

Introduction to Machine Learning

Introduction: Supervised Learning & Learning Tasks



Learning goals

- Understand the idea of supervised learning
- Know examples of supervised learning
- Understand the difference between the regression and classification task

IDEA OF SUPERVISED LEARNING

- **Goal:** Identify the fundamental functional relation in the data that maps an object's features to the target.
- Ideally, we would have full knowledge about the data-generating process and thus be able to specify this mapping function precisely.
- However, in practical applications we don't know this mapping and we must try to **learn** the mapping function: for objects with certain patterns or properties, some values of the target are much more likely than others.
→ We call such an assumed mapping a **model** f .

IDEA OF SUPERVISED LEARNING

- **Supervised** learning means we make use of *labeled* data, i.e., observations for which we already know the target.
- We try to construct f automatically from a set of labeled data.
→ The algorithm for finding f is called **learner**.
- Using the learned model, we can make **predictions** of the target, based on the features of our data.
- Knowing the “truth” allows us to test how well we have grasped the nature of the underlying mapping: we just need to compare our predictions to the actually observed values.

SUPERVISED LEARNING EXAMPLE (1)

House Prices

Aim: Predict the price for a house in a certain area

| Features x | | | | Target y |
|-----------------------------|--------------------|------------------------|-----|---------------------|
| square footage of the house | number of bedrooms | swimming pool (yes/no) | ... | house price in US\$ |
| 1,180 | 3 | 0 | ... | 221,900 |
| 2,570 | 3 | 1 | ... | 538,000 |
| 770 | 2 | 0 | ... | 180,000 |
| 1,960 | 4 | 1 | ... | 604,000 |



SUPERVISED LEARNING EXAMPLE (2)

Length-of-stay in a hospital

Aim: Predict the number of days a single patient has to stay in hospital at the time of admission

| Features x | | | | | Target y |
|--------------------|----------------|--------|-----|-----|--|
| diagnosis category | admission type | gender | age | ... | Length-of-stay in the hospital in days |
| heart disease | elective | male | 75 | ... | 4.6 |
| injury | emergency | male | 22 | ... | 2.6 |
| psychosis | newborn | female | 0 | ... | 8 |
| pneumonia | urgent | female | 67 | ... | 5.5 |



SUPERVISED LEARNING EXAMPLE (3)

Risk category in life insurance

Aim: Predict one of five risk categories (**classification**) for a life insurance customer to determine the insurance premium

| Features x | | | | Target y |
|---------------------|-----|--------|-----|------------|
| job type | age | smoker | ... | risk group |
| carpenter | 34 | 1 | ... | 3 |
| stuntman | 25 | 0 | ... | 5 |
| student | 23 | 0 | ... | 1 |
| white-collar worker | 39 | 0 | ... | 2 |



SUPERVISED LEARNING EXAMPLE (4)

Imagine you want to investigate how salary and workplace conditions (*features*) affect productivity of employees (*target*) – a standard **regression** task. Therefore, you collect data about their worked minutes per week (productivity), how many people work in the same office as the employees in question, and the employees' salary.

| Features x | | Target y |
|---------------------------------------|-----------------------------|--|
| People in Office (Feature 1) x_1 | Salary (Feature 2) x_2 | Worked Minutes Week (Target Variable) |
| 4 | 4300 € | 2220 |
| 12 | 2700 € | 1800 |
| 5 | 3100 € | 1920 |

$p = 2$

$x_1^{(2)}$

$n = 3$

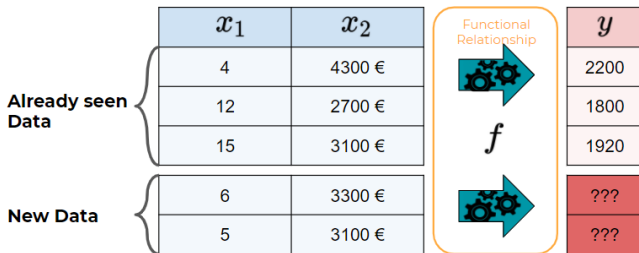
$x_2^{(1)}$

$y^{(3)}$

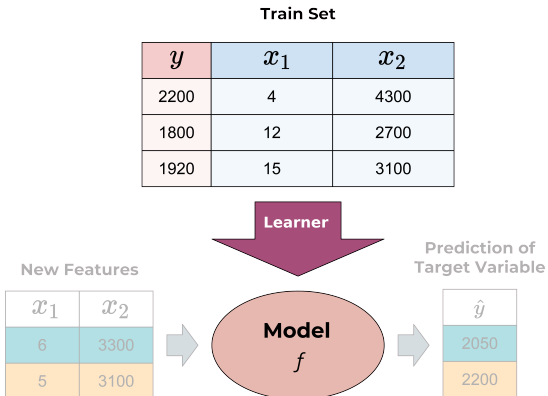
The diagram illustrates a supervised learning example. A table shows features (People in Office, Salary) and target (Worked Minutes Week) for three employees. Annotations include $p = 2$ for the number of features, $n = 3$ for the number of samples, and specific feature and target values for individual samples: $x_1^{(2)}$ (12), $x_2^{(1)}$ (4300 €), and $y^{(3)}$ (1920).

SUPERVISED LEARNING EXAMPLE (4)

- For our observed data we know which outcome is produced.
- For new employees we can only observe the features but not the target.
- We use the labeled data to learn the model f .
- Ultimately, we use our model to compute predictions for **new** data whose target values are unknown.

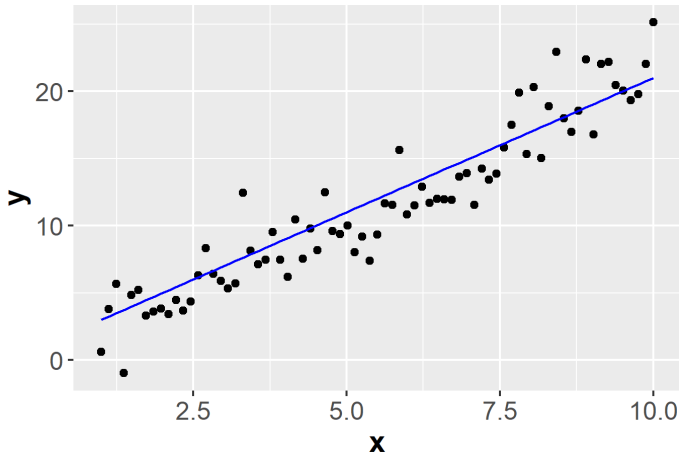


SUPERVISED LEARNING EXAMPLE (4)



TASKS IN SUPERVISED LEARNING

- In general, supervised learning comes in two flavors we call **tasks**:
 - **Regression**: Given features \mathbf{x} , predict corresponding output from $\mathcal{Y} \in \mathbb{R}^m$.



TASKS IN SUPERVISED LEARNING

- **Classification:** Assign an observation with features \mathbf{x} to one class of a finite set of classes $\mathcal{Y} = \{C_1, \dots, C_g\}$, $g \geq 2$ (details later).

