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Michalis Vazirgiannis, Maria Halkidi and Dimitrios Gunopulos

Uncertainty Handling and Quality Assessment in Data Mining

With 35 Figures



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CONTENTS

INTRODUCTION	
DATA MINING PROCESS	11
2.1 Introduction to the Main Concepts of Data Mining	11
2.2 Knowledge and Data Mining	12
2.2.1 Knowledge Discovery in Database vs Data Mining.	12
2.3 The Data Mining Process	16
2.3.1 Data Mining Requirements	
2.4 Classification of Data Mining Methods	18
2.5 Overview of Data Mining Tasks	19
2.5.1 Clustering	20
2.5.1.1 Overview of Clustering Algorithms	25
2.5.1.2 Comparison of Clustering Algorithms	31
2.5.2 Classification	43
2.5.2.1 Bayesian Classification	44
2.5.2.2 Decision Trees	46
2.5.2.3 Neural Networks	49
2.5.2.4 Nearest Neighbor Classification	50
2.5.2.5 Support Vector Machines (SVMs)	50
2.5.2.6 Fuzzy Classification approaches	51
2.5.3 Induction of classification rules	53
2.5.4 Association Rules	55
2.5.5 Sequential Patterns	56
2.5.6 Time Series Similarity	58

2	.5.7 .5.8 .5.9	Visualization and Dimensionality Reduction	61
2.6	Summ	nary	61
Ref	erences	· · · · · · · · · · · · · · · · · · ·	63
QU	ALITY	ASSESSMENT IN DATA MINING	73
3.1	Introd	uction	73
3.2	Data I	Pre-processing and Quality Assessment	75
3.3	Evalua	ation of Classification Methods	76
3	.3.1	Classification Model Accuracy	76
	3.3.1.1	, see the second of the second	
3	.3.2	Evaluating the Accuracy of Classification Algorithms	
	3.3.2.1		
	3.3.2.2		80
	3.3.2.3		81
	3.3.2.4		82
3	.3.3	Interestingness Measures of Classification Rules	
	3.3.3.1		82
	3.3.3.2		
	3.3.3.3		
	3.3.3.4		84
3.4	Assoc	iation Rules	
3	.4.1	Association Rules Interestingness Measures	
	3.4.1.1	8	
	3.4.1.2	11	
	3.4.1.3		
	3.4.1.4	$\boldsymbol{\mathcal{E}}$	
	3.4.1.5		
	3.4.1.6		
	3.4.1.7	\mathcal{E}	
	3.4.1.8	C C	
	3.4.1.9		
	3.4.1.1	0 Closed Association Rules Mining	92
3.5	Cluste	r Validity	93
3	.5.1	Fundamental Concepts of Cluster Validity	95

Contents VII

3.5.2 External and Internal Validity Indices	96
3.5.2.1 Hypothesis Testing in Cluster Validity	
3.5.2.2 External Criteria	
3.5.2.3 Internal Criteria.	101
3.5.3 Relative Criteria	102
3.5.3.1 Crisp Clustering.	
3.5.3.2 Fuzzy Clustering	
3.5.4 Other Approaches for Cluster Validity	
3.5.5 An Experimental Study on cluster validity	
3.5.5.1 A Comparative Study	
, , , , , , , , , , , , , , , , , , ,	
3.6 Summary	121
•	
References	123
UNCERTAINTY HANDLING IN DATA MINING	120
UNCERTAINTT HANDEING IN DATA MINING	··· 1 2 /
4.1 Introduction	129
THE OCCUPATION	12)
4.2 Basic Concepts on Fuzzy Logic	131
4.2.1 Fuzzy Set Theory	
4.2.2 Membership Functions	
4.2.2.1 Hypertrapezoidal Fuzzy Membership Functions	
4.2.2.2 Joint Degree of Membership	
4.2.3 Fuzzy Sets and Information Measures	
1.2.3 1 d22y 50t5 and information recusares	157
4.3 Basic Concepts on Probabilistic Theory	138
4.3.1 Uncertainty Quantified Probabilistically	
4.3.1.1 Bayesian Theorem	
4.4 Probabilistic and Fuzzy Approaches	140
4.5 The EM Algorithm	
4.5.1 General Description of EM Algorithm	141
4.6 Fuzzy Cluster Analysis	
4.6.1 Fuzzy C-Means and its Variants	
4.6.2 Fuzzy C-Means for Object-Data	
4.6.3 Fuzzy C-Means (FCM) Alternatives	
4.6.4 Applying Fuzzy C-Means Methodology to Relational Data.	
4.6.5 The Fuzzy C-Means Algorithm for Relational data	
4.6.5.1 Comments on FCM for Relational Data	
4.6.6 Noise Fuzzy Clustering Algorithm	151

4.	6.7 Conditional Fuzzy C-Means Clustering	52
4.	Fuzzy Classification Approaches127.1 Fuzzy Decision Trees124.7.1.1 Building a Fuzzy Decision Tree124.7.1.2 Inference for Decision Assignment127.2 Fuzzy Rules12	54 54 55
4. 4. 4.	Managing Uncertainty and Quality in the Classification Process	61 63 65 66 67 68
4.9 4.4 4.4	8.5 Classification Scheme Quality Assessment 17 Fuzzy Association Rules 17 9.1 Defining Fuzzy Sets 17 9.2 Fuzzy Association Rule Definition 17 4.9.2.1 Fuzzy Support 17 4.9.2.2 Fuzzy Confidence 17 4.9.2.3 Fuzzy Correlation 17 9.3 Mining Fuzzy Association Rules Algorithms 17	71 72 73 74 74 74 75
	Summary	
	INER: A DATA MINING SYSTEM HANDLING UNCERTAINTY D QUALITY18	
5.1	Introduction	33
5.2	UMiner Development Approach	34
5.3	System Architecture	36
5.4	UMiner's Data Mining Tasks18	37
5.5	Demonstration 19)1

IX

5.5.1	Clustering process	191
5.6 Sumn	nary	195
References	S	197
CASE ST	UDIES	199
6.1 Extra	cting Association Rules for Medical Data Analysis	199
6.2 The M	lining Process	200
	Collection of Data	
	Data Cleaning and Pre-processing	
6.2.3	Further Analysis of Extracted Association Rules	
6.3 Cluste	er Analysis of Epidemiological Data	215
References	S	221
INDEX		223