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Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
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Table of Contents

ABSTRACT ..... **x**
CHAPTER I. INTRODUCTION **1**
1.1. Research Background 1
1.2. Research Problem 4
1.3. Research Scope 4
1.4. Research Objective 5
1.5. Research Benefit 5
1.6. Research Methodology 5
1.7. Writing Systematics 7
CHAPTER II. LITERATURE REVIEW **9**
CHAPTER III. THEORETICAL BASIS **16**
3.1. Object Detection 16
3.1.1. Object Detection History 16
3.1.2. Object Detection Types 18
3.2. Deep Learning 19
3.2.1. Region-based Convolutional Neural Networks (R-CNN) 21
3.2.2. Fast-RCNN 22
3.2.3. Faster-RCNN 23
3.3. Image Preprocessing & Augmentation 24
3.4. You Only Look Once (YOLO) 26
3.5. Transfer Learning 31
3.6. YOLOv5 32
3.6.1. Backbone 34
3.6.2. Neck 40
3.6.3. Head 41
3.7. YOLOv7 44
3.7.1. YOLOv7 Architecture 47
3.7.2. Trainable bag-of-freebies 49

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

3.7.3. Coarse for auxiliary and fine for lead loss 50
3.8. Vehicle Number Plates 51
3.8.1. YOLOv5 Architecture 52
3.9. Automatic Number Plate Recognition (ANPR) 54
3.10. Key Metrics 55
CHAPTER IV. RESEARCH METHODOLOGY 57
4.1. Tools and Materials 57
4.2. System Analysis 58
4.3. System Design 59
4.3.1. Data Collection 60
4.3.2. Image Pre-processing 61
4.3.3. Image Augmentation 62
4.3.4. Model Training 62
4.3.5. Testing and Evaluation 64
CHAPTER V. IMPLEMENTATION 66
5.1. Building Dataset 66
5.1.1. Data Collection 66
5.1.2. Data Annotation 67
5.1.3. Dataset Splitting 68
5.1.4. Image Pre-processing 68
5.1.5. Image Augmentation 69
5.1.6. Dataset Exportation 70
5.2. Implementing YOLOv5 71
5.2.1. Installing YOLOv5 71
5.2.2. Dataset Importing 72
5.2.3. YOLOv5 Model Configuration 74
5.3. Implementing YOLOv7 75
5.3.1. Installing YOLOv7 76
5.3.2. Importing Dataset 76
5.4. Model Training 78

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

5.5. Model Training Results 79
5.6. Model Testing 82
5.6.1. Installing Local Environment 82
5.6.2. Environment Activation and Testing 83
CHAPTER VI. RESULTS AND DISCUSSION 86
6.1. YOLOv5 Training Results 86
6.1.1. YOLOv5n Training Results 86
6.1.2. YOLOv5s Training Results 87
6.1.3. YOLOv5m Training Results 89
6.1.4. Comparison of YOLOv5 Models Training Results 90
6.2. YOLOv5 Accuracy Test 91
6.2.1. YOLOv5n Accuracy Test 93
6.2.2. YOLOv5s Accuracy Test 94
6.2.3. YOLOv5m Accuracy Test Results 94
6.2.4. YOLOv5 Accuracy Test Analysis 96
6.2.5. YOLOv5 Models Computational Tests 97
6.3. YOLOv7 Training Results 99
6.3.1. YOLOv7-tiny Training Results 99
6.3.2. YOLOv7 Base Model Training Results 100
6.3.3. YOLOv7 Training Results Analysis 101
6.4. YOLOv7 Accuracy Test 102
6.4.1. YOLOv7-tiny Accuracy Test 102
6.4.2. YOLOv7 Base Model Accuracy Test 103
6.4.3. YOLOv7 Model Accuracy Test Analysis 104
6.4.4. YOLOv7 Computational Test 105
6.5. YOLOv5 and YOLOv7 Model Comparison 106
6.5.1. Training Result Analysis 106
6.5.2. Accuracy Test Analysis 108
6.5.3. Computational Test Analysis 112
CHAPTER VII. CONCLUSION 114

