

Identifying Purchasing Patterns of Arab and Malaysian Students Using Data Mining Technique

A thesis submitted to the Faculty of Information Technology in partial
fulfillment of the requirement for the degree
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By

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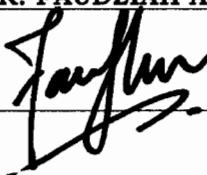
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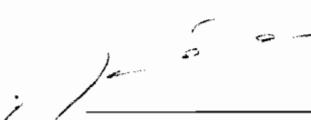
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ABSTRACT

Currently, Universiti Utara Malaysia (UUM) has a significant number of international students. Since they are from various background and cultures, their preferences towards purchasing products are different. This study intends to identify purchasing patterns of 2 groups of students: Arab and Malaysian. The 2 groups have been chosen because they represent the major groups of the postgraduate students. A questionnaire has been constructed and used to collect data. The sample of data consists of postgraduate students from Arab and Malaysia. The total number of postgraduate students is 2122 and the total number of the sample data is 547 (30% of the population). Apriori Algorithm, which is a popular data mining technique, has been used to identify the purchasing patterns. The study discovered that items such as Fruits, Vegetables, Drinks, and Pickled Food are frequently purchased by the Arabs. The Malaysians, however, prefer items such as Pickled Foods, Snack Foods, and Other Stuff. A more comprehensive work in the future is suggested so that results obtained can be generalized. The study has been successful in achieving all objectives. It is hoped that the results could be useful to UUM as the patterns identified could be used to strategize UUM's retailing businesses and at the same time provide adequate facilities in terms of selling preferred products to its consumers.

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CHAPTER 1

INTRODUCTION

1.1 Background

In Universiti Utara Malaysia (UUM), the number of postgraduate has increased significantly since 2001. Currently, most of the postgraduate's students are international students with the majority of them coming from the Arab countries. The second highest number of students is from Malaysia. Thus, it can be seen that the postgraduate students come from many different background and cultures and due to this fact, the needs and preferences of these students vary. In terms of purchasing, their patterns also differ. The Arabs prefer bread and take less rice, while other group of students may prefer rice more than bread. Some studies on purchasing patterns have been done in the past. However, not many studies have been done on purchasing patterns using data mining techniques.

What is data mining? Data Mining, as written in literatures are defined in many ways. Data mining as described by (Seifert, 2004) is the use of sophisticated data analysis tools to discover previously unknown, valid patterns and relationships in large data sets. These tools can include statistical models, mathematical algorithms, and machine learning methods (algorithms that improve their performance automatically through experience, such as neural networks or decision trees). With the advance in technology, data mining tools have incorporated new features. Thus, data mining tasks is not just collecting and managing data, it also includes analysis and prediction.

Data mining techniques have been widely applied to solve problems in the industry. Lau and Gao (2005) proposed a data mining approach for performance management in the banking industry. Meanwhile, in science Shi and Jaja (2002) considered the problem of organizing large scale earth science raster data to efficiently handle queries for identifying regions whose parameters fall within certain range values specified by the queries. Banks *et al.* (2004) have developed an undergraduate data

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