

### 10. Tasks in Machine Learning

#### Contents:

- ☐ 10.1. Classification
- □ 10.2. Regression
- □ 10.3. Clustering
- □ 10.4. Ranking
- ☐ 10.5. Dimensionality Reduction

# Ranking



School of Electronic and Computer Engineering Peking University

Wang Wenmin

### What is Ranking 什么是排名

□ A longer description 较长描述

A ranking is a relationship between a set of items such that, for any two items, the first is either 'ranked higher than', 'ranked lower than' or 'ranked equal to' the second. 排名是一组项之间的关系,即对于任意两个项,满足第一个"排名高于"、"排名低于"或"排名等于"第二个。

□ A shorter description 较短描述

The data transformation in which numerical or ordinal values are replaced by their rank.

排名是一种数据转换,其中数值或者顺序值由其排名来代替。

□ A very short description 极简描述

To order items according to some criterion.

依据某种准则整理数据项。

Artificial Intelligence :: Learning :: Tasks 70



#### Contents:

- □ 10.4.1. How Ranking Works
- □ 10.4.2. Major Approaches of Ranking
- □ 10.4.3. Applications and Algorithms

### A Formal Description of Ranking 一种排名的形式化描述

Let  $\mathcal{X}$  denote input space, D an unknown distribution over  $\mathcal{X} \times \mathcal{X}$ .

设 $\mathcal{X}$ 表示输入空间, D是 $\mathcal{X} \times \mathcal{X}$ 上的未知分布。

□ Target ranking function: 目标排名函数:

$$f: \mathcal{X} \times \mathcal{X} \rightarrow \mathcal{Y} = \{-1, 0, +1\}$$

where

其中

f(x, x') = +1, if x is ranked higher than x',

若x排名高于x',

f(x, x') = -1, if x is ranked lower than x',

若x排名低于x',

f(x, x') = 0, if both x and x' has same ranking.

若x与x'二者排名相同。

□ Training data: 训练数据

$$S = \{(x^{(i)}, x'^{(i)}, y^{(j)}) \mid y^{(j)} = f(x^{(i)}, x'^{(i)}) \in \mathcal{Y}, i \in [1, m], j \in [1, 3]\}$$

### A Formal Description of Ranking 一种排名的形式化描述

Ranking problem: 排名问题 Given a hypothesis set H of functions mapping  $\mathcal{X} \times \mathcal{X}$  to  $\mathcal{Y} = \{-1, 0, +1\}$ , to select a hypothesis  $h \in H$  with the target function f:

给定一个将 $\mathcal{X} \times \mathcal{X}$  映射到 $\mathcal{Y} = \{-1, 0, +1\}$ 的假设函数集H,选择一个具有目标函数f的假设 $h \in H$ :

■ small expected generalization error: 最小预期泛化错误:

$$R(h) = \Pr_{(x, x')}[f(x, x') \neq 0 \land (f(x, x')(h(x') - h(x)) \leq 0)]$$

■ empirical pairwise misranking error: 经验性成对误排名错误:

$$\widehat{R}(h) = \frac{1}{m} \sum_{i=1}^{m} 1 \left( (y^{(i)} \neq 0) \land (y^{(i)} (h(x'^{(i)}) - h(x^{(i)})) \leq 0) \right)$$





#### Contents:

- □ 10.4.1. How Ranking Works
- □ 10.4.2. Major Approaches of Ranking
- □ 10.4.3. Applications and Algorithms

### Typical Approaches of Ranking 典型的排名方法

- □ 1) Score-based approach 基于分值方法
  - The predictor is a real-valued function, called *scoring function*. 该预测器是一个实数函数, 称为分值函数。
  - The scores assigned to input points by this function determine their ranking. 由该函数分派给输入数据点的分值决定其排名。
  - This approach is the most widely explored one. 这种方法是研究得最多的一种。
- □ 2) Preference-based approach 基于偏好方法
  - The predictor is a *preference function*. 该预测器是一个偏好函数。

Artificial Intelligence :: Learning :: Tasks





#### Contents:

- □ 10.4.1. How Ranking Works
- □ 10.4.2. Major Approaches of Ranking
- □ 10.4.3. Applications and Algorithms

### Typical Applications of Ranking 排名的典型应用

☐ In information retrieval

Search engine

Document retrieval

Collaborative filtering

Sentiment analysis

Computational advertising

☐ In other areas

Machine translation

Recommender systems

Computational biology

Proteomics

信息检索领域

搜索引擎

文档检索

协同式过滤

情感分析

计算广告学

其它领域

机器翻译

推荐系统

计算生物学

蛋白质组学

### Case Study: PageRank

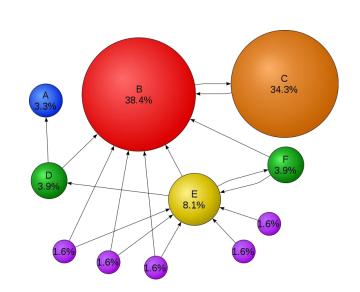
□ An algorithm used by Google to rank websites in their search engine, named after Larry Page, one of Google founders.

谷歌用于在其搜索引擎中对网站进行排名的一种算法,以谷歌创始人之一拉里·佩奇的名字命名。

- □ PageRank works by counting the number and quality of links to a page to determine how important the website is.

  PageRank通过计算网页的链接数量和质量来决定该网站的重要性。
- ☐ The underlying assumption is that more important websites are likely to receive more links from other websites.

其基本假设是:越重要的网站,就会被越多其它网站所链接。



Artificial Intelligence :: Learning :: Tasks

## Thank you for your affeation!

