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HUMAN DETECTION FOR BOUNDING BOX OUTPUT USING NON MAXIMUM SUPRESSION ALGORITHMS
RAMA MAHATVA, Azhari, Drs., M.T., Dr
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TABLE OF CONTENTS

APPROVAL PAGE i
STATEMENT ii
FOREWORD iii
TABLE OF CONTENTS iv
TABLE OF TABLES vi
TABLE OF FIGURES vii
ABSTRACT ix
ABSTRAK x
CHAPTER I INTRODUCTION 1
1.1 Research Background 1
1.2 Research Problem 2
1.3 Research Scope 2
1.4 Research Objective 2
1.5 Research Advantages 3
CHAPTER II LITERATURE REVIEW 4
CHAPTER III BASIC THEORY 8
3.1 Computer Vision 8
3.2 Image Classification 8
3.2.1 Histogram of Oriented Gradients 8
3.2.2 Support Vector Machines 10
3.3 Image Detection 13
3.3.1 Sliding Window Search 13
3.3.2 Non Maximum Suppression 14
3.3.3 Intersection Over Union Threshold 15
3.4 Confusion Matrix 16
3.5 OpenCV 17
CHAPTER IV RESEARCH METHODOLOGY 18
4.1 Research Description 18
4.2 Data Preprocessing 19
4.3 Data Training 19
4.3.1 Histogram of Oriented Gradients (HOG) 19
4.3.2 Final Descriptor Size 22
4.4 SVM Classifier Model 22
4.5 Non Maximum Suppression 23
4.6 Intersection over Union Threshold 24
4.7 Experiment 25
4.8 Evaluation 26

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GADJAH MADA
HUMAN DETECTION FOR BOUNDING BOX OUTPUT USING NON MAXIMUM SUPRESSION ALGORITHMS
RAMA MAHATVA, Azhari, Drs., M.T., Dr
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

4.8.1 Average Precision, Recall Score and F-1 Score 26
CHAPTER V IMPLEMENTATION 27
5.1 Specification of Hardware and Software 27
5.2 System Implementation 27
5.3 Implementation of Image Preprocessing 28
5.3.1 Importing Library 28
5.3.2 Resizing Images 28
5.4 Extracting HOG Features 29
5.4.1 Importing Library 29
5.4.2 Loading Data 30
5.4.3 Calculating Gradients 30
5.5 SVM Model 34
5.5.1 Importing Library 34
5.5.2 Splitting Data and Predicting the SVM Model 34
5.5.3 Saving and Loading the Model 36
5.6 Human Detection Process 36
5.6.1 Sliding Window Search 36
CHAPTER VI RESULT AND DISCUSSION 40
6.1 Results of Preprocessing Data 40
6.2 HOG Visualization 41
6.3 Result of SVM Classification 42
6.4 Result of the Detection 46
CHAPTER VII CONCLUSIONS AND SUGGESTIONS 50
7.1 Conclusions 50
7.2 Suggestions 50
REFERENCES 51

UNIVERSITAS
GADJAH MADA
HUMAN DETECTION FOR BOUNDING BOX OUTPUT USING NON MAXIMUM SUPRESSION ALGORITHMS
RAMA MAHATVA, Azhari, Drs., M.T., Dr
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

TABLE OF TABLES

Table 2.1 Summary review of resource papers 6

Table 3.1 Confusion Matrix 16

Table 6.1 Confusion Matrix Comparison of the SVM Model Experiments 45
Table 6.2 Comparison of Detection Accuracy between each Experiments 45
Table 6.3 Test Images IoU Bounding Box Scores 49

UNIVERSITAS
GADJAH MADA
HUMAN DETECTION FOR BOUNDING BOX OUTPUT USING NON MAXIMUM SUPRESSION ALGORITHMS
RAMA MAHATVA, Azhari, Drs., M.T., Dr
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

TABLE OF FIGURES

Figure 3.1 Example of HOG extracted features 10
Figure 3.2 Example of SVM Parameter C 11
Figure 3.3 N-Linear SVM classifier lines 12
Figure 3.4 Convex polygon and their SVM 12
Figure 3.5 Example of Image Pyramid Scaling 14
Figure 3.6 Non Maximum Suppression pseudo code 15
Figure 3.7 Example of Non-Maximum Suppression process 15
Figure 3.8 Example of Bounding Box IoU sample scores 16

Figure 4.1 Research Description Flowchart 18
Figure 4.2 Samples of the Image from the dataset 19
Figure 4.3 Samples of the training Image from the dataset 20
Figure 4.4 Zoomed of the training Image from the dataset with 8x8 cell 20
Figure 4.5 Flowchart of HOG model 21
Figure 4.6 Dalal and Triggs 2 cells by 2 cells block normalization 22
Figure 4.7 Flowchart of SVM Classifier model 23
Figure 4.8 Flowchart of the NMS model 24
Figure 4.9 The Detection Ground Truth Bounding Box and IoU score Example of the Detected Bounding Boxes 24
Figure 4.10 Flowchart of the Threshold model 25
Figure 4.11 Detailed Flowchart of the model 26

Figure 5.1 Importing the Library for Image Preprocessing 28
Figure 5.2 Resizing the Images 29
Figure 5.3 Importing Library for HOG Features Descriptor 29
Figure 5.4 Importing Dataset of Human and No Human 30
Figure 5.5 Color Histogram Features 31
Figure 5.6 Parameters for Feature Matrix of HOG Descriptor 32
Figure 5.7 The Hyperparameters used for Extracting Features 32
Figure 5.8 Converting an Image into Gray Channel 33
Figure 5.9 Making the Label for SVM classifier 33
Figure 5.10 Importing Library for Implementing SVM as Classifier 34
Figure 5.11 Splitting the Data 34
Figure 5.12 Training and Predicting the Model 35
Figure 5.13 Saving the Model Prediction 36
Figure 5.14 Defining the Sliding Window and the Detector 37
Figure 5.15 Predicting the Region of Interest in Tested Image 38

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GADJAH MADA
HUMAN DETECTION FOR BOUNDING BOX OUTPUT USING NON MAXIMUM SUPRESSION ALGORITHMS
RAMA MAHATVA, Azhari, Drs., M.T., Dr
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

Figure 5.16 Testing Image for Sliding Window Search and Coordinate Extraction.....38
Figure 5.17 IoU Score and Human Detection Output 39

Figure 6.1 Sample Images of Resized Positive and Negative from the Datasets.....40
Figure 6.2 Positive Sample Images in HOG Visualization 41
Figure 6.3 Negative Sample Images in HOG Visualization.....42
Figure 6.4 Comparison of Confusion Matrix 44
Figure 6.5 Negative Human Detections in Test Image 46
Figure 6.6 Positive Human Detections in Test Image With and Without NMS 47
Figure 6.7 Image 1 Bounding Box IoU Score Experiment Results 48
Figure 6.8 Image 2 Bounding Box IoU Score Experiment Results 48