# MALAYSIA CAR PLATE RECOGNITION 

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# FACULTY OF COMPUTING AND INFORMATICS UNIVERSITI MALAYSIA SABAH 

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# THESIS SUBMITTED IN PARTIAL FULFILMENT OF THE REQUIREMENT FOR THE DEGREE OF BACHELOR OF SOFTWARE ENGINEERING 

# FACULTY OF COMPUTING AND INFORMATICS UNIVERSITI MALAYSIA SABAH 

## DECLARATION

I hereby declare that this thesis, submitted to University Malaysia Sabah as partial fulfillment of the requirements for the degree of Bachelor of Computer Science (Software Engineering), has not been submitted to any other university for any degree. I also certify that the work described herein is entirely my own, except for quotations and summaries sources of which have been duly acknowledged.

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$10^{\text {th }}$ July 2015

## CERTIFIED BY

(Dr Chin Kim On)

## SUPERVISOR

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#### Abstract

Automatic Number Plate Recognition (ANPR) has gained much popularity over the years. ANPR are used for automatic toll collection and management for parking areas. However, there is no international common standard for car plates which makes the task of automatic car plate's recognition very challenging. In Malaysia, the Malaysian Road Transport Department (JPJ) is the government body in charge of issuing car plate licenses. Malaysian license plates consists of English alphabets and numbers and so designing ANPR for Malaysia license plates is straightforward and easy. However, there are a number of memorial plates, or plates with distinctive prefixes that are made available by the JPJ. These types of license plates are sold at a higher cost. These special plates are used to denote the manufacturer of the car such as Proton Malaysia introduced "Proton Waja" cars, a special event car plate BAMbee was issued in 2000 for Thomas and Uber Cup which was held in Kuala Lumpur in that particular year. Hence, designing an accurate ANPR system for such license plates is challenging. This research project involves autonomously localizes and recognizes non-standardized Malaysian's car plates using conventional Backpropagation algorithm in combination with Feed-Forward Neural Network (BPNN). The experimental result is compared with the results obtained using simple Radial Basis Function Network (RBF). This research aims to solve four main issues; (1) localization of car plates that has the same colour with the vehicle colour, (2) detection and recognition of car plates with varying sizes, (3) detection and recognition of car plates with different font types, and (4) detection and recognition of non-standardized car plates. The proposed method involves two tasks, pre-processing and recognition. The captured car images are first binarized in order to remove unwanted small objects. Then, filtering is applied in order to remove larger objects. Next, a deblurring technique is proposed to create an area for bounding box. The bounding technique could segment the characters correctly. Lastly, BPNN as well RBF are used to train the segmented and extracted characters. The experimental results show that the combination of BPNN and RBF can be effectively used to solve these four issues. In BPNN, letters ' J ' and ' $\mathrm{M}^{\prime}$ ' and digit ' 7 ' and ' 8 ' achieved 90.91\%, $85.71 \%, 97.22 \%$ and $97.14 \%$, respectively. In RBF, letters ' $\mathrm{B}^{\prime}$, ' S ' and digit ' 0 ' accuracy rates are $97.22 \%, 96.97 \%$ and $86.67 \%$, respectively. Hence, it shows RBF performed better than BPNN.


