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CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK
(CNN) AND SUPPORT VECTOR MACHINES (SVM)
AISYA NADYA DAMARCHA, Khabib Mustofa, S.Si., M.Kom., Dr.techn
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TABLE OF CONTENTS

APPROVAL PAGE i
STATEMENT ii
FOREWORD v
TABLE OF CONTENTS vi
TABLE OF TABLES x
TABLE OF FIGURES xi
ABSTRACT xv
CHAPTER I 1
INTRODUCTION 1
1.1 Research Background 1
1.2 Research Problem 2
1.3 Research Scope 2
1.4 Research Objective 3
1.5 Research Advantages 3
CHAPTER II 5
LITERATURE REVIEW 5
CHAPTER III 9
BASIC THEORY 9
3.1 Contrast Stretching Methods 9
3.2 Convolutional Neural Network (CNN) 10
3.2.1 Convolutional Layer 13
3.2.2 Max Pooling Layer 16
3.2.3 Fully-Connected Layer 16

UNIVERSITAS GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK (CNN) AND SUPPORT VECTOR MACHINES (SVM)
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3.3 Histogram of Oriented Gradient 17
3.4 Support Vector Machines 19
3.5 Object Detection 23
3.5.1 Sliding Window Search and Heatmapping 23
3.5.2 Edge Detection 24
3.5.2.1 Canny Edge Detection 25
3.5.2.2 Hough Line Transform 26
CHAPTER IV 28
RESEARCH METHODOLOGY 28
4.1 Research Description 28
4.2 Data Collection 29
4.3 Data Preprocessing 30
4.4 Modeling 31
4.4.1 CNN 31
4.4.2 SVM 33
4.5 Evaluation 36
4.5.1 Evaluation of Models Classification 36
4.5.2 Visualization of Car Detection 36
4.5.3 Visualization of Empty Parking Space Detection 37
CHAPTER V 38
IMPLEMENTATION 38
5.1 Specification of Hardware and Software 38
5.2. System Implementation 39
5.2.1 Implementation of Image Preprocessing 39
5.2.1.1 Importing Library 39

UNIVERSITAS
GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK
(CNN) AND SUPPORT VECTOR MACHINES (SVM)
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Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

5.2.1.2 Image Enhancement with Contrast Stretching 39
5.2.1.3 Resizing Images 41
5.2.2 Implementation of Training and Validation on CNN Models 42
5.2.2.1 Importing Library 42
5.2.2.2 Loading Data 43
5.2.2.3 Splitting Sample Data 44
5.2.2.4 Building and Training the Model 45
5.2.2.5 Predicting Model 48
5.2.3 Extracting HOG Features 50
5.2.3.1 Importing Library 50
5.2.3.2 Loading Data 50
5.2.3.3 Calculating Gradients 51
5.2.4 SVM Model 55
5.2.4.1 Importing Library 55
5.2.4.2 Splitting Data and Predicting the SVM Model 56
5.2.4.3 Saving and Loading the Model 58
5.2.5 Cars Detection 58
5.2.5.1 Sliding Window Search 58
5.2.5.2 Heat Maps 61
5.2.6 Empty Parking Space Detection 64
5.2.6.1 Importing Library 64
5.2.6.2 Color Selection 64
5.2.6.3 Edge Detection 66
5.2.6.4 Hough Line Transform 68
CHAPTER VI 72

UNIVERSITAS GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK (CNN) AND SUPPORT VECTOR MACHINES (SVM)
AISYA NADYA DAMARCHA, Khabib Mustofa, S.Si., M.Kom., Dr.techn
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

RESULT AND DISCUSSION 72
6.1 Results of Preprocessing Data 72
6.2 Results of CNN Model 73
6.2.1 Loss Function 73
6.2.2 Accuracy of Validation and Training Set 75
6.3 HOG Visualization 77
6.4 Result of SVM Classification 78
6.5 Result of Cars Detection 81
6.5.1 Sliding Window Search 81
6.5.2 Heat Mapping 81
6.6 Result of Empty Parking Space Detection 82
6.6.1 Color Selection 82
6.6.2 Canny Edge Detection 84
6.6.3 Hough Line Transform 86
CHAPTER VII 87
CONCLUSIONS AND SUGGESTIONS 87
7.1 Conclusions 87
7.2 Suggestions 87
REFERENCES 88

UNIVERSITAS
GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK
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Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

TABLE OF TABLES

Table 2.1 Literature Review 6

Table 6.1 Confusion Matrix of CNN Model 75

Table 6.2 Confusion Matrix of SVM Model 79

Table 6.3 Comparison of Detection Accuracy of CNN and SVM Classification 80

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GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK
(CNN) AND SUPPORT VECTOR MACHINES (SVM)
AISYA NADYA DAMARCHA, Khabib Mustofa, S.Si., M.Kom., Dr.techn
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

TABLE OF FIGURES

Figure 3.1 The Example of Binary Cross Entropy (Gupta et al., 2017)..... 12

Figure 3.2 The Structure of CNN (Gupta et al., 2017)..... 13

Figure 3.3 Example of Convolutions Move or Stride of 2 (Gonzalez et al., 2002) 14

