# AN ANALYSIS OF GOF SOFTWARE DESIGN PATTERNS ON SOFTWARE MAINTAINABILITY IN MICRO SERVICES

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Degree of Master of Science

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Thesis submitted in partial fulfillment of the requirements for the degree

Master of Science in Computer Science

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#### DECLARATION OF THE CANDIDATE AND SUPERVISOR

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#### **Abstract**

The purpose of this paper is to identify how gang of four design patterns impact the maintainability of micro services-based systems. Design patterns were introduced as solutions to common problems that occur in programming. These are supposed to improve the maintainability of a system by improving the code quality. But with modern programming languages, frameworks, and integrated development environments, whether these patterns serve their purpose is a question that is not fully addressed. This paper proposes a tool that can be used to identify whether use of a specific design pattern by a specific developer for a particular micro service-based project can improve its maintainability or not. To do this a model has been created by analyzing enterprise micro service-based applications and gathering data from developers who were involved in the development of those projects. This data is used to create models for maintainability metrices coupling, lack of cohesion, duplication and cyclomatic complexity. This tool will help to decide whether the system is more maintainable with or without the use of selected design patterns. This helps better decision making in deciding how to write new code or refactoring existing code. Results of this research have shown that lack of cohesion is not affected by developer experience, design patterns or the language used in enterprise micro service-based applications. Cyclomatic complexity was only affected by the language used. Also, use of certain design patterns decreased the coupling in the system. But some of the design patterns caused duplications to be increased. So, the results showed that use of design patterns can have a negative and positive impact on the maintainability of a microservice depending on the design pattern used. This research also emphasizes the importance of code review process and code quality analysis automation.

Keywords: GOF design patterns, micro services, software maintainability

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#### LIST OF ABBREVIATIONS

Abbreviation Description

AHEF Attributed hiding effectiveness factor

AIF Attribute inheritance factor

ALT Alternative version without patterns
API Application programming interface

Avg Average

CAM Cohesion among methods
CBO Coupling between objects
CC Cyclomatic complexity

CF Coupling factor

COM Percentage of comments per module

GOF Gang of four

HTML Hypertext markup language
HTTP Hypertext transfer protocol

HV Halstead volume

IDE Integrated development environment

IIF Internal inheritance factor LCOM Lack of cohesion methods

LOC Average number of lines per module

LOC Lines of code

MI Maintainability index
MIF Method inheritance factor

MOOD Matrices for object-oriented design
OHEF Operation hiding effectiveness factor

PAT Pattern version

PF Polymorphism factor

PPF Parametric polymorphism factor

P-value Probability value RFC Response for a class

UI User interface

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