#### Abstract

ABSTRAK

Nombor Plat automatik Pengiktirafan (ANPR) dapat populariti banyak selama ini. ANPR digunakan untuk kutipan tol automatik dan pengurusan bagi kawasan letak kereta. Tugas pengiktirafan plat kereta automatik yang sangat mencabar sebab tidak ada ukuran antarabangsa untuk plat kereta. Di Malaysia, Jabatan Pengangkutan Jalan Malaysia (JPJ) merupakan badan kerajaan yang bertanggungjawab mengeluarkan lesen plat kereta. Plat lesen Malaysia terdiri daripada huruf Bahasa Inggeris dan nombor jadi menbentuk ANPR untuk plat lesen Malaysia adalah mudah. Terdapat beberapa plat peringatan, atau awalan plat tersendiri yang disediakan oleh JPJ. Jenis-jenis plat lesen dijual pada kos tinggi. Plat khas menunjukkan pengeluar kereta seperti Proton Malaysia telah memperkenalkan "Proton Waja" kereta, plat kereta khas seperti BAMbee telah dikeluarkan pada tahun 2000 untuk Thomas dan Piala Uber yang diadakan di Kuala Lumpur pada tahun berkenaan. Oleh itu, menbentuk sistem ANPR tepat untuk plat lesen adalah mencabar. Projek penyelidikan ini melibatkan cara autonomi untuk menempatkan dan mengiktiraf plat kereta tidak standard yang menggunakan algoritma Backpropagation konvensional dalam kombinasi dengan Rangkaian Neural Feed-Forward (BPNN). Hasil eksperimen dibandingkan dengan keputusan yang diperolehi menggunakan Radial Rangkaian Fungsi Asas (RBF) mudah. Kajian ini bertujuan untuk menyelesaikan empat isu utama; (1) penempatan plat kereta yang mempunyai warna yang sama dengan warna kenderaan itu, (2) pengesanan dan pengiktirafan plat kereta dengan pelbagai saiz, (3) pengesanan dan pengiktirafan plat kereta dengan jenis font yang berbeza, dan (4) pengesanan dan pengiktirafan plat kereta tidak standard. Kaedah yang dicadangkan melibatkan dua tugas, pra-pemprosesan dan pengiktirafan. Imej-imej kereta yang ditangkap adalah binarized untuk membuang benda kecil yang tidak diingini. Kemudian, penapisan digunakan untuk memadam objek yang lebih besar. Seterusnya, teknik deblurring adalah dicadangkan untuk mewujudkan kawasan yang diingini. Teknik bounding boleh segmen watak-watak dengan betul. Akhir sekali, BPNN serta RBF digunakan untuk melatih watak bersegmen dan diekstrak. Keputusan eksperimen menunjukkan bahawa gabungan BPNN dan RBF boleh digunakan secara berkesan untuk menyelesaikan empat isu. Dalam BPNN, huruf 'J' dan ' M ' dan angka ' 7 ' dan ' 8 ' mencapai $90,91 \%, 85,71 \%, 97,22 \%$ dan $97,14 \%$, masing-masing. Dalam RBF, huruf 'B', 'S' dan kadar ketepatan angka '0' adalah $97,22 \%, 96,97 \%$ dan $86,67 \%$, masing-masing. Oleh itu, ia menunjukkan RBF prestasi yang lebih baik daripada BPNN.


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## CHAPTER 1

## INTRODUCTION

### 1.0 Introduction

Car plate recognition system is a system which aided human in reading car plate number in an efficient way which save energy and time. Before emerge of the computer-based car plate recognition, human recorded car plate number manually by using pen and paper until the introduction of the great technology in photoenforcement industry, which is after the cold war. In 1993, it made a successful transition from the research bench to the commercial marketplace. And recently, there is an increasing number of vendor from every corner of the world are finding its way into progressively more solutions-oriented systems.

Image-processing technology which is a technique involve to treat the image as a two-dimensional signal and applying standard signal-processing to it. This technique is a crucial technique in car plate recognition system to read the car plate number from the car image. There are many ways of phrases to design a car plate recognition system by different vendors. The car plate recognition technology is also known as automatic number plate recognition, automatic vehicle identification, car plate recognition, car plate reader or optical character recognition for cars.

Car plate recognition system has a wide range of applications since the license plate of vehicles is the most primary, widely accepted, human readable, mandatory identifier of motor vehicles. This system has played a significant rules in traffic law enforcement and it is widely applied over the world to identify stolen cars based on the up-to date blacklist. There are other useful applications such as vehicle access control, automatic toll collection, real-time monitoring and parking area security and management.

This chapter is divided into seven sections. Section 1 provides a description of the problem background while section 2 provides a description of the problem statement. Section 3 defines the objectives of the project and section 4 defines the hypothesis of the project. Next, section 5 discussed the research question. In section 6, the scope of project is discussed. Finally, section 7 will outline how this report is organized.

### 1.1 Problem Background

Character recognition has played an important role in many system included car plate recognition system. This car plate recognition system is used in recognising car plate at the car park entrance. By employing this technology in car park entrance and exit management, conventional car park ticket system can be replaced. In the car plate recognition system, it identifies unique plate number of each car. Plate number can be read by computer using proper step of image processing which start from car plate localization, car plate extraction, character segmentation and recognition of characters.

Recognition happened quite frequently in real world but in artificial intelligence world, recognition is done through machine that is called pattern recognition. There are many important application areas of pattern recognition including finger print identification, voice recognition, face recognition, character recognition and signature recognition. Pattern recognition in research area has a close connection with the neural network since they are adaptive-learning, self-organizing and has capability of fault tolerance. That is why neural network is suitable in pattern recognition.

Although there has been many commercialized software that can be used for identification of car plate in automated car plate recognition system, they are not readily be used in certain countries where their car plate is not standardized like Malaysia. Character on car plate is differ in term of size, styles and format. Thus,
research and development of license plate recognition in Malaysia is still on going to overcome the existing issues.

