



**BUSITEMA
UNIVERSITY**
Pursuing Excellence

FACULTY OF ENGINEERING

DEPARTMENT OF MINING ENGINEERING

FINAL YEAR PROJECT REPORT

**PREDICTION OF POTENTIAL GOLD LOCATION USING MACHINE
LEARNING TECHNIQUES**

CASE STUDY: BUSIA DISTRICT

By

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A final year project report submitted to the Department of Mining Engineering as a partial fulfillment of the requirements for the award of a Bachelor of Science degree in Mining Engineering.

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ABSTRACT

This study explores the use of machine learning techniques in mineral exploration, specifically in predicting potential locations of gold mineralization in Busia District, Uganda. The study uses geological data, including lithology, geophysical data, geochemical data as well and geographical data to develop and test a predictive model. The results show that the developed model can accurately predict areas with potential gold mineralization, with an accuracy of 87.5%. The study's significance lies in its potential to reduce the time and cost of identifying new gold mineralized areas, contributing to sustainable consumption and production patterns, and promoting sustained, inclusive, and sustainable economic growth. The study recommends validating the accuracy of predictive models, exploring the use of non-geological data sources, monitoring and mitigating the environmental impacts of gold mining, and sharing the findings of this study with relevant stakeholders.

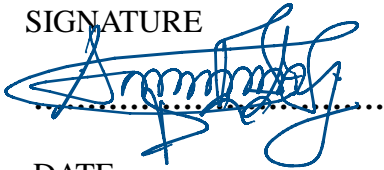
DECLARATION

I, Ainembabazi Trust Racheal, solemnly declare that this work is entirely my own and original. It has not been previously submitted for any academic award at any institution.

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SIGNATURE

A handwritten signature in blue ink is written over a horizontal dotted line. The signature is stylized and appears to read 'Ainembabazi Trust Racheal'.

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.....


APPROVAL

This final year project report has been submitted to the Faculty of Engineering for examination with the consent and approval of my supervisors.

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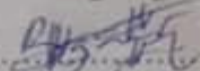
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DEDICATION

I dedicate this report to my beloved parents, Mr. and Mrs. Ruteisire, for their unwavering love, encouragement, and steadfast support throughout my academic journey. Their belief in me has been my greatest motivation, and this achievement is a testament to their dedication as parents. I thank them for being my guiding light, may the Almighty God reward them abundantly.

TABLE OF CONTENT

ABSTRACT.....	i
DECLARATION.....	ii
APPROVAL	Error! Bookmark not defined.
ACKNOWLEDGEMENT	iii
DEDICATION	v
TABLE OF CONTENT.....	vi
LIST OF TABLES	viii
LIST OF FIGURES.....	viii
LIST OF ACRONYMS.....	ix
CHAPTER ONE	1
1.1 Introduction	1
1.2 Background	1
1.3 Problem statement	3
1.4 Justification	4
1.5 Objectives.....	4
1.5.1 Main objective	4
1.5.2 Specific Objectives:	4
1.6 Significance of the study	4
1.7 Scope of the study.....	5
1.7.1 Geographical location and size of the case study	5
1.7.2 Conceptual scope	5
CHAPTER TWO	6
2 LITERATURE REVIEW.....	6
2.1 Gold mineralization controls	6
2.2 Gold exploration techniques.....	7
2.3 Machine learning	8
2.3.1 Types of machine learning	8
2.3.2 Machine learning techniques.....	8
2.4 Data sources.....	10
2.5 Limitations of machine learning techniques.....	11

