## **AGENDA**

- 1. Preference Learning Tasks (Eyke)
- 2. Loss Functions (Johannes)
- 3. Preference Learning Techniques (Eyke)
- 4. Complexity of Preference Learning (Johannes)
- 5. Conclusions

## **Conclusions**

- Preference learning is an emerging subfield of machine learning, with many applications and theoretical challenges.
- Prediction of preference models instead of scalar outputs (like in classification and regression), hitherto with a focus on rankings.
- Many existing machine learning problems can be cast in the framework of preference learning (→ preference learning "in a broad sense")
- "Qualitative" alternative to conventional numerical approaches
  - pairwise comparison instead of numerical evaluation,
  - order relations instead of individual assessment.
- Still many open problems (unified framework, predictions more general than rankings, incorporating numerical information, etc.)
- Interdisciplinary field, connections to many other areas.

## **Connections to Other Fields**

Structured Learning Ordinal Output Monotone Classification Prediction Models Ranking in Multilabel Information Classification **Preference** Retrieval Learning Recommende<u>r</u> **Economics & Decison Theory** Systems Multiple Criteria Operations Social Research **Decision Making** Choice

# **Forthcoming Book on Preference Learning**

Preference Learning: An Introduction

A Preference Optimization based Unifying Framework for Supervised Learning Problems

### Part I - Label Ranking

Label Ranking Algorithms: A Survey

Preference Learning and Ranking by Pairwise Comparison

**Decision Tree Modeling for Ranking Data** 

Co-regularized Least-Squares for Label Ranking

#### Part II - Instance Ranking

A Survey on ROC-Based Ordinal Regression

Ranking Cases with Classification Rules

## Part III – Object Ranking

A Survey and Empirical Comparison of Object Ranking Methods

**Dimension Reduction for Object Ranking** 

Learning of Rule Ensembles for Multiple Attribute Ranking Problems

#### Part IV – Preferences in Multiattribute Domains

Learning Lexicographic Preference Models

Learning Ordinal Preferences on Multiattribute Domains: the Case of CP-nets

Choice-Based Conjoint Analysis: Classification vs. Discrete Choice Models

Learning Aggregation Operators for Preference Modeling

#### Part V - Preferences in Information Retrieval

Evaluating Search Engine Relevance with Click-Based Metrics

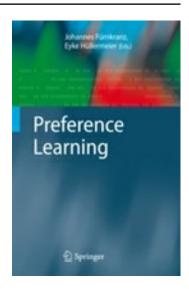
Learning SVM Ranking Function from User Feedback Using Document Metadata and Active Learning in the Biomedical Domain

#### Part VI – Preferences in Recommender Systems

Learning Preference Models in Recommender Systems

Collaborative Preference Learning

Discerning Relevant Model Features in a Content-Based Collaborative Recommender System



J. Fürnkranz & E. Hüllermeier (eds.) Preference Learning Springer-Verlag 2010

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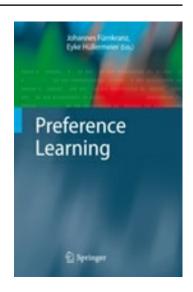
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#### **Learning Preference Models in Recommender Systems**

Collaborative Preference Learning

Discerning Relevant Model Features in a Content-Based Collaborative Recommender System

includes several introductions and survey articles



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# **Schedule for Today**

## 12.15-13.45: Preference Learning Algorithms

- J. Zabkar, M. Mozina, T. Janez, I. Bratko, J. Demsar. Preference Learning from Qualitative Partial Derivatives
- J. Giesen, S. Laue, K. Nimczick. Measuring a Lexicographic Bias in Linear Conjoint Analysis Models
- A. Airola, T. Pahikkala, T. Salakoski. Large scale training methods for linear RankRLS
- D. Devlaminck, W. Waegeman, B. Bauwens, B. Wyns, P. Santens, and G. Otte, From circular ordinal regression to multilabel classification

## 15.00-16.30: Preference Learning in Recommender Systems

- M. Ceci, A. Appice, D. Malerba. Semantic-Based Destination Suggestion in Intelligent Tourism Information Systems
- A. Brun, A. Hamad, O. Buffet, A. Boyer. Towards Preference Relations in Recommender Systems
- K. Christidis, D. Apostolou and G. Mentzas. Exploring Customer Preferences with Probabilistic Topics Models
- L. Pizzato, T. Chung, T. Rej, I. Koprinska, K. Yacef, J. Kay. Learning User Preferences in Online Dating

## 17.00-18.10: Rule-Based Preference Learning

- B. Pieters, A. Knobbe, S. Dzeroski. Subgroup Discovery in Ranked Data, with an Application to Gene Set Enrichment
- C. Sa, C. Soares, A. M. Jorge, P. Azevedo, J. Costa Mining Association Rules for Label Ranking
- M. Ceci, A. Appice, C. Loglisci, D. Malerba. Preference Learning for Document Image Analysis

#### 18.10-18.30: Final Discussion

## 19.30: Follow-up meeting (?)