Artificial neural network has played an important role in machine learning and cognitive science. Back-propagation Neural Network and Radial Basis Function Network are artificial neural networks that will be used in car plate recognition. There are less research have been done in comparison of back propagation neural network and radial basis function network in recognising characters. This has created an initiative to carry out the comparison of accuracy rate between the two artificial neural networks.

### 1.2 Problem Statement

Car plate in developed country such as United Kingdom and United States is standardized in term of types of fonts, letter size and plate size. This standardized car plates are easy to be localised and recognized by the existing car plate recognition system. Malaysia uses standardized car plate too, but special car plates are introduced from time to time to commemorate certain events or occasions. For example, when Proton (which is the main automobile manufacturer), produces a new model such as Perdana, Bambee, Satria and Waja, it is authorized to customize the license plates for their first one thousand customers.

This special privilege allows the car owners to have their car plates to be different from the standardized car plate. There are many non-standard car plate that cannot be recognized by current car plate recognition system. Character which appeared on standard car plate is individually separated and they have constant fonts type, letter size and plate size whereas character on non-standard car plate consists of cursive connected words and has inconsistent fonts type, letter size and plate size. Figure 1.1 shows the example of non-standard car plate which the character "PERODUA" is a cursive connected words.


Figure 1.1: PERODUA car plate

Localization of car plate is an important step in order to extract car plate and read the characters on the plate. When a car image is taken using camera, non-carplate objects which around the car environment will be included into the image such as trees. This makes car plate localization becomes more challenging since localization of car plate may extract non-car-plate objects. Thus, character detection is done on objects found in car image before removing non-car-plate objects. Somehow, some of the car owners paste stickers which contained characters on their car. Stickers on their cars are advertisement sticker and information sticker which contained phone number, examples are shown in Figure 1.2 and Figure 1.3. Besides that, there are some logos appeared on the car which this logo is car manufacture's logo. Example of the car logo is "FORD" and "ISUZU" which can be seen in Figure 1.4 and Figure 1.5.

Differentiation has to be carried out between stickers, logos and car plate so that stickers and logo will be removed while car plate will be remained in the car image for further image processing. Besides that, car plate localisation becomes more difficult when there is no car plate border found on car in black colour. Standard car plate consists of a border around the edge of the car plate and the colour of the border usually is in white in colour. This issue causes the edge of the car plate cannot be detected since the background colour of the car plate is in black which same colour as the car. Figure 1.6 and Figure 1.7 show the example of car plate without border and the car is in black colour.


Figure 1.2: Advertisement sticker


Figure 1.3: Information sticker


Figure 1.4: Ford logo


Figure 1.5: Isuzu logo


Figure 1.6: Car plate without border


Figure 1.7: Car plate without border

### 1.3 Objectives

Here are the lists for objective of the project.

1) Design and implement a pre-processing framework for localising car plate number at car park entrance.
2) Design and implement a car plate recognition algorithm to recognise car plate number.
3) Compare results found using Feed-forward Back-Propagation Neural network and Radial Basis Function (RBF) Network.

### 1.4 Hypothesis

The hypotheses of this research are:
a. To generate rule-based algorithm to perform the car plate detection and localization tasks correctly.
b. To propose a new pre-processing technique to recognise the non-standard car plate which consists of connected cursive character.
c. Test and compare Feed-forward Back-Propagation Neural network and Radial Basis Function (RBF) Network in the recognition phase to recognise car plate character.

### 1.5 Research Questions

a. How to autonomously detect and localize car plate from a captured image?
b. Is that possible to have an algorithm that capable to recognise nonstandard car plate which consists of connected cursive words.
c. Which of the artificial neural network will perform well in the recognition phases?

### 1.6 Research Motivation

Large number of papers within last three decades for car plate recognition have been demonstrated which shows the importance and the worth of this subject in literature. These corresponding implementations mainly fall into two categories which are the vehicle plate localization and the plate character recognition. Literatures of this two categories are particularly devoted to one of them and some considers both parts. By taking a look beyond the published papers and completed works in license plate identification over the years, it shows a particular motivation and enthusiastic. These motivations might address the essence of the subject and corresponding algorithms.

In regard to the essence of problem, one can classify three factors as main reasons and goals. First is the accuracy which itself is divided in to two subclass including accuracy on localization of vehicle license plate and accuracy on recognizing the license plate characters. In this field, especially more complex and robust works have been done in recent years. This is the attribute of advances in technologies which are proportional with increasing accuracy for intelligent agents.