Figure 3.4 Example of Operation in CNN's layer (Krizhevsky et al., 2012)..... 15

Figure 3.5 Example of Max Pooling Layer Operation (Gupta et al., 2017)..... 16

Figure 3.6 Sample of SVM with Hyperplanes (Mallick, 2016) 20

Figure 3.7 Loss Function Intuition (Tyagi, 2019) 21

Figure 3.8 Confusion Matrix with Predicted and Actual Values (Mallick, 2016) 22

Figure 3.9 Example of Sliding Window Area in Image (Mallick, 2016)..... 23

Figure 3.10 Heatmapping Selected Area..... 24

Figure 3.11 One-dimensional Edge Profile (Shinde, 2019) 25

Figure 3.12 Lines in Polar System (Lee, 2020)..... 26

Figure 4.1 Flowchart of Research Methodology..... 29

Figure 4.2 Sample of Parking Space Images..... 30

Figure 4.3 Sample of vehicle detection using HOG (Tyagi, 2019)..... 33

Figure 4.4 Sample of HOG extracted feature..... 35

Figure 4.5 Hyperplane coordinate of SVM model (Mallick, 2016)..... 35

Figure 5.1 Importing the Library for Image Preprocessing..... 39

Figure 5.2 Contrast Stretching Images Contained Cars 40

Figure 5.3 Contrast Stretching the No Car Images 41

Figure 5.4 Resizing the Images 41

UNIVERSITAS
GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK
(CNN) AND SUPPORT VECTOR MACHINES (SVM)
AISYA NADYA DAMARCHA, Khabib Mustofa, S.Si., M.Kom., Dr.techn
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

Figure 5.5 Importing the Library 43
Figure 5.6 Loading Car and No Car Images 44
Figure 5.7 Defining the Category of Positive and Negative Sample Data 44
Figure 5.8 Concatenation Function of Joining Two Arrays of the Same Type 45
Figure 5.9 Splitting the Training and Testing Set 45
Figure 5.10 Data Augmentation 46
Figure 5.11 Building CNN Model 47
Figure 5.12 Compiling the Model 47
Figure 5.13 Training the Model 48
Figure 5.14 Predicting Model 48
Figure 5.15 Classification Matrix of CNN Model 49
Figure 5.16 Single Prediction of Parking Lot Testing Images 49
Figure 5.17 Importing Library for HOG Features Descriptor 50
Figure 5.18 Importing Dataset of Cars and No Cars 50
Figure 5.19 Color Histogram Features 51
Figure 5.20 Parameters for Feature Matrix of HOG Descriptor (Uppala, 2017) 52
Figure 5.21 Converting an Image into Gray Channel 53
Figure 5.22 HOG Features for All Image Data 54
Figure 5.23 Making the Label 55
Figure 5.24 Importing Library for Implementing SVM as Classifier 55
Figure 5.25 Splitting the Data 56
Figure 5.26 Training and Predicting the Model 57
Figure 5.27 Saving the Model Prediction 58
Figure 5.28 Extracting Features Using HOG Sub-Sampling (Uppala, 2017) 59

UNIVERSITAS
GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK (CNN) AND SUPPORT VECTOR MACHINES (SVM)
AISYA NADYA DAMARCHA, Khabib Mustofa, S.Si., M.Kom., Dr.techn
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

Figure 5.29 Predicting the Region of Interest in Test Image 60

Figure 5.30 Testing Image for Sliding Window Search..... 61

Figure 5.31 Adding the Heat Map..... 62

Figure 5.32 Showing Heat Map of Test Image 63

Figure 5.33 Cars Detection..... 63

Figure 5.34 Library for Empty Parking Space Detection..... 64

Figure 5.35 Masking Out of RGB Color Space 64

Figure 5.36 Converting Images into HSV and HSL Color Space..... 65

Figure 5.37 Applying Masks into the HSL Images..... 65

Figure 5.38 Converting Test Images into Grayscale..... 66

Figure 5.39 Smoothing the Grayscale Images..... 66

Figure 5.40 Canny Edge Detection 67

Figure 5.41 Region of Interest..... 67

Figure 5.42 Hough Lines Transform..... 68

Figure 5.43 Setting Parameters for Lines detection 69

Figure 5.44 Averaging and Extrapolating Lines 70

Figure 5.45 Drawing the Lines on the Detected Images 71

Figure 6.1 Sample Images Contain Cars and No Car After Contrast Stretched 72

Figure 6.2 Validation and Training Loss of Optimized CNN Models..... 73

Figure 6.3 Parameters of CNN Model..... 74

Figure 6.4 Comparison of Classification Report..... 76

Figure 6.5 Validation and Training Accuracy of Optimized CNN Models 76

Figure 6.6 Sample Images in HOG Visualization..... 77

Figure 6.7 Comparison of Confusion Matrix 78

UNIVERSITAS
GADJAH MADA
CONTRAST STRETCHING TO ENHANCE PARKING LOT DETECTION AT NIGHT BASED ON CONVOLUTIONAL NEURAL NETWORK (CNN) AND SUPPORT VECTOR MACHINES (SVM)
AISYA NADYA DAMARCHA, Khabib Mustofa, S.Si., M.Kom., Dr.techn
Universitas Gadjah Mada, 2021 | Diunduh dari http://etd.repository.ugm.ac.id/

Figure 6.8 Linear SVM Classification 80

Figure 6.9 Sliding Window Search in Contrast Stretched Test Image..... 81

Figure 6.10 Heat Map Recurring Detections Frame in Test Image 81

Figure 6.11 Car Detections in Test Image..... 82

Figure 6.12 Images in RGB Color Space..... 82

Figure 6.13 Converting RGB to HSV Images..... 83

Figure 6.14 Converting HSV into HSL Images 83

Figure 6.15 Converting Images into Grayscale Images 84

Figure 6.16 Gaussian Blur for Smoothing..... 85

Figure 6.17 Canny Edge Detection 85

Figure 6.18 Lines Detection in Test Images..... 86