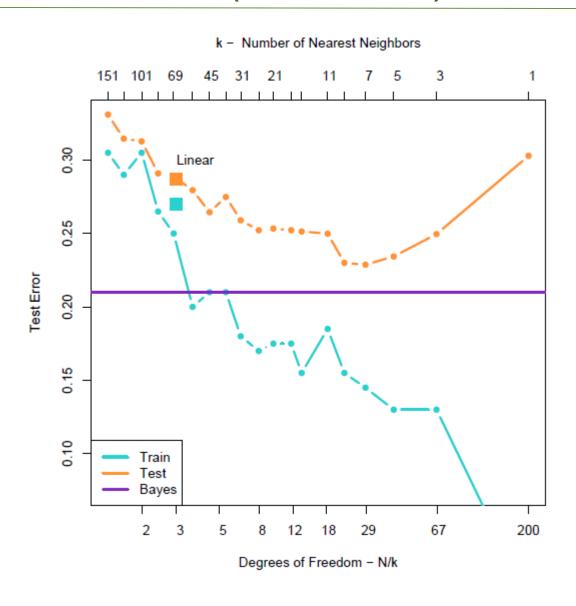


K - Nearest Neighbor Method (K = 1)

1-Nearest Neighbor Classifier



Misclassification Curve (Test Set Error)



Optimal Bayes Classifier

Bayes Optimal Classifier

