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Integration of Low-Cost Multispectral Sensors and Machine Learning for Quantitative Prediction of Physicochemical Properties in Diluted Milk
Khalid Saifullah, Dr.Eng. Ahmad Kusumaatmaja, S.Si., M.Sc.
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TABLE OF CONTENTS

COVER PAGE i
APPROVAL PAGE ii
STATEMENT OF ORIGINALITY iii
MOTTO AND DEDICATION iv
FOREWORD v
TABLE OF CONTENTS vii
IMAGE LIST xi
TABLE LIST xii
INTISARI xiii
ABSTRACT xiv
CHAPTER I INTRODUCTION 1
1.1 Background 1
1.2 Problem Formulation 4
1.3 Problem Limitations 5
1.4 Research Objectives 6
1.5 Research Benefits 7
CHAPTER II LITERATURE REVIEW 8
2.1 Optical Sensing for Milk Quality Assessment 8
2.2 Multispectral Sensing for Food Quality Assessment 9
2.3 Spectral Data Transformation 11
2.4 Chemometric Modeling, Feature Selection, and Machine Learning 11
2.5 Water Dilution and Physicochemical Changes in Milk 13
CHAPTER III THEORETICAL BACKGROUND 15
3.1 Optical Properties of Dispersive Medium 15
3.1.1 Interaction of Light with Matter 15
3.1.2 Tyndall Effect 16
3.1.3 Rayleigh Scattering 17
3.1.4 Mie Scattering 18
3.1.5 Diffuse Reflectance 19
3.1.6 Kubelka–Munk Theory 20
3.1.7 Beer–Lambert Law 21

UNIVERSITAS
GADJAH MADA
Integration of Low-Cost Multispectral Sensors and Machine Learning for Quantitative Prediction of Physicochemical Properties in Diluted Milk
Khalid Saifullah, Dr.Eng. Ahmad Kusumaatmaja, S.Si., M.Sc.
Universitas Gadjah Mada, 2026 | Diunduh dari http://etd.repository.ugm.ac.id/

3.2 Milk 22
3.2.1 Physical Properties 22
3.2.2 Chemical Properties 23
3.2.3 Optical Properties of Milk 23
3.3 Data Acquisition System 24
3.4 AS7265x Multispectral Sensor 25
3.4.1 Working Principle 26
3.4.2 Spectral Characteristics 27
3.4.3 Advantages and Limitations 28
3.5 Data Processing and Analysis 29
3.5.1 Spectral Transformation 30
3.5.2 Recursive Feature Elimination (RFE) 31
3.6 Machine Learning 31
3.6.1 Principal Component Analysis 32
3.6.2 Linear Discriminant Analysis 33
3.6.3 Random Forest 34
3.6.4 Extreme Gradient Boosting 35
3.6.5 Extra Trees 36
3.6.6 Hyperparameter Tuning 37
3.6.7 GridSearchCV 37
3.6.8 Classification Performance Metrics 38
3.6.9 Regression Performance Metrics 39
CHAPTER IV RESEARCH METHODS 41
4.1 Research Materials 41
4.2 Research Tools 41
4.3 Research Procedure 42
4.3.1 Sample Preparation 42
4.3.2 Spectral Data Acquisition 42
4.3.3 TDS and EC Data Acquisition 44
4.3.4 Refractive Index Data Acquisition 44
4.3.5 Data Processing and Analysis 45
CHAPTER V RESULTS AND DISCUSSION 47
5.1 Physicochemical Changes Due to Water Dilution 47

UNIVERSITAS
GADJAH MADA
Integration of Low-Cost Multispectral Sensors and Machine Learning for Quantitative Prediction of Physicochemical Properties in Diluted Milk
Khalid Saifullah, Dr.Eng. Ahmad Kusumaatmaja, S.Si., M.Sc.
Universitas Gadjah Mada, 2026 | Diunduh dari http://etd.repository.ugm.ac.id/

5.1.1 TDS Changes with Dilution Level 47
5.1.2 EC Changes with Dilution Level 49
5.1.3 Refractive Index Changes with Dilution Level 50
5.1.4 Comparison of Physicochemical Responses Among Milk Products. 52
5.2 Multispectral Sensor Analysis 52
5.2.1 Multispectral Sensor Stability Test 52
5.2.2 Spectral Response of the Milk Samples at Different Dilution Levels 54
5.2.3 PCA and LDA plots of the Milk Samples at Different Dilution Levels 57
5.3 Correlation Analysis Between Multispectral Features and Physicochemical Properties 63
5.3.1 Dilution level Correlation with Multispectral Features 63
5.3.2 TDS Correlation with Multispectral Features 66
5.3.3 EC Correlation with Multispectral Features 69
5.3.4 Refractive Index Correlation with Multispectral Features 71
5.4 Machine-Learning Prediction of Water Dilution and Physicochemical Properties 74
5.4.1 Prediction of Water Dilution Level 75
5.4.2 Prediction of TDS 77
5.4.3 Prediction of EC 80
5.4.4 Prediction of Refractive Index 82
5.4.5 Comparison of Regression Models and Spectral Transformations ... 85
5.5 Effect of Recursive Feature Elimination on Model Performance 87
5.5.1 Comparison of Models with and without RFE 87
5.5.2 Changes in R^2, RMSE, and MAE After RFE 88
5.6 Spectral Feature Importance and RFE Selection 90
5.6.1 Pre-RFE Feature Importance 90
5.6.2 Relationship Between Feature Importance and RFE Selection 92
5.7 Cross-Product Prediction 93
CHAPTER VI CONCLUSION 97
6.1 Conclusion 97
6.2 Recommendation 98
BIBLIOGRAPHY 100
APPENDIX 109

UNIVERSITAS
GADJAH MADA
Integration of Low-Cost Multispectral Sensors and Machine Learning for Quantitative Prediction of Physicochemical Properties in Diluted Milk
Khalid Saifullah, Dr.Eng. Ahmad Kusumaatmaja, S.Si., M.Sc.
Universitas Gadjah Mada, 2026 | Diunduh dari http://etd.repository.ugm.ac.id/

Appendix 1. Calculation of the volume of milk and distilled water 109
Appendix 2. Prediction Result for Individual and Pooled Dataset 110
Appendix 3. Prediction Result for Individual and Pooled Dataset 111
Appendix 4. Prediction Result for Cross Product Prediction 127