The second factor is algorithm time complexity which is significant when the science purpose is implementation. For the car plate recognition system, some robust algorithm is presented but due to the high time complexity they are not applicable in real time systems. However, it is believed that those approaches could provide a proper pattern for novel hybrid or more simple algorithms.

Third factor is adaptability as expected the intelligent agent, the algorithm or the model has the ability to adapt itself with environment to cope with dynamic outdoor
conditions therefore without human being intervention the expected tasks has been done. In the case of license plate identification such conditions address the various lighting, weather, crashed etc.

To achieve adaptability, more efforts must be performed. Algorithms with enough generality and high accuracy can perform such tasks that need high adaptive capabilities. Such algorithms by supporting simple and complex conditions in their structural model bring confidence out for human beings. Increasing of confidence to machines is a direct relation with reliability of intelligent agents.

### 1.7 Project Scopes

In carrying out the project, here are the scope of the project. Car plate recognition system is recognising car plate number of static car which means that the car is not moving. Picture of static car is taken and kept as data and will be evaluated in the system. Besides that, the data is acquired at parking lots under bright environment which is on daytime. Camera will be used as a tool to capture car image at the parking lots. Next, there is no occlusion and broken characters on car plate when the car image is taken. Besides that, there is only one direction when the car picture is taken, which is 0 degree from the camera to the car. Last but not least, the distance when the car picture is taken is about four feet from the car.

### 1.8 Report Organization

The report outline contains the undergoing chapter of the final year project report.

Chapter 1 presents a general overview of this project, including the problem background, objectives, hypothesis, research question, project scope and the organization of this report. This chapter also gives explanation on the statement of problem.

Chapter 2 is the literature review where it summarizes the recent research and scholarly sources relevant on the particular issue and theory in this project. This chapter also summarizes the particular of theory on simulation approach that connected with this project.

Chapter 3 is methodology which summarize about the method that will be used in this project to obtain the result. In this project the method that will be used in recognizing the license plate character is image processing approach and neural network simulation using MATLAB.

Chapter 4 explains preliminary experiment and experimental setting. The result represent in form of performance table, the network simulation result from the network training and the discussion on recognition result.

Chapter 5 discussed result of car plate localisation rate and car plate character recognition. Experiment is conducted to the data and result of the accuracy rate is recorded. Analysis of the results will be carried out to check how well the accuracy rate is.

Chapter 6 concludes the report summary of the finding obtained from the whole FYP project. The conclusion on work experience and work effort done to meet the requirement on this project development is discussed. The future work on improve this project and recommendation on new title research that similar with the project also been suggest here.

## REFERENCE

A.Conci, J. E. R. de Carvalho, T. W. Rauber, 2009," A Complete System for Vehicle Plate Localization, Segmentation and Recognition in Real Life Scene", Latin America Transactions, IEEE (Revista IEEE America Latina), IEEE, 497-506

Abbas M. Al-Ghaili, Syamsiah Mashohor, Abdul Rahman Ramli, Alyani Ismail, 2012," Vertical-Edge-Based Car-License-Plate Detection Method", Vehicular Technology, IEEE Transactions, 26-38

Abbas Mohd Al-Ghaili, Syamsiah Mashohor, Alyani Ismail, Abdul Rahman Ramli, 2009," Efficient Implementation of VEDA for Highlighting Car License Plate Details", Future Computer and Communication, 2009. ICFCC 2009. International Conference, 460 464

Abdul Mutholib, Teddy Surya Gunawan, Mira Kartiwi, 2012," Design and Implementation of Automatic Number Plate Recognition on Android Platform", Computer and Communication Engineering (ICCCE), 2012 International Conference, 540-543

Ashkan Tashk, MohammdSadegh Helfroush, 2012," An Automatic Traffic Control System based on Simultaneous Persian License Plate Recognition and Driver Fingerprint Identification", Telecommunications Forum (TELFOR), 2012 20th, 1729 1732
B.L.Lim, Wenzheng. Yeo, K. Y. Tan, C. Y. Teo, 1998," A Novel DSP based Real-time Character Classification and Recognition Algorithm For Car Plate Detection and Recognition", Signal Processing Proceedings, 1998. ICSP '98. 1998 Fourth International Conference, 1269-1272 vol. 2

Bei CHEN, Wenlun CAO, Hongcai ZHANG, 2008," An Efficient Algorithm on Vehicle License Plate Location", Automation and Logistics, 2008. ICAL 2008. IEEE International Conference, 1386-1389
C.Nelson Kennedy Babu, 2008," A License Plate Localization using Morphology and Recognition", India Conference, 2008. INDICON 2008. Annual IEEE, 34 - 39

