

KNOWLEDGE-BASED AMBIGUITY DETECTION APPROACH TO  
ELIMINATE VAGUENESS IN USER REQUIREMENTS

JACLINE SUDAH ANAK SINPANG

UNIVERSITI TEKNOLOGI MALAYSIA

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JACLINE SUDAH ANAK SINPANG

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## **ABSTRACT**

Requirements are the foundation of a software system. It is expected to be clear, precise, and non-ambiguous. Ambiguous requirements are the results of requirements that are gathered in natural language. Natural language is normally used while gathering requirements in verbal or non-verbal because it is easier for software engineers and stakeholders to understand each other. Vague requirements often stem from vague words in the requirements. A requirement that consists of a vague word depends on the individual interpretation and this will cause the requirements to be ambiguous. Vagueness is part of the ambiguity. This could lead to a wrong interpretation of what the system should be and should do. As requirements engineering is a crucial phase in software development, it is important to tackle the issue of vagueness to avoid the requirements to be ambiguous. This research proposes an approach known as Knowledge-based Requirements Analysis for Ambiguity Detection (KbReAD) that provides automatic detection of vague words in requirements using the rule-based reasoning technique which is a specific type of knowledge base. The knowledge base allows analysis of a large amount of data to be done in a small amount of time. It also does not depend on previous experience like how machine learning works. The knowledge base is also high in reliability. The initial expert knowledge for vagueness is captured using the rule-based technique into the KbReAD prototype tool that allows new knowledge to be added dynamically. From this knowledge, vagueness can be divided into six categories; vague subjects, vague adjectives, vague prepositions, vague verbs, vague phrases, and vague adverbs. Sets of raw requirements that are yet to be documented in Software Requirement Specification (SRS) are analyzed to evaluate the rule-based reasoning. The result from the analysis shows the proposed work is capable of predicting the actual number of vague requirements. The evaluation shows that the proposed approach is able to predict and detect vague words in the requirements accurately.

## ABSTRAK

Keperluan ialah asas sistem perisian. Secara ideal, keperluan seharusnya jelas, tepat, dan tidak samar. Keperluan samar ialah hasil daripada keperluan yang dikumpulkan dalam penggunaan bahasa seharian. Bahasa seharian digunakan semasa pengumpulan keperluan sama ada secara lisan atau bukan lisan kerana ia lebih mudah untuk difahami. Keperluan yang samar sering terjadi daripada perkataan yang tidak jelas. Keperluan terdiri daripada perkataan yang tidak jelas bergantung kepada penafsiran individu dan ini akan menyebabkan berlakunya kekaburan. Ketidakpastian adalah sebahagian daripada kekaburan. Kesan daripada ini menyebabkan penafsiran yang salah mengenai apa yang seharusnya dilakukan oleh sistem. Oleh kerana kejuruteraan keperluan adalah fasa penting dalam perisian, masalah kekaburan perlu ditangani bagi mengelakkan keperluan menjadi samar. Penyelidikan ini mencadangkan pendekatan Analisis Keperluan Berasaskan Pengetahuan untuk Pengesanan Kekaburan (KbReAD). Pendekatan ini memberikan pengesanan automatik bagi kumpulan perkataan yang kabur dalam keperluan menggunakan teknik penaakulan berdasarkan peraturan yang merupakan sejenis teknik khusus bagi pangkalan pengetahuan. Pangkalan pengetahuan membolehkan banyak data dapat dianalisis dalam masa yang singkat. Ia tidak bergantung pada kaedah sebelumnya seperti pembelajaran mesin berfungsi. Pengetahuan awal ditambah menggunakan teknik berasaskan peraturan ke dalam alat prototaip KbReAD yang membolehkan pengetahuan baru ditambah secara dinamik. Dari pengetahuan ini, kekaburan dapat dibahagi kepada enam kategori; subjek yang samar, kata sifat yang tidak jelas, kata depan yang tidak jelas, kata kerja yang tidak jelas, frasa yang tidak jelas, dan kata keterangan yang tidak jelas. Set keperluan asal yang belum didokumentasikan dalam Spesifikasi Keperluan Perisian (SRS) dianalisis untuk menilai penaakulan berdasarkan peraturan. Hasil daripada analisis menunjukkan karya yang dicadang mampu meramalkan jumlah keperluan samar. Penilaian menunjukkan pendekatan yang dicadang dapat meramalkan dan mengesan perkataan yang kabur dalam keperluan dengan tepat.