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

7.1. Conclusion 114
7.2. Suggestions 115
REFERENCES 116

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

LIST OF FIGURES

Figure 3.1 Example of Object Detection 16
Figure 3.2 Taxonomy of Object Detectors 18
Figure 3.3 Two-stage vs Single stage object detector diagram 19
Figure 3.4 Traditional ML vs Deep Learning 21
Figure 3.5 R-CNN Architecture 22
Figure 3.6 Fast-RCNN Architecture 23
Figure 3.7 Faster-RCNN Architecture 24
Figure 3.8 Result of Image Preprocessing 25
Figure 3.9 Image Augmentation Examples 26
Figure 3.10 YOLO divides an image into an S x S grid lines. 28
Figure 3.11 Interest Over Union 29
Figure 3.12 Non-Maximal Suppression 30
Figure 3.13 YOLO Architecture 31
Figure 3.14 Model-based Transfer Learning Perspective 32
Figure 3.15 Performance of YOLOv5 Models 33
Figure 3.16 Dense Block Layer 36
Figure 3.17 DenseNet 36
Figure 3.18 Cross Stage Partial Network 37
Figure 3.19 SPP Layer 38
Figure 3.20 SPP Block Adapted to YOLO 39
Figure 3.21 Path Aggregation Network Structure 41
Figure 3.22 Modified PAN Structure 41
Figure 3.23 Comparation between ReLU and Leaky ReLU visualization 42
Figure 3.24 Comparison with other real-time object detectors 45
Figure 3.25 Extended efficient layer aggregation networks 48
Figure 3.26 Model scaling for concatenation-based models 48
Figure 3.27 Planned re-parameterization model 50

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

Figure 3.28 Coarse for auxiliary and fine for lead head label assigner..... 51
Figure 3.29 Indonesian Vehicle Number Plate 52
Figure 3.30 YOLOv5 Architecture 53
Figure 3.31 ANPR Result 54
Figure 4.1 General System Flow Diagram..... 60
Figure 4.2 Model Training Flow Diagram..... 62
Figure 4.3 Model Testing Diagram..... 65
Figure 5.1 XML file contents..... 67
Figure 5.2 Dataset Distribution..... 68
Figure 5.3 Pre-processing options in Roboflow..... 69
Figure 5.4 Applied Augmentations using Roboflow. 70
Figure 5.5 Final Train/Test Split..... 70
Figure 5.6 The '.txt' file containing label coordinates..... 71
Figure 5.7 Cloning YOLOv5 Repo and Installing Dependencies..... 72
Figure 5.8 Export the Dataset from Roboflow..... 73
Figure 5.9 Code Snippet for Dataset Importing..... 73
Figure 5.10 Contents in 'data.yaml'..... 74
Figure 5.11 YOLOv5s Model '.yaml' Configuration 75
Figure 5.12 Cloning YOLOv5 Repo and Installing Dependencies. 76
Figure 5.13 Exporting Dataset from Roboflow..... 77
Figure 5.14 Code Snippet for Dataset Importing..... 77
Figure 5.15 Code Snippet for YOLOv5 Model Training..... 78
Figure 5.16 Downloading YOLOv7 Pre-trained Weights from the Repository 78
Figure 5.17 Code Snippet for YOLOv7 training 78
Figure 5.18 Code Snippet to Run Tensorboard..... 80
Figure 5.19 Plotting the Training Results 81
Figure 5.20 Using Pandas to View the Results as DataFrame..... 81
Figure 5.21 Command line to be run in the Anaconda Prompt 82
Figure 5.22 Anaconda Command to Create Virtual Environment..... 82