Chu Duc Nguyen, Mohsen Ardabilian, Liming Chen, 2009," Robust Car License Plate Localization using a Novel Texture Descriptor", Advanced Video and Signal Based Surveillance, 2009. AVSS '09. Sixth IEEE International Conference, IEEE, 523 - 528

Da-shan, Gao Jie Zhou, 2000," Car License Plates Detection from Complex Scene", Signal Processing Proceedings, 2000. WCCC-ICSP 2000. 5th International Conference on (Volume: 2), IEEE, 1409-1414 vol. 2

David Santos, Paulo Lobato Correia, 2009," Car Recognition Based On Back Lights And Rear View Features", Image Analysis for Multimedia Interactive Services, 2009. WIAMIS '09. 10th Workshop, IEEE, 137 - 140

Dening Jiang, Tulu Muluneh Mekonnen, Tiruneh Embiale Merkebu, Ashenafi Gebrehiwot, 2012," Car Plate Recognition System", Intelligent Networks and Intelligent Systems (ICINIS), 2012 Fifth International Conference, 9 - 12

Dong-Su Kim, Sung-I1 Chien, 2000," Automatic Car License Plate Extraction Using Modified Generalized Symmetry Transform and Image Warping", Industrial Electronics, 2001. Proceedings. ISIE 2001. IEEE International Symposium, 2022-2027 vol. 3

Eun Ryung Lee, Pyeoung Kee Kim, Hang Joon Kim, 1994," Automatic Recognition Of A Car License Plate UsIng Color Image Processing", Image Processing, 1994. Proceedings. ICIP-94., IEEE International Conference (Volume: 2), 301-305

Gisu Heo, Minwoo Kim, Insook Jung, Duk-Ryong Lee, Il-Seok Oh, 2007," Extraction of Car License Plate Regions Using Line Grouping and Edge Density Methods", 37-42

Hua-Chun Tan, Hao Chen, 2008," Adaptive Binarization Method", Machine Learning and Cybernetics, 2008 International Conference, 4034 - 4039

Hwajeong Lee, Daehwan Kim, Daijin Kim, Sung Yang Bang, 2003," Real-Time Automatic Vehicle Management System Using Vehicle Tracking and Car Plate Number Identification", Multimedia and Expo, 2003. ICME '03. Proceedings. 2003 International Conference on (Volume: 2), II - 353- II - 356 vol. 2
J.A.G. Nijhuis, M.H. ter Brugge, K.A. Helmholt, J.P.W. Pluim, L. Spaanenburg, R.S. Venema, M.A. Westenberg, 1995," Car License Plate Recognition with Neural Networks and Fuzzy Logic", Neural Networks, 1995. Proceedings, IEEE International Conference on (Volume: 5), 2232-2236 vol. 5
J.G. PARK, 2010," An Intelligent Framework of Illumination Effects Elimination for Car License Plate Character Segmentation", Machine Learning and Cybernetics (ICMLC), 2010 International Conference, 1268-1272
J.M. Lopez, J. Gonzalez, J.Cabello, C. Galindo, 2007," A Versatile Low-Cost Car Plate Recognition System", Signal Processing and Its Applications, 2007. ISSPA 2007. 9th International Symposium, 1-4

Jian-Feng Xu, Shao-Fa Li, Mian-Shui Uu, 2004," Car License Plate Extraction Using Color and Edge Information", Machine Learning and Cybernetics, 2004. Proceedings of 2004 International Conference, 3904-3907 vol. 6

Jun Ren SU, Zheng MA, 2009," Car license plate location based on the density and projection", Computational Intelligence and Natural Computing, 2009. CINC '09. International Conference, 409-412
K.K.Kim, K.I.Kim, J.B.Kim, H. J.Kim, 2000," LEARNING-BASED APPROACH FOR LICENSE PLATE RECOGNITION", Neural Networks for Signal Processing X, 2000. Proceedings of the 2000 IEEE Signal Processing Society Workshop (Volume: 2), 614623

Kaisheng Zhang, Wei Tang, Huabiao Wei, Rongyan Shi, 2010," Study on The Identification System of Car License Plate Based on Imbedded Computer System", Education Technology and Computer (ICETC), 2010 2nd International Conference, V1-146-V1-14

Kanabadee Srisomboon, Preecha Thongdit, Wilaiporn Lee, Vorapoj Patanavijit, 2013," Fast Image Restoration Technique for Car License Plate Based on PWS filter Using 2DPCA Algorithm", Knowledge and Smart Technology (KST), 2013 5th International Conference, 156-161

