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Recyclable Waste Image Classification in Indonesia using Convolutional Neural Network
M AMRIDHAN MAHDI, Afiahayati, S. kom., M.Cs., Ph.D
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Table of Contents

Table of Contents ..... **v**
List of Figures ..... **vii**
List of Tables ..... **viii**
ABSTRACT **1**
INTRODUCTION **2**
1.1 Research Background 2
1.2 Research Problem 4
1.3 Research Scope 5
1.4 Research Objective 5
1.5 Research Advantages 6
LITERATURE REVIEW **7**
2.1 Research Comparison 10
BASIC THEORY **13**
3.1 Waste 13
3.2 Computer Vision 15
3.3 Artificial Intelligence 16
3.4 Machine Learning 16
3.5 Supervised Learning 17
3.6 Image Classification 17
3.7 Deep Learning 18
3.8 Artificial Neural Network 18
3.9 Convolutional Neural Network 19
3.9.1 Softmax Activation Function *20*
3.9.2 Rectified Linear Unit *20*
3.9.3 Categorical Cross Entropy Loss Function *21*
3.9.4 Adaptive Moment Estimation (Adam Optimizer) *22*
3.9.5 Accuracy Metrics *23*
3.10 Image Pre-processing 24
RESEARCH METHODOLOGY **25**
4.1 Research Description 25
4.2 Literature Study 26
4.3 Model Architecture 26

Recyclable Waste Image Classification in Indonesia using Convolutional Neural Network
M AMRIDHAN MAHDI, Afiahayati, S. kom., M.Cs., Ph.D
Universitas Gadjah Mada, 2024 | Diunduh dari http://etd.repository.ugm.ac.id/

4.4 Research Phase 27
4.5 Data Acquisition 28
4.6 Data Pre-processing 29
4.7 Model Building 30
4.8 Model Evaluation 31
IMPLEMENTATION 32
5.1 Specification 32
5.2 Pre-Processing Data 32
5.2.1 Data Preparation 32
5.2.2 Data Input 34
5.2.3 Data Visualization 35
5.2.4 Data Augmentation 39
5.3 Model Preparation 41
RESULT AND DISCUSSION 42
6.1 Evaluation 42
6.1.1 Training with Augmentation 42
6.1.2. Training without Augmentation 44
6.1.3 Training using Several Layers with Augmentation 47
6.1.4 Training using Several Layers without Augmentation 48
6.2 Discussion 51
CONCLUSION 52
7.1 Conclusion 52
7.2 Suggestion 52
REFERENCES 54

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GADJAH MADA
Recyclable Waste Image Classification in Indonesia using Convolutional Neural Network
M AMRIDHAN MAHDI, Afiahayati, S. kom., M.Cs., Ph.D
Universitas Gadjah Mada, 2024 | Diunduh dari http://etd.repository.ugm.ac.id/

List of Figures

Figure 1. 1 Sources of domestic waste 2

Figure 1. 2 Waste Composition 3

Figure 3. 1 Example of Convolutional Neural Network Process 19

Figure 3. 2 ReLu Output Illustration Graph 21

Figure 3. 3 Confusion Matrix for Multi-Class Classification 23

Figure 4. 1 Model Architecture 26

Figure 4. 2 Research Phase 27

Figure 4. 3 Example of Waste Images: Plastic, Metal, Glass, Paper and Cardboard 28

Figure 4. 4 VGG16 Model Structure 30

Figure 5. 1 Folders and Files 33

Figure 5. 2 Splitting Data Code 34

Figure 5. 3 Data Directory 35

Figure 5. 4 Image Visualization Code 37

Figure 5. 5 Data Visualization 38

Figure 5. 6 Data Augmentation Code 40

Figure 5. 7 Model Preparation Code 41

Figure 6. 1 Training with Augmentation History Graph and Confusion Matrix of Validation Data 43

Figure 6. 2 Training without Augmentation Graph and Confusion Matrix of Validation Data 46

Figure 6. 3 Training using Several Layers with Augmentation Graph and Confusion Matrix of Validation Data 48

Figure 6. 4 Training using Several Layers without Augmentation Graph and Confusion Matrix of Validation Data 50

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Recyclable Waste Image Classification in Indonesia using Convolutional Neural Network
M AMRIDHAN MAHDI, Afiahayati, S. kom., M.Cs., Ph.D
Universitas Gadjah Mada, 2024 | Diunduh dari http://etd.repository.ugm.ac.id/

List of Tables

Table 2. 1 Comparison Table *10*

Table 6. 1 Training with Augmentation History Table *42*

Table 6. 2 Training without Augmentation History Table *45*

Table 6. 3 Training using Several Layers with Augmentation History Table *47*

Table 6. 4 Training using Several Layers without Augmentation History Table *49*

Table 6. 5 Experiment Evaluation Table *51*