UNIVERSITI TEKNOLOGI MARA

PRICE PREDICTION MODEL OF GREEN BUILDING BASED ON MACHINE LEARNING ALGORITHMS

NUR SYAFIQAH BINTI JAMIL

MSc

January 2021

AUTHOR'S DECLARATION

I declare that the work in this thesis was carried out in accordance with the regulations of Universiti Teknologi MARA. It is original and is the results of my own work, unless otherwise indicated or acknowledged as referenced work. This thesis has not been submitted to any other academic institution or non-academic institution for any degree or qualification.

I, hereby, acknowledge that I have been supplied with the Academic Rules and Regulations for Post Graduate, Universiti Teknologi MARA, regulating the conduct of my study and research.

Name of Student	:	Nur Syafiqah binti Jamil
Student I.D. No.	:	2019552069
Programme	:	Master of Science (Built Environment) – AP781
Faculty	:	Architecture, Planning & Surveying
Thesis Tittle	:	Price Prediction Model of Green Building Based on
		Machine Learning Algorithms
Signature of Student	:	19
Date	:	January 2021

ABSTRACT

A green building, in its design, is the act of building structures and utilizing procedures that are wholly virtuous and productive throughout the building's life cycle, from its arrangement to outlining, building, operation, maintenance, remodelling and dismantling. In fact, the green building is known as a potential approach to improving the buildings performance where there are five different green building tools namely as, Energy Efficiency, Indoor Environment Quality, Sustainable Site Planning & Management, Material & Resources, Water Efficiency. However, although there are several world-class green buildings built in the recent years, the idea of green building development in Malaysia is only in its infancy. Moreover, the spill over influence of green building price prediction has yet to be discovered due to the limited research in this aspect. In the era of Industrial Revolution 4.0, Machine Learning Models become increasingly popular and influential as they are often used to solve different prediction problems in various industries, including the real estate industry. To obtain the best combination of these approaches for a good green building pricing model, it is important to identify what require extensive empirical experiments to work with identifying the best parameter configurations, techniques, and algorithms. This research seeks to provide experimental research by analyzing the relationships between transaction prices and the features affecting the green building price. In addition to measure the most significant features that can influence the price of green building first before applying more advanced models, an empirical experiment is performed by testing the Multiple Linear Regression Model. In addition, this research also develops price prediction model using Machine Learning Model based on green building datasets covering the District of Kuala Lumpur, Malaysia. The experiment involved five (5) common algorithms: Linear Regressor, Decision Tree Regressor, Random Forest Regressor, Ridge Regressor and Lasso Regressor. The results revealed that the features of lot area, Mukim – Kuala Lumpur, green certificate – gold, tenure, Mukim – Setapak, building facade, green certificate – silver, age of building and level of property unit contributed statistically to the transaction price. As the most important features towards transaction price, building security made the largest contribution to the Multiple Linear Regression Model. Meanwhile, experiments using five common algorithms, Random Forest Regressor Model outperforms four (4) other algorithms in predicting the price of green building condominium, by training and validating the data-set using Split approach. The selection features involved were based on Experiment 1 which included 17 IVs (all features) without excluding the most significant variable for this research.

Keywords: Green Building Index, Property Features, Machine Learning Model, Algorithms, Condominium property

ACKNOWLEDGEMENT

Firstly, I wish to thank God for giving me the opportunity to embark on my Master and for completing this long and challenging journey successfully.

Secondly, my gratitude and thanks go to my supervisor Associate Professor Sr Dr. Thuraiya Mohd, and co-supervisor Associate Professor Dr Suraya Masrom and Sr Dr Norbaya Ab Rahim. Thank you for the support, patience and ideas in assisting me with this thesis. All of their help, stimulating suggestions and encouragement throughout my research and writing of this thesis.

I also would like to express my gratitude to the staff of Jabatan Penilaian Dan Perkhidmatan Harta (JPPH), especially Mr. Shukur Hadi and Mr Hafiz Alias from Nilai Harta Consultant Sdn Bhd (Private Company) for providing me with the required data and information about condominium property markets for my analysis.

My appreciation goes to the IPSIS Department as Master organisation of Universiti Teknologi MARA, who provided the facilities and equipment to finish this thesis. Special thanks to my colleagues and friends for their help, support, interest and valuable hints in my research. Thousand thank you to my proofread person, Puan Zarlina that checking my thesis committedly.

Finally, this thesis is dedicated to my loving dear mother, siblings and my friends Shahirah Jaafar and Ahmad Shazwan for the vision and determination to educate me. This piece of victory is dedicated to all of you. Alhamdulillah.

TABLE OF CONTENTS

CONFIRMATION BY PANEL OF EXAMINERS AUTHOR'S DECLARATION ABSTRACT ACKNOWLEDGEMENT	ii
AUTHOR'S DECLARATION ABSTRACT ACKNOWLEDGEMENT	
ABSTRACT ACKNOWLEDGEMENT	III
ACKNOWLEDGEMENT	iv
	v
TABLE OF CONTENTS	vi
LIST OF TABLES	xii
LIST OF FIGURES	xiv
LIST OF SYMBOLS	xvii
LIST OF ABBREVIATIONS	xviii
LIST OF NOMENCLATURE	xix

CHA	CHAPTER ONE: INTRODUCTION		
1.1	Introduction	1	
1.2	Background of Research	1	
1.3	Statement of Research Problem	5	
1.4	Research Aims and Objectives	9	
1.5	Research Questions	10	
1.6	Scope and Limitations of Research	10	
	1.6.1 Areas of the Research	10	
	1.6.2 Type of Building – Green Building Rating Type	10	
	1.6.3 Main Sources of Data Collection	11	
1.7	Significance of the Research	11	
	1.7.1 Significance for Practice	11	
	1.7.2 Intellectual Property	12	
	1.7.3 Academic Significance	13	
	1.7.3.1 Theoretical Knowledge	13	
	1.7.3.2 Further Research	13	
1.8	Research Methodology		