

**DETECTING FRAUD PATTERNS IN TELECOMMUNICATIONS  
USING CASE BASED REASONING**

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## **ABSTRACT**

All round the world, fraud situations are significantly causing huge revenue leakage in the telecommunication companies every year. The reuse of previous cases is an important issue in dealing with fraud pattern in a data with string features. Case Based Reasoning (CBR) systems have a set of cases inform of library used to facilitate the process of validation of new cases without the direct involvement of a domain expert. The proposed detection technique in this paper is based on Case Based Reasoning used to detect the occurrence of fraud with a meaningful confidence in telecommunication data. Experimental result on the fraud data indicates that the weight for all attribute used in this study needs to be set as 0.1 in order to get 98% similarity performance.

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# **CHAPTER 1**

## **INTRODUCTION**

This chapter gives a general overview of the project. It starts with a background review of the project which explains the motivation behind the project and the domain on which the project is based on. The chapter further describes the problem statement, the objective to be accomplished; significant to be derived from the project, the scope or coverage area and finally highlighted the way subsequent chapters will be organized.

### **1.1 Background**

Telecommunications has brought tremendous achievement in life by providing a means to extend communication over a distance. This is done through telephony, computer networking, television, radio, and so on to transmit information in form of voice or data.. Telecommunications facilitates Internet service provision, networking of computers and telephones and cellular service for cars, fax or modem, or offers voice mail that meet specific business needs. Many telecommunications companies manufacture equipments ranging from simple pagers to mobile office packages for Internet service and high-speed connections. Therefore, telecommunications has brought revolution of new products and technologies to the market.

Examples of such products are:

The contents of  
the thesis is for  
internal user  
only

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