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## **LIST OF ABBREVIATIONS**

AI	-	Artificial Intelligence
CI	-	Computational Intelligence
KbReAD	-	Knowledge-based Requirements Analysis for Ambiguity Detection
KBS	-	Knowledge-based System
NL	-	Natural Language
RALIC	-	Replacement Access, Library and ID Card
RE	-	Requirements Engineering
SDLC	-	Software Development Life Cycle
SRS	-	Software Requirements specification

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# CHAPTER 1

## INTRODUCTION

### 1.1 Overview

The usage of computers has grown exponentially over the past two decades, from simple to complex software. Thus, software engineers have been chosen to resolve progressively bigger and larger issues as well as savvy and productive ways. The developments and past encounters towards creating a good quality of software are partly responsible for the rise of the software engineering discipline (Mall, 2014). According to Sommerville (2011), software engineering is an engineering discipline that is interested in all the aspect of software production.

It is imperative to go through a series of formulaic steps to attain a high-quality result in delivering software for clients (Pressman, 2005); In software engineering, it is called the software process. Software process involves four basic activities that include (Sommerville, 2011) Specification, Development, Validation, and Evolution.

"Requirements engineering is concerned with discovering, eliciting, developing, analyzing, determining verification methods, validating, communicating, documenting, and managing requirements" (ISO/IEC/IEEE 29148:2011, 2011). Requirements engineering can be divided into six phases which include the feasibility study, acquisition of requirements, analyzing the requirements, categorizing the requirements, managing the requirements, and finally documenting the requirements (Sankhwar et al., 2014). According to the international standard of IEEE ISO/IEC/IEEE (2011), a requirement is a form of a report that transcribes a necessity and its related limitations and conditions.

A study by Johnson (2000) through CHAOS report demonstrates that half of the influences associated with project and product success are related to requirements. This means that when conducting requirements engineering activities, it is expected to produce error-free requirements. However, Pandey et al. (2010) reveal that it is difficult to maintain an accurate set of requirements in a large or complex system. In addition, Malik et al. (2013) state that requirements keep on changing throughout the development. Parra et al. (2015) indicate that the quality of the requirements could cause an error while developing the project.

Meziane and Vadera (2010) state that a number of researchers adopt Artificial Intelligence (AI) techniques in order to improve the software development activities and that there is huge potential in utilizing AI for supporting and upgrading software engineering. A few existing works have applied AI techniques at certain phases in requirements such as software reliability prediction using artificial techniques by Al Gargoor and Saleem (2013), Usability study for creativity assistance on the interface of an AI system by Botega et al. (2018) and application of machine learning techniques for statistical analysis of software reliability data sets by Shanti et al. (2018). Hence, they have successfully proved its significance in enhancing the software development activities.

AI as defined in the IEEE std 1232-1995 are (i) The investigation of planning computer system showing the attributes related with insight in human conduct including understanding language, learning, thinking from fragmented or dubious data, and taking care of issues, (ii) The order for creating computer system able to do breezing through the Turing Test in which the conduct of the computer system is no different from human conduct and (iii) The investigation of critical thinking utilizing computational models. By referring to the first definition of AI, this study aims to provide an approach that can perform an intelligent activity to solve the problem in requirements analysis as AI has shown a great potential to improve software engineering process.

## **1.2 Problem Background**

Requirements engineering is an essential action, which can influence the whole action of software development project (Pandey et al., 2010). Requirements lay out the foundation to refine and elaborate the technical work plan (Schmidt, 2016). The development of any software task must be founded on high-quality requirements designing procedure (Parra et al., 2015). Thus, requirements need to be free from error and ambiguity.