Kazuhiko Taniyama, Kentaro Hayashi, 2012," Robust Car License Plate Recognition System Verified with 163,574 Images Captured in Fields", Pattern Recognition (ICPR), 2012 21st International Conference, 1273-1276

Ke-Quan Lin, Guo-Qiang Han, Yan Wo, Li-Xuan Zheng, Hao-Wei Yao, 2010," MultiClassifier for Car Plate Character Recognition", Wireless Communications Networking and Mobile Computing (WiCOM), 2010 6th International Conference, 1 - 4

Lianwen JIN, JianZhao QIN, 2003, "Car Plate Number Characters Recognition Using Gabor Orientation Features and Neural Networks", 1628-1631

Luis Salgado, Jose' M. Mene'ndex, Enrique Renddn, Narciso Garcia, 1999," Automatic Car Plate Detection and Recognition through Intelligent Vision Engineering", Security Technology, 1999. Proceedings. IEEE 33rd Annual 1999 International Carnahan Conference, 71-76

Mark J.L. Orr, 1996," Introduction to Radial Basic Function Network", Edinburgh EH89LW, Scotland, 1-67
M. Zayed, J. Boonaert, M. Bayart, 2004," License plate tracking for car following with a single camera", Intelligent Transportation Systems, 2004. Proceedings. The 7th International IEEE Conference, 719-724

Mario I. Chacon M., Alejandro Zimmerman S, 2003," License Plate Location Based on a Dynamic PCNN Scheme", Neural Networks, 2003. Proceedings of the International Joint Conference, 1195-1200 vol. 2

MengZe Zheng, QingYu Liu, 2010," Application of LVQ Neural Network to Car License Plate Recognition", Intelligent Systems and Knowledge Engineering (ISKE), 2010 International Conference, 287-290

Michael Raus, Lothar Kreft, 1996," Reading Car License Plates By The Use Of Artificial Neural Networks", Circuits and Systems, 1995., Proceedings., Proceedings of the 38th Midwest Symposium (Volume:1), 538-541

Ming G. He, Alan L. Harvey, Paul Danelutti, 1996," Car Number Plate Detection with Edge Image Improvement", Signal Processing and Its Applications, 1996. ISSPA 96, Fourth International Symposium (Volume: 2), 597-600

Mtn Fang, Chaojun Liang, Xiaoxia Zhao, 2004," Neural Network for the Car's Plate Character Recognition", Intelligent Control and Automation, 2004. WCICA 2004. Fifth World Congress, 4037-4040 Vol. 5
N. Zimic, J. Ficzko, M. Mraz, J. Virant, 1997," The Fuzzy Logic Approach to the Car Numlber Plate Locating Problem", Intelligent Information Systems, 1997. IIS '97. Proceedings, 227-230

Nor Amizam Jusoh, Dr. Jasni Md Zain, Tuty Asmawaty Abd Kadir, 2007," Enhancing Thinning Method for Malaysian Car Plates Recognition", Innovative Computing, Information and Control, 2007. ICICIC '07. Second International Conference, 378

Nozomu Araki, Takao Sato, Yasuo Konishi, Hiroyuki Ishigaki, 2010," Orientation Measurement Method for a Car Using its License Plate Image", SICE Annual Conference 2010, Proceedings, 3614 - 3615
P. Sa-ngamuang, C. Thamnittasana, T. Kondo, 2007," Thai Car License Plate Recognition Using Essential-Elements-Based Method", Communications, 2007. APCC 2007. Asia-Pacific Conference, 41-44
P. V. Suryanarayana, Suman K. Mitra, Asim Baneree, Anil K. Roy, 2005," A Morphology Based Approach for Car License Plate Extraction", INDICON, 2005 Annual IEEE, 24 27

Pan Xiang, Ye Xiuzi, Zhang Sanyuan, 2004," A Hybrid Method for Robust Car Plate Character Recognition", Systems, Man and Cybernetics, 2004 IEEE International Conference, 4733-4737 vol. 5

Pei-Chen Tseng, Jiun-kuei shiung, Chun-Ting Huang, Shih-Mine Guo, Wen-Shyang Hwang, 2008," Adaptive Car Plate Recognition in QoS-aware Security Network", Secure System Integration and Reliability Improvement, 2008. SSIRI '08. Second International Conference, 120-127

Petr Pata, Milos Klima, 2003," Efficient Method for Security Image Data Compression", Security Technology, 2003. Proceedings. IEEE 37th Annual 2003 International Carnahan Conference, 456-459

