# DETERMINATION OF RIPENESS OF PALM FRUITS (FFB)

Mathuranayagam Hephzibah Culas

168212V

Degree of Master of Science

Department of Computer Science and Engineering

University of Moratuwa

Sri Lanka

April 2019

## DETERMINATION OF RIPENESS OF PALM FRUITS (FFB)

## Mathuranayagam Hephzibah Culas

168212V

This dissertation submitted in partial fulfillment of therequirements for the Degree

Master of Science in Computer Science

Department of Computer Science and Engineering

University of Moratuwa

Sri Lanka

April 2019

## **DECLARATION**

I declare that this is my own work and this dissertation does not incorporate without acknowledgement any material previously submitted for a Degree or Diploma in any other University or institute of higher learning and to the best of my knowledge and belief it does not contain any material previously published or written by another person except where the acknowledgement is made in the text.

Also, I hereby grant to University of Moratuwa the non-exclusive right to reproduce and distribute my thesis, in whole or in part in print, electronic or other medium. I retain the right to use this content in whole or part in future works.

Candidate:	
Mathuranayagam Hephzibah Culas	Date
Supervisor:	
The above candidate has carried ou supervision.	t research for the Masters thesis under my
Dr. Chathura De Silva	Date

#### **ABSTRACT**

Demand for palm oil is increasing rapidly. Ripeness of the Fresh Fruit Bunches (FFB) plays a vital role in determining the quality of the CPO and oil content in the fruits. Therefore FFBs should be placed under suitable category for processing of oil in the mills. Categorizing the palm bunches according to their ripeness is the most critical step of the mill grading process. A common method of determining the ripeness of palm fruit is by visual inspection of the palm bunches by experienced individuals for which the colour of the fruit and amount of lose fruits become the main attribute. Changes of colour indicate the stages of ripeness. Categorizing the palm fruit bunches according to their ripeness by manual inspection is tedious, inconsistent, time consuming and inaccurate. This research focuses on a solution to the palm oil industry for this problem, based on image processing which will increase the quality of the oil and speed up the grading process, by the result of automating the mill grading process. The solution focuses on categorizing the palm bunches into three groups namely; under-ripped, ripped and over-ripped.

#### **ACKNOWLEDGEMENTS**

It is a pleasure to express my deepest thanks to my project supervisor, Dr. Chathura De Silva, for his priceless guiding and support given by sharing his knowledge, research materials, advices, supervision and useful suggestions throughout this research work. His expertise and continuous guidance enabled me to complete my work successfully.

I am grateful for the support, guidance and advice given throughout by my co-supervisor Dr. Indika Perera.

I would like to express my sincere gratitude to my husband, parents and family for their love and support throughout my life and support given to complete my MSc. Finally, I wish to express my gratitude to all my colleagues at Goodhope, for the support given to me to manage and complete my research work successfully.

## TABLE OF CONTENTS

CHAPT	ER 1 INTRODUCTION	1
1.1	Classification of Palm Bunches	3
1.2	Research Problem	7
1.3	Objectives	7
CHAPT	ER 2 LITERATURE REVIEW	8
2.1	Colour detection	9
2.2	Image segmentation	9
2.3	Research Studies done and their results	. 10
CHAPT	ER 3 METHODOLOGY	. 17
3.1	Proposed Solution	. 18
CHAPT	ER 4 SOLUTION ARCHITECTURE	. 19
CHAPT	ER 5 SYSTEM EVALUATION (DATA AND ANALYSIS)	. 26
5.1	Color-Based Segmentation Using K-Means Clustering	. 27
5.1	.1 Test Data For Ripe FFB	. 27
5.1	.2 Test Data For Under Ripe FFB.	. 29
5.1	.3 Test Data For Over Ripe FFB	. 31
5.1	.4 Comparisons And Analysis	. 33
5.2	Identification of Maximum Peaks	. 34
5.2	.1 Test Data For Ripe FFB	. 34
5.2	.2 Test Data For Under Ripe FFB	. 35
5.2	.3 Test Data For Over Ripe FFB	. 36
5.2	.4 Comparisons And Analysis	. 37
5.3	Finding The Largest Object Area	. 38
5.3	.1 Test Data For Under Ripe FFB	. 38
5.3	.2 Test Data For Over Ripe FFB	. 39
5.3	.3 Comparisons And Analysis	. 40
5.4	The FFB Ripeness Classifier	. 42
5.5	Test Results Analysis	. 43
DEFEDI	ENCES	16

## LIST OF FIGURES

Figure 1: Ripe bunch	3
Figure 2: Unripe bunch	4
Figure 3: Over ripe bunch	4
Figure 4: Under ripe bunches	5
Figure 5: Dirty bunch	6
Figure 6: Empty bunch	6
Figure 7: Image segmentation of FFB	9
Figure 8: Red intensity of each category	13
Figure 9: Mean of red component for each category	13
Figure 10: Portable device	14
Figure 11: GUI for FFB grading system	16
Figure 12: High level diagram of proposed solution	18
Figure 13: The process of FFB classification	20
Figure 14: Loaded image in Matlab	21
Figure 15: Binarized image	22
Figure 16: Inverse binary image	22
Figure 17: Gaps removed image	23
Figure 18: Different segments of image 1	23
Figure 19: Different segments of image 2	23
Figure 20: Histogram - red pixels in image 1	23
Figure 21: Histogram - red pixels in image 2	23
Figure 22: Histogram - green pixels in image 1	23
Figure 23: Histogram - green pixels in image 2	23
Figure 24: Histogram - blue pixels in image 1	23
Figure 25: Histogram - blue pixels in image 2	23
Figure 26: Different segments of image 1	23
Figure 27: Different segments of image 2	23
Figure 28: Histogram - red pixels in image 1	30
Figure 29: Histogram - red pixels in image 2	30
Figure 30: Histogram - green nixels in image 1	30

Figure 31: Histogram - green pixels in image 2	30
Figure 32: Histogram - blue pixels in image 1	30
Figure 33: Histogram - blue pixels in image 2	30
Figure 34: Different segments of image 1	31
Figure 35: Different segments of image 2	31
Figure 36: Histogram - red pixels in image 1	32
Figure 37: Histogram - red pixels in image 2	32
Figure 38: Histogram - green pixels in image 1	32
Figure 39: Histogram - green pixels in image 2	32
Figure 40: Histogram - blue pixels in image 1	32
Figure 41: Histogram - blue pixels in image 2	32
Figure 42: Maximum peaks in RGB planes – Ripe category	34
Figure 43: Maximum peaks in RGB planes – Under ripe category	35
Figure 44: Maximum peaks in RGB planes – Over ripe category	36
Figure 45: Extracting biggest blob – Under ripe category	38
Figure 46: Extracting biggest blob – Over ripe category	39

### LIST OF ABBREVIATIONS

ANN – Artificial Neural Network

DN – Digital Numbers

FFB – Fresh Fruit Bunches

GUI – Graphical User Interface

NIR – Near Infra-Red

PCA – Principal Component Analysis

CPO – Crude Palm Oil

Ha – Hectare

MATLAB – Matrix Laboratory

MPOB – Malaysian Palm Oil Board