Problems in requirements analysis are complicated as it needs to cope with the stakeholders needs and, at the same time, it needs to cope with the designers need (Macaulay, 2012). If new insights are added to the project, there is a high probability that the requirements need to be revised or changed accordingly (Vara et al., 2013).



There are several issues associated with requirements engineering phase throughout the process of software development. The issues can be summarized as shown below (Meziane and Vadera, 2010):

- (a) Requirements are ambiguous: This happens due to the variety of the stakeholders' background and Natural Language (NL) which the first means to record the requirements. Characteristically questionable and adds to the deficiency of requirements the same number of suspicions made on a few issues
- (b) Requirements are incomplete, unclear and unspecific: Some requirements are unclear and hard to validate
- (c) Requirements are contradicting: Struggle in requirements engineering happen when two unique requirements vie for the same resources or when the fulfillment of one requirement blocks that of another
- (d) Requirements are unstable: User needs develop after some time. It is not unordinary that amid the time it takes to build up a system, user requirements have effectively changed
- (e) There are correspondence issues between stakeholders: Correspondence with and seeing every one of the stakeholders is a very troublesome and challenging task
- (f) Requirements are hard to oversee: Traceability is the procedure of taking after requirements from its elicitation to usage and verification and validation. Connecting the diverse periods of requirements acceptance is regularly overlooked. Other administration issues identified with programming administration are task administration, programming expense, advancement time, assets administration and dealing with the evolving environment

There are six types of ambiguity as stated by Massey et al. (2014) and this study will only focus on vagueness as this type of ambiguity is often overlooked. On numerous occasions, researcher focuses on the most common ambiguity types. Umer and Bajwa (2011) focused on semantic and syntactic ambiguity, Dalpiaz et al. (2019) aimed at semantic ambiguity while Bussel (2009), study on lexical, semantic and syntactic ambiguity. One vague word in a requirement could cause the requirement to be ambiguous. Vagueness is a statement that admits borderline cases or relative interpretation (Massey et al., 2014). Firesmith (2003) indicates five types of vagueness that occur in requirements. First, vague subjects where the subject in the requirements can refer to multiple things. Second, vague adjectives. The adjectives may mean different things to the different readers. Third, vague preposition where user may have use vague nouns. Fourth, vague verbs which are more qualitative than quantitative. Lastly, subjective phrases where the meaning of the phrases depend on the understanding an individual. This study will look into depth on the issue of ambiguous requirements and implement AI technique to tackle this particular issue to reduce the vagueness in requirements.

### **1.3 Problem Statement and Research Questions**

Gervasi and Zowghi (2010) mentioned that ambiguity has always been a challenge in requirements specification because misunderstanding or misinterpretation of the requirements will be carried to next stages of development. Ambiguity in requirements analysis can lead to several problems that influence the final product of the system (Nigam et al., 2012). Imprecise requirements or ambiguous requirements occur when software engineers collect the requirements from stakeholders and they unconsciously disambiguate the requirements according to their own understanding without really knowing that the requirements are actually ambiguous (Wang et al., 2013). Based on the study conducted by Rani and Aggarwal (2020), ambiguities are one of the major problems in SRS.

Vagueness in requirements could create a confusing meaning to the receiving end. How the requirements engineer or software engineers interpret the requirements could be different from what the requirements intended to deliver if the requirements contain a vague word. When there is a vague word in a requirement, the interpretation of the requirement would solely depend on how the requirements engineer or the software engineer understand the requirements. Thus, it is better if requirements can be free from any vague words so that the requirements will be interpreted as how it is intended to.

To steer clear from vagueness and ambiguity, Gupta and Deraman (2019) propose a framework to assist and support requirement engineer. The framework helps requirements engineer to choose the right elicitation technique in order to write requirements that are not vague and unambiguous. Sadiq (2017) proposed a fuzzy based approach to deal with vagueness and impreciseness in goal-oriented requirements elicitation process. The fuzzy based approach aids in prioritizing software requirements from the stakeholders.