Preemon Rattanathammawat, Thanarat H. Chalidabhongse, 2006, "A Car Plate Detector using Edge Information", Communications and Information Technologies, 2006. ISCIT '06. International Symposium, 1039-1043

Pu Han, We1 Han, Dong-Feng Wang, Yong-Jie Zhai, 2003," Car License Plate Feature Extraction and Recognition Based On Multi-Stage Classifier", Machine Learning and Cybernetics, 2003 International Conference, 128-132 Vol. 1

Qiang Wu, Huaifeng Zhang, Wenjing Jia, Xiangjian He, Jie Yang, Tom Hintz, 2006," Car Plate Detection Using Cascaded Tree-Style Learner Based on Hybrid Object

Features", Video and Signal Based Surveillance, 2006. AVSS '06. IEEE International Conference, 15
"Radial Basis Function Network" Retrieved from http://reference.wolfram.com/applications/neuralnetworks/NeuralNetworkTheory/2.5. 2.html
R.Mullot, C. Olivier, J.L. Bourdon, P. Courtellemon, J. Labiche, Y. Lecourtier, 1991," Automatic extraction Methods of container Identity Numbers and registration Plates of Cars", Industrial Electronics, Control and Instrumentation, 1991. Proceedings. IECON '91, 1991 International Conference, 1739-1744
R.Parisi, E.D.Di Claudio, G.Lucarelli, G.Orlandi, 1998," Car Plate Recognition by Neural Networks And Image Processing", Circuits and Systems, 1998. ISCAS '98. Proceedings of the 1998 IEEE International Symposium, 195-198 vol. 3

Ratree Juntanasub, Nidapan Sureerattanan, 2005," Car License Plate Recognition through Hausdorff Distance Technique", Tools with Artificial Intelligence, 2005. ICTAI 05. 17th IEEE International Conference, 647-651

Ruliang Zhang, Yun Zhang, 2009," Car Number Plate Detection Using Multi-layer Weak Filter", Business Intelligence and Financial Engineering, 2009. BIFE '09. International Conference, 228-232
S. Setumin, M. I. F. Maruzuki, S. N. Ishak, 2011," Ruled-Based and Stroke Composition Technique for Efficient License Plate Recognition", Computer Applications and Industrial Electronics (ICCAIE), 2011 IEEE International Conference, 335 - 340
S. Setumin, U U Sheikh, S.A.R Abu-Bakar, 2010," Character-Based Car Plate Detection And Localization", Information Sciences Signal Processing and their Applications (ISSPA), 2010 10th International Conference, 737 - 740
S. Setumin, U.U. Sheikh, S.A.R Abu-Bakar, 2010," Car Plate Character Extraction and Recognition Using Stroke Analysis", Signal-Image Technology and Internet-Based Systems (SITIS), 2010 Sixth International Conference, 30-34
S.H. Park, K.I. Kim, K. Jung, H.J. Kim, 1999," Locating car license plates using neural networks", Electronics Letters (Volume: 35, Issue: 17), 1475-1477

Shahrul Nizam Ishak, Mohd Ikmal Fitri Maruzuki, Samsul Setumin, 2012," Malaysia Car Plate Recognition Based on RBF Neural Network and Particle Swarm Optimization", Control System, Computing and Engineering (ICCSCE), 2012 IEEE International Conference, 511-514

Shan Du, Mahmoud Ibrahim, Mohamed Shehata, Wael Badawy, 2012," Automatic License Plate Recognition (ALPR): A State-of-the-Art Review", Circuits and Systems for Video Technology, IEEE Transactions, 311-325

Shokri Gendy, Clifton L. Smith, Stefan Lachowicz, 1997," Automatic Car Registration Plate Recognition Using Fast Hough Transform", Security Technology, 1997. Proceedings. The Institute of Electrical and Electronics Engineers 31st Annual 1997 International Carnahan Conference, 209-218

Shuxian Lu, Zhengxi Liu, Yantao Chen, Lin Liu, 2008," AWHD for License Plate Character", Embedded Software and Systems Symposia, 2008. ICESS Symposia '08. International Conference, 60-62

Siti Salwa Md Noor, Nooritawati Md Tahir, 2010," Car Plate Recognition based on UMACE Filter", Computer Applications and Industrial Electronics (ICCAIE), 2010 International Conference, 655-658

Song Huansheng, Wang Guoqiang, 2005," The High Performance Car License Plate Recognition System and its Core Techniques", Vehicular Electronics and Safety, 2005. IEEE International Conference, 42-45

