

VISUALIZING STUDENT PERFORMANCES  
USING DATA MINING TECHNIQUES

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VISUALIZING STUDENT PERFORMANCES  
USING DATA MINING TECHNIQUES

A thesis submitted to the Graduate School in partial  
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## **ABSTRAK**

Objektif kertas kerja ini adalah untuk menjalankan satu kajian untuk memaparkan prestasi pelajar di mana data yang digunakan adalah keputusan pelajar dan hasil maklumat yang diterima dipamerkan dalam bentuk grafik. Kajian ini memfokuskan kepada mengenalpasti faktor-faktor yang mempengaruhi prestasi pelajar dan juga menunjukkan keputusan tersebut dalam bentuk grafik untuk memudahkan pihak pengurusan. Pendekatan yang digunakan untuk mengkategorikan pembolehubah-pembolehubah yang berkaitan adalah analisis faktor. SPSS telah digunakan untuk membuat analisis ini. Keputusan analisis ini menunjukkan bahawa sikap pelajar dan latar belakang pensyarah adalah dua faktor utama yang mempengaruhi prestasi pelajar.

## **ABSTRACT**

The goal of this qualitative paper is to conduct a study to visualize the student performances where the input data is the student's result and the output of the information retrieved is displayed in a graphical representation. The study focuses on identifying the factors that influence the student performances as well as visualizing the result for management's convenience. The approach that has been used to categorize the influencing variables is factor analysis. The analysis and visualization has been done using SPSS. Result of the analysis shows that student attitude and lecturer's background are the two factors most important factor known to influence students' performances.

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## **LIST OF ABBREVIATIONS**

AAS	Academic Advisory System
ASP	Active Server Pages
BMU	Bunda Mulia University
CADP	Center of Affiliate and Diploma Programme
DBIS	Diploma in Bussiness Information System
DIT	Diploma in Information Technology
DIC	Diploma in Internet Computing
GTTC	Ghana Telecom Traning Centre
HTML	Hypertext Markup Language
INTI	International University College
IT	Information Technology
KDD	Knowledge Discovery in Database
KDS	Kolej Disted Stamford
KMO	Kaiser-Meyer-Olkin
KPTMKL	International College Penang and Kolej Poly-Tech MARA Kuala Lumpur
MANOVA	Multivariate Analysis of Variance
MMU	Multimedia University
NEMISA	National Electronic Media Institute South Africa
PHP	Hypertext Preprocessor
SPSS	SPSS for Windows
TTC	Telekom Training College
WEKA	Waikito Environment for Knowledge Analaysis

XMDV X11 Multi – Dimensional Visualization Tool

X

# CHAPTER 1

## INTRODUCTION

### 1.1 Preface

Data mining is the process of discovering hidden information from large databases. The data are analyzed to identify relationships and behaviors between the attributes. “Knowledge Discovery in Database (KDD) is the overall process of discovering knowledge from data.” (Fayyad *et al.*, 1996) Some of the steps involved in Knowledge Discovery in Database (KDD) are data cleaning, data preparation, data selection, data mining. Thus, data mining is one of the steps in Knowledge Discovery in Database (KDD) process where new patterns and trends are discovered from large amount of data stored in the databases by applying data analysis and discovery algorithms.

Several techniques are used to mine the data. Artificial neural networks, decision trees, genetic algorithms, statistical analysis, visualization, nearest neighbor method and rule induction are the most commonly used techniques. These methods are used by many organizations to reveal hidden information by exploring large amount of data. The result of mining the data is used to solve problems and to form

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