

Machine Learning

Machine Learning: algorithms that use "experience" to improve their performance

We use machine learning situations where it is very challenging (or impossible) to define the rules by hand: e.g.

- face detection
- speech recognition
- stock prediction
- driving a car
- medical diagnosis

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Machine Learning

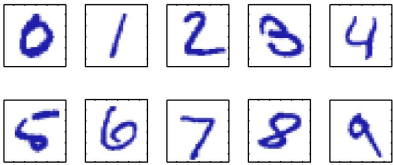
Machine Learning: write programs with thousands/millions of undefined constants.

Learn through experience how to set those constants.

Machine learning algorithms are getting better and better and better.....

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Example 1: hand-written digit recognition



Images are 28 x 28 pixels

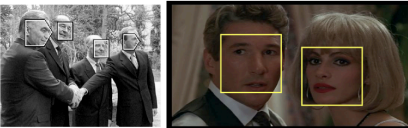
Represent input image as a vector  $x \in \mathbb{R}^{784}$

Learn a classifier  $f(x)$  such that,

$$f : x \rightarrow \{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\}$$

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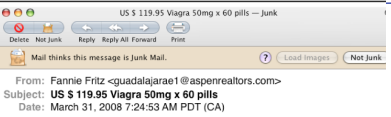
Example 2: Face detection



- Again, a supervised classification problem
- Need to classify an image window into three classes:
  - non-face
  - frontal-face
  - profile-face

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Example 3: Spam detection



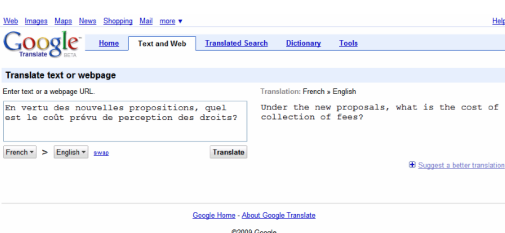
From: Fannie Fritz <guadalajara1@aspenrealtors.com>  
 Subject: **US \$ 119.95 Viagra 50mg x 60 pills**  
 Date: March 31, 2008 7:24:53 AM PDT (CA)

buy now Viagra (Sildenafil) 50mg x 30 pills  
<http://fullgray.com>

- This is a classification problem
- Task is to classify email into spam/non-spam
- Data  $x_i$  is word count, e.g. of viagra, outperform, "you may be surprised to be contacted" ...
- Requires a learning system as "enemy" keeps innovating

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Example 4: Machine translation



Translate text or webpage

Enter text or a webpage URL.

Translation: French -> English

En vertu des nouvelles propositions, quel est le coût prévu de perception des droits? Under the new proposals, what is the cost of collection of fees?

French -> English -> [more](#) [Translate](#) [Suggest a better translation](#)

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**What is the anticipated cost of collecting fees under the new proposal?**

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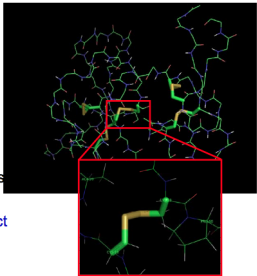
Example 5: Computational biology

x

AVITGACERDLQCG  
KGTCCA~~V~~SLWIKSV  
RVCTFPVGTSGEDCH  
PASHKIPFSGQRMH  
HTCPCAPNLACVQT  
SPKKFKCLSK

➔

y



Protein Structure and Disulfide Bridges

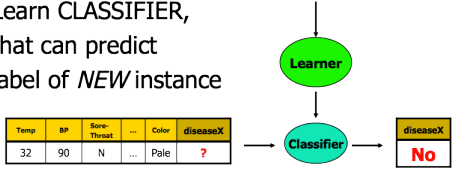
Regression task: given sequence predict 3D structure

Protein: 1IMT

- Given "labeled data"

Temp.	BP.	Sore Throat	...	Colour	diseaseX
35	95	Y	...	Pale	No
22	110	N	...	Clear	Yes
...	...	...	...	...	...
10	87	N	...	Pale	No

- Learn CLASSIFIER, that can predict label of *NEW* instance



Temp.	BP.	Sore Throat	...	Color	diseaseX
32	90	N	...	Pale	?

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Use random variables to represent everything about the world

Space of possible random variables and classifiers indexed by parameters which are knobs we turn to create different classifiers.

**Learning: the problem of estimating joint probability density functions, tuning the knobs, given samples from the function.**

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This is huge!

growing flood of online data

recent progress in algorithms and theoretical foundations

computational power

never-ending industrial applications.

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