# Types Of Learning

Kelvin · Liang ziyoustep@gmail.com June, 11, 2018

### 1 Introduction

In this note, we are going to categorize types of learning by output space, data label, protocol and input space.

## 2 Learning with different output space Y

## 2.1 Binary Classification

Answering yes/no questions.  $y = \{+1, -1\}$ Example: Credit card approval

### 2.2 Multiclass Classification

The classes of the output is more than two.  $y = \{1, 2, \dots, K\}$ Example: Written digits pictures  $\Rightarrow 1, 2, \dots, 9$ 

#### 2.3 Regression

The output space is  $\mathbb{R}$ .  $y \in \mathbb{R}$ Example: Company data  $\Rightarrow$  Stock price

#### 2.4 Structured Learning

The output is some kind of structure without explicit class definition. In sentence recognition, the output structure may be like  $y = \{PVN, PVP, NVN, \dots\}$ , where P is pronoun, V is verb and N is noun.

## 3 Learning with different data label $y_i$

#### 3.1 Supervised Learning

Label all  $y_i$  for  $i \in \{1, \dots, n\}$ Example: Classify US dollars.

#### 3.2 Unsupervised Learning

Label no  $y_i$ 

Example: Clustering points on a plane

### 3.3 Semi-supervised Learning

Label some  $y_i$ 

This learning method is usually used when labeling is an expensive operation.

#### 3.4 Reinforcement Learning

In reinforcement learning, we do not label  $y_i$  explicitly, but implicit it by the feedback  $\hat{y}_i$ . Example: A dog learn to sit down.

## 4 Learning with different protocol $f \to (x_i, y_i)$

### 4.1 Batch Learning

Input all known data at one time.

Example: It's a common protocol. No need to give an example.

### 4.2 Online Learning

Sequentially learning from incoming data.(passive)

Example: Gmail classy incoming email as important, spam, promotion etc.

#### 4.3 Active Learning

The machine strategically query  $y_i$  of chosen  $x_i$ .

## 5 Learning with different input space X

#### 5.1 Concrete Features

Give clear physical meaning. The features are determined by human. So, it often include human intelligence on the learning task.

#### 5.2 Raw Features

Give simple physical meaning. Often need feature extraction/conversion.

#### 5.3 Abstract Features

Give no physical meaning. Need feature extraction/conversion as well.

#### 6 References

Almost all of the materials of this note are from Professor Hsuan-Tien Lin , NTU. If you wan to know more information about Machine Learning Foundation, please refer to Professor Lin's homesite.