A deeper analysis is conducted to better understand vagueness in requirements analysis. Problems that are caused by ambiguity in requirements are also investigated and a thorough study on knowledge-based system is done to decide on the technique to be used in this study.

Thus, the main research question for this study is “Can AI technique detect ambiguity in requirements?” and the sub-questions for this study are:

- (a) What are the issues related to vagueness in user requirements and the existing work that has been done to solve the issues?
- (b) What are the attributes of high-quality requirements?
- (c) What is the suitable KBS to improve the requirements analysis phase, and how can AI techniques KBS enhance the requirements analysis phase?

## **1.4 Goals and Objectives**

The main goal of this study is to develop an approach that can be used to tackle the issue of ambiguity in requirements especially vagueness in requirements which causing the requirement to be ambiguous.

The objectives of this study are:

- (a) To develop algorithm to detect ambiguities and vagueness using the proposed approach
- (b) To demonstrate the applicability of the proposed approach through the development of its supporting prototype tool
- (c) To measure the effectiveness of the proposed approach in requirements analysis

## **1.5 Scope**

This study focuses on the conventional way of requirements engineering model that uses incremental Software Development Life Cycle (SDLC). Requirement engineering that implemented the iterative SDLC such as agile requirement engineering is only studied to look into the issue of requirements engineering as a whole.

The scopes of this study are:

- (a) Requirements engineering phase specifically the analysis phase
- (b) KBS techniques or approaches that show potential in improving requirements analysis
- (c) Raw requirements that have not been documented into Software Requirements Specification (SRS)
- (d) Functional requirements are the focus to verify the technique
- (e) Ambiguity which is limited to vagueness

## **1.6 Significance of Study**

Berry and Kamties (2004) mention in their study that unidentified ambiguity is believed to be one of the most major factors for failure in requirements analysis. Firesmiths (2003) state that numerous requirements are not testable. Ambiguous requirements are one of the requirements that cannot be tested. An ambiguous requirement could cause misunderstanding during implementation phase (Genova et al., 2013). Apart from that, ambiguous requirements can create a totally opposite meaning for the same request to the very same or dissimilar stakeholders (Rani and Aggarwal, 2020). Therefore, it is important to eliminate the issue of ambiguity in requirements to ensure that the system built is according to the requirements given by users.

As there are several types of ambiguity, and this study will be focusing on vagueness. A vague word in a requirement could cause the requirement to be a vague requirement. Thus, studying in depth on the issue of vagueness and providing a technique to avoid such requirements to happen is important to ensure the success of the system or the project.

Meziane and Vadera (2010) state that there is enormous potential in using AI for supporting and overhauling software engineering. Hence, it is essential to do this study to produce a systematic literature review and to identify the AI technique that can help to improve requirement engineering phase and to measure the effectiveness of proposed AI technique in requirements engineering.

## **1.7 Thesis Organization**

Chapter 1 provides an overview of the study. The background of the problem that is studied is provided in this chapter. From the background of the problem, a problem statement is issued to find the research gap. Once the research gap is identified, research questions are formulated to help to narrow down the study. The goals and objectives of the study are established from the research questions. The scope of the study is identified so that it will not deviate from the goals and objectives of the study.

Chapter 2 of this study explains more on requirements engineering and problems in requirements engineering. Techniques and approaches of AI in requirements engineering are analyzed in this chapter. The knowledge-based approach is introduced in this chapter. This chapter also presents the systematic literature review on requirements engineering.

Chapter 3 elaborates on the research methodology applied for the study. A theoretical framework of the study is presented in this chapter. Data that was used to verify and evaluate the proposed approach is defined in this chapter.

Chapter 4 aims to explain the proposed approach. The design of the approach is elaborated in this chapter. A detailed explanation of the proposed approach is presented here. The evaluation of this study will be discussed in chapter 5. The result will be presented according to the objectives of this study. Chapter 6 will conclude the whole study. A summary of the whole study will be explained in this chapter.

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