

Introduction to Machine Learning

Lecture 3: Regression

Alexis Zubiolo

`alexis.zubiolo@gmail.com`

Data Science Team Lead @ Adcash

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Before we start

Would you be interested in a more advanced course? I can propose

- ▶ Machine learning from scratch (how to implement an ML algorithm with no library)
- ▶ A more advanced version of this course (with more theoretical technical details)
- ▶ Large-scale machine learning

Regression in Machine Learning

This lecture is about regression in Machine learning.

Reminder: In regression, the output y is **continuous**.

Example:

- ▶ **Price estimation:** $y = \text{price}$ (e.g. 50000 BGN for a house)
- ▶ **Predicting the future** (e.g. weather forecast): $y =$ temperature or amount of rain

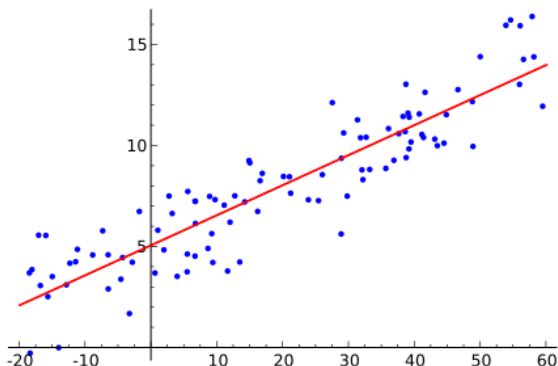
Regression in Machine Learning: Applications

Domains of application:

- ▶ Price estimation/prediction
- ▶ Weather forecast
- ▶ Production quantity estimation
- ▶ Stock option price prediction
- ▶ Fit statistical model to data
- ▶ Physics & chemistry
- ▶ ... and others

Linear and polynomial regression

Purpose of regression: **approximate solutions** of **overdetermined systems**.



In this course, we will see

- ▶ Linear regression
- ▶ Polynomial regression

Linear regression

Linear regression

Principal components:

- ▶ Old problem (least-squares method usually credited to Carl Friedrich Gauss in 1795)
- ▶ Several ways to approximate the data
 - ▶ Linear model
 - ▶ Polynomial model (remember kernels from SVMs)
 - ▶ Fit a distribution
 - ▶ ...
- ▶ Several ways to formulate the problem
 - ▶ Least Squares
 - ▶ Support Vector regression
 - ▶ ...
- ▶ Several ways to solve the problem

Linear regression with ordinary least-squares

Linear regression: Estimate y as a **linear** function of x :

$$\hat{y} = w^T x$$

living area (m ²)	# bedrooms	price (1000's euros)
50	1	30
76	2	48
26	1	12
102	3	90

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50	1	30
76	2	48
26	1	12
102	3	90
61	2	?

Variable standardisation

Variables have various magnitudes. Example:

- ▶ Living area: Up to a few hundreds m^2
- ▶ Price: Up to a few 100 000s BGN (and even more)

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$$z = \frac{x - \mu}{\sigma}$$

where

- ▶ μ is the mean of the variable
- ▶ σ is its standard deviation

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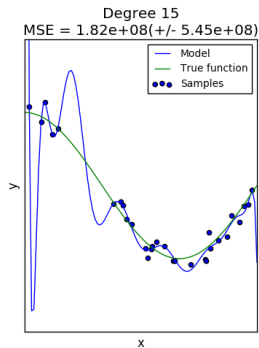
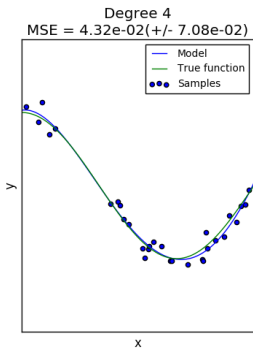
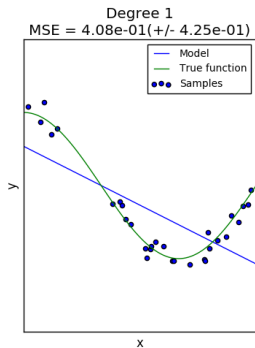
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Another option: Scale between 0 and 1

$$z = \frac{x - \min}{\max - \min}$$

Overfitting and underfitting

$$y = \cos\left(\frac{3\pi}{2}x\right) + \text{noise}$$



Parameter selection

Parameter selection plays a key role in the regression performance.

Fitting a distribution

Thank you! Questions?