Thanongsak, Sirithinaphong, Kosin Chamnongthai, 1998," Extracting Of Car License Plate Using Motor Vehicle Regulation And Character Pattern Recognition", Circuits and Systems, 1998. IEEE APCCAS 1998. The 1998 IEEE Asia-Pacific Conference, 559-562

Thanongsak Sirithinaphong, Kosin Chamnongthai, 1999," The Recognition Of Car License Plate For Automatic Parking System", Signal Processing and Its Applications, 1999. ISSPA '99. Proceedings of the Fifth International Symposium, 455-457 vol. 1

Vahid Abolghasemi, Alireza Ahmadyfard, 2007," Improved Image Enhancement Method for License Plate Detection", Digital Signal Processing, 2007 15th International Conference, 435-438

WANG Cheng, LI Shao-Fa, 2008, "An Adaptive Method of Car Plate Image Enhancement Based on a Simplified Pulse Coupled Neural Network", Computer Science and Computational Technology, 2008. ISCSCT '08. International Symposium, 277 279

Wei Wang, Qiaojing Jiang, Xi Zhou, Wenyin Wan, 2011," Car License Plate Detection Based on MSER", Consumer Electronics, Communications and Networks (CECNet), 2011 International Conference, 3973 - 3976

Weijuan Wen, Xianglin Huang, Lifang Yang, Zhao Yang, Pengju Zhang, 2009," The Vehicle License Plate Location Method Based-on Wavelet Transform", Computational Sciences and Optimization, 2009. CSO 2009. International Joint Conference, 381 - 384

Xianmin Wei, 2010," Method of Blue-White Car Plate Locating", Geoscience and Remote Sensing (IITA-GRS), 2010 Second IITA International Conference, 438-440

Xiaohai He, Daishen Luo, Wei Wu, 2004," A New Car Plate Recognition Method Based on Fuzzy Entropy", Intelligent Control and Automation, 2004. WCICA 2004. Fifth World Congress, 4054-4056 Vol. 5

Xiaoli Yang, Guang-da Su, Jiansheng Chen, Yiu-sang Moon, 2010," Restoration Of Low Resolution Car Plate Images Using Pca Based Image Super-Resolution", Image Processing (ICIP), 2010 17th IEEE International Conference, 2789-2792

Xiaoping Li, Jianqiang Xu, 2010," Research and Application of a New Thinning Algorithm in Car Plate Recognition System", New Trends in Information Science and Service Science (NISS), 2010 4th International Conference, 379-382

Xiaoping Li, Jinghui Chen, Yinxiang Li, Xiaoxing Lv, Jianqiang Xu, 2010," Application of a New Improved Image Segmentation Algorithm in Car Plate Recognition", New Trends in Information Science and Service Science (NISS), 2010 4th International Conference, 383-385

XIONG Jun, DW Sidan, GAO Duntang, SHEN Qinhong, 2004," Locating Car License Plate Under Various Illumination Conditions Using Genetic Algorithm", Signal Processing, 2004. Proceedings. ICSP '04. 2004 7th International Conference, 2502 2505 vol. 3

Xu Jianfeng, Li Shaofa, Chen Zhibin, 2003," Color Analysis for Chinese Car Plate Recognition", Robotics, Intelligent Systems and Signal Processing, 2003. Proceedings. 2003 IEEE International Conference, 1312-1316 vol. 2

Yue CHENG, Jiaiuning LU, Takashi YAHAGI, 2004," Car License Plate Recognition Based on the Combination of Principal Components Analysis and Radial Basis Function Network", Signal Processing, 2004. Proceedings. ICSP '04. 2004 7th International Conference, 1455-1458 vol. 2

Zhang Sanyuan, Zhang Mingti, Ye Riuzi, 2004," Car plate character extraction under complicated environment", Systems, Man and Cybernetics, 2004 IEEE International Conference, 4722-4726 vol. 5

ZHU You-qing, LI Cui-hua, 2010," A Recognition Method of Car License Plate Characters Based on Template Matching Using Modified Hausdorff Distance", Computer, Mechatronics, Control and Electronic Engineering (CMCE), 2010 International Conference, 25-28

Zongyong Cui, Mei Xie, 2009," A Method for Blue Background White Characters Car License Plate Location", Computer Science and Information Technology, 2009. ICCSIT 2009. 2nd IEEE International Conference, 393-395

Jing Li, Ji-hang Cheng,Jing-yuan Shi and Fei Huang, 2012,"Brief Introduction of Back Propagation (BP) Neural Network Algorithm and Its Improvement", D.Jin and S.Linn(Eds): Advances in CSIE, Vol. 2 ,AISC 169, pp.553-558