2.6 Mineral prospectivity mapping	11
2.7 Machine learning for predicting potential gold rush locations case studies	12
2.7.1 GIS-based mineral prospectivity mapping using machine learning methods: A case study from Tongling ore district, eastern China.....	12
2.7.2 Spatial data integration for mineral exploration, resource assessment and environmental studies	13
2.7.3 Introduction to the Special Issue: GIS-based mineral potential modelling and geological data analyses for mineral exploration.....	13
2.7.4 A GIS-based weights-of-evidence model for mineral potential mapping of hydrothermal gold deposits in Torbat-e-Heydarieh area.....	13
2.7.5 Data-Driven Predictive Modelling of Mineral Prospectivity Using Machine Learning and Deep Learning Methods: A Case Study from Southern Jiangxi Province, China	14
2.8 Future directions in machine learning	14
CHAPTER THREE	15
3 METHODOLOGY	15
3.1 Specific objective 1: To determine the gold mineralization controls of Busia district.	15
3.1.1 Data Sources and Collection	15
3.1.2 Data Procurement Strategy.....	15
3.1.3 Types of Data Collected, and methodology	16
3.2 Objective 2: To develop a gold mineralization zone predictive model using a random forest approach	18
3.2.1 Data Consolidation and Integration	18
3.2.2 Data Cleaning	18
3.2.3 Data Exploration.....	18
3.3 Procedure for Developing a Random Forest Model for Predicting Potential Gold Rush Location	29
3.3.1 Loading Necessary Libraries:.....	29
3.3.2 Dataset Loading:.....	30
3.3.3 Class Distribution Analysis:	30
3.3.4 Data Splitting:.....	30
3.3.5 Formula Definition:	31
3.3.6 Target Variable Transformation:.....	31
3.3.7 Random Forest Model Training:	31
3.3.8 Model Predictions:	31
3.3.9 Performance Metrics Calculation:.....	32
3.3 Specific objective three: to develop a map of potential locations for gold mineralization using the developed predictive model.....	33

LIST OF TABLES

Table 1:Descriptive statistics	19
Table 2: Basic Statistics.....	20
Table 3:Dataset description	37
Table 4: confusion matrix results	37
Table 5:Model Evaluation Metrics results.....	38
Table 6:Cross validation results.....	39

LIST OF FIGURES

Figure 1:Percentages of basic statistics.....	21
Figure 2: Data structure	22
Figure 3: Missing data profile.....	23
Figure 4:Dataset histograms	24
Figure 5: Bar chart of gold availability(yes) and gold absence(no)	25
Figure 6: Dataset QQ plots.....	26
Figure 7:Correlation analysis chart	27
Figure 8:locations of magnetic and gold concentration data	34
Figure 9:slope of Busia district.....	35
Figure 10: Geology of Busia district	36
Figure 11: ROC curve.....	38
Figure 12:Feature importance	40

LIST OF ACRONYMS

ASGM - Artisanal and Small-Scale Gold Mining

SVM - Support Vector Machine

RF - Random Forest

ML-Machine Learning

KNN - K-Nearest Neighbors

GIS - Geographic Information System

DEM - Digital Elevation Model

ANN - Artificial Neural Network

CNN - Convolutional Neural Network

F1 - F1 Score

AUC - Area Under the Curve

GPS - Global Positioning System

ROC - Receiver Operating Characteristic

Rho...m -Resistivity

ppm -Parts per million

B..nt -Magnetism

M..Vs.Vo -Chargeability

EDA -Exploratory data analysis

IP -Induced polarization

DT -Decision tree

SOM -Self organized maps

CHAPTER ONE

1.1 Introduction

The discovery of gold deposits in Busia district has been of great interest to both local and international investors. However, the search for gold deposits is an expensive and time-consuming task that requires extensive exploration since most outcropping deposits have been discovered. Therefore, this research aimed to predict potential locations of gold in Busia district using machine learning techniques. By leveraging historical geological data and satellite imagery, a predictive model was developed to identify areas with the highest likelihood of containing gold deposits. The outcome of this research can provide valuable insights to investors and mining companies, enabling them to make informed decisions on where to invest their resources.

1.2 Background

Globally, the search for gold has been an important part of human history for thousands of years (Macdonald, 2007). The discovery of gold has fueled exploration, settlement, and economic growth throughout the world (Macdonald, 2007). However, finding new gold deposits is becoming increasingly difficult since there are limited outcrops for ease of discovery and exploitation (Yousefi & Nykänen, 2017). Gold exploration has a long and rich history dating back to ancient times when gold was first discovered and used for decorative and ceremonial purposes. Egyptian artisans were known to use gold lavishly in decorating tombs and temples over 5,000 years ago (Harold Kirkemo, William L. Newman, 2023). Today, gold exploration remains a significant part of human civilization as gold continues to be a highly valued commodity. However, exploration success has decreased in recent decades, leading to an 80% fall in gold production since the 1970s, and a major decrease in revenue and employment in the industry (Brown & Vearncombe, 2014). Gold mineralization can be found in a variety of geological settings, from oceanic arcs to orogenic belts and back-arc basins (Torvela et al., 2022). Over the years, there have been numerous advances in mineral exploration technology, from theoretical advances in economic geology to breakthroughs in the methods or technologies for discovering and defining ore deposits (Okada, 2021).

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