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

Figure 5.23 Command to activate environment. 83
Figure 5.24 Checking Device for PyTorch 83
Figure 5.25 Command to run the detection model 84
Figure 5.26 Finished Detecting 84
Figure 5.27 Sample Training Results 85
Figure 5.28 Predicted bounding box and label file 85
Figure 6. 1 YOLOv5n Training Visualization 87
Figure 6.2 YOLOv5s Training Visualization 88
Figure 6.3 YOLOv5m Training Visualization 90
Figure 6. 4 YOLOv5m False Positive 95
Figure 6. 5 YOLOv5 Accuracy Test Histogram 97
Figure 6. 6 YOLOv5 FPS Histogram Visualization 98
Figure 6. 7 YOLOv7-tiny Training results histogram 100
Figure 6.8 YOLOv7 Training Result Histogram 101
Figure 6. 9 Tensorboard YOLOv7 training graph 102
Figure 6. 10 YOLOv7 model Accuracy Test Graph 105
Figure 6. 11 YOLOv7 Computational Frames per Second Histogram 106
Figure 6. 12 YOLOv5 and YOLOv7 Training Result Histogram 107
Figure 6. 13 YOLOv5 and YOLOv7 Accuracy Test Results Comparison 109
Figure 6. 14 Computational Test Comparison Histogram 113

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

LIST OF TABLES

Table 2.1 Comparison of authors, dataset, method, and result between the Papers ... 13
Table 3.1 Comparison of baseline object detectors. ... 47
Table 4.1 List of Tools Used for This Research ... 57
Table 4.2 Hardware Specifications ... 58
Table 4.3 Dataset Class Table ... 61
Table 4.4 Testing Design Table ... 65
Table 5.1 Number Plate Class Table ... 66
Table 6.1 YOLOv5n Training Results ... 86
Table 6.2 YOLOv5s Training Results ... 88
Table 6.3 YOLOv5m Training Results ... 89
Table 6.4 YOLOv5 Model results comparison ... 90
Table 6.5 Accuracy Test Confusion Matrix Sample ... 92
Table 6.6 YOLOv5n Confusion Matrix ... 93
Table 6.7 YOLOv5n Accuracy Test Results ... 93
Table 6.8 YOLOv5s Confusion Matrix ... 94
Table 6.9 YOLOv5s Accuracy Test Results ... 94
Table 6.10 YOLOv5m Confusion Matrix ... 95
Table 6.11 YOLOv5m Accuracy Test Results ... 95
Table 6.12 YOLOv5 Model Accuracy Comparison ... 96
Table 6.13 YOLOv5 Computational Test Analysis ... 98
Table 6.14 YOLOv7-tiny Training Results ... 99
Table 6.15 YOLOv7 Base Model Training Results ... 100
Table 6.16 YOLOv7 Training Results Comparison ... 101
Table 6.17 YOLOv7-tiny Confusion Matrix ... 103
Table 6.18 YOLOv7-tiny Accuracy Test Results ... 103
Table 6.19 YOLOv7 Confusion Matrix ... 103
Table 6.20 YOLOv7 Accuracy Test Results ... 104

UNIVERSITAS
GADJAH MADA
Comparison of YOLOv5 Variants with YOLOv7-tiny Model for Indonesian License Plate Detection
Muhammad Aziz Hamdani Hammadallah, Dr. Agus Sihabuddin, S.Si., M.Kom.
Universitas Gadjah Mada, 2023 | Diunduh dari http://etd.repository.ugm.ac.id/

Table 6.21 YOLOv7 model Accuracy Test Analysis 104
Table 6.22 YOLOv7 Computational speed comparison 105
Table 6.23 YOLOv5 and YOLOv7 model Training results table 107
Table 6.24 Accuracy Test Result Comparison 108
Table 6.25 False Positive Differences Between Both Models 110
Table 6.26 False Negative Differences Between Both Models 110
Table 6.27 Computational Test Results Comparison 112