



***INTEGRATION OF PRECISION AGRICULTURE STRATEGIES TO
IMPROVE COCOA PRODUCTIVITY AND QUALITY***

TEE YEI KHENG

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**INTEGRATION OF PRECISION AGRICULTURE STRATEGIES TO
IMPROVE COCOA PRODUCTIVITY AND QUALITY**

By

TEE YEI KHENG

**Thesis Submitted to the School of Graduate Studies,
University Putra Malaysia in Fulfilment of the
Requirement for the Degree of Doctor of Philosophy**

November 2019

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Abstract of thesis presented to the Senate of University Putra Malaysia in fulfilment of the requirement for the degree of Doctor of Philosophy

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By

TEE YEI KHENG

November 2019

Chair : Siva Kumar Balasundram, PhD
Faculty : Agriculture

Cocoa industry faces challenges such as high input costs and low cocoa productivity despite pest and disease problem. Currently, cocoa is managed conventionally using labour in farm management, however, more effective production systems need to be identified to increase competitiveness of cocoa supply chain and to sustain high demand in the grinding industry. Thus, precision strategies are built upon modern system approaches which aim to transform the cocoa production system towards low input, high efficiency and sustainable cocoa production. So far, there is no research focus on applying precision technology in the cocoa production chain in Malaysia. In this research, the studies were designed at three different stages of cocoa production system, from young cocoa seedlings at the nursery to mature cocoa trees and finally cocoa bean quality, targeting the issues faced by the cocoa industry at each of the production stages through precision cocoa management. Remote sensing was applied to determine the reflectance in young cocoa seedlings subjected to N and K deficiency and the study was supported with physical (height, girth and leaf area) and physiological (plant net photosynthesis, transpiration rate and chlorophyll content) data as plants developed. A total of 72 grafted cocoa seedlings with clone MCBC10 were planted in the greenhouse. The seedlings were six months old after sowing with three treatments (T1: complete nutrients of nitrogen, phosphorus and potassium; T2: nitrogen deficiency; T3: potassium deficiency) arranged in a randomized complete block design. From this study, hyperspectral reflectance showed that plants with nutrient deficiency had higher reflectance at the visible range of 550 nm while plants with complete fertilizers achieved the highest peak of reflectance in the near-infrared 700-2500 nm ranges. Cocoa seedlings with nitrogen and potassium deficiency showed a shift in the red edge with greater reflectance at 675-750 nm. Nitrogen deficiency had the most pronounced effects on growth, net photosynthesis, transpiration rate and chlorophyll content at young cocoa seedlings. The output of the study was able to detect seedlings with nutrient deficiency at early stages in order to ensure seedlings planted by the smallholders are in healthy condition. A multivariate geospatial approach was used to quantify the spatial and temporal variability of soil properties, cocoa pod borer infestation rate and cocoa fresh bean weight at two different commercial planting

systems of mature cocoa. From the study, precision cocoa farm management helped to increase crop yield by 58.8 and 51.1% at cocoa-gliciridia and cocoa-coconut, respectively, might be due to the effective pest control in the critical zone and site-specific fertilization, especially during high peak harvesting season of cocoa. During harvesting, bean quality is an important factor that influences for higher pricing and the quality is affected by the maturity stages during harvesting. Hence, this study was carried out to determine the optimum harvest period for cocoa using a non-destructive method of multi-parametric sensor. From this study, flavonol accumulated as cacao pods developed, however, chlorophyll and nitrogen balance index declined as pods reached maturity at four months after pod emergence. Post-harvest bean quality tests indicated that pods harvested at the mature stage of four months after pod emergence met the standards certified by the Malaysian Standard and the bean quality is as good as beans harvested at the ripe stage of five months after pod emergence.



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PENERAPAN STRATEGI PERTANIAN PERSIS DALAM PENINGKATAN PRODUKTIVITI DAN KUALITI KOKO

Oleh

TEE YEI KHENG

November 2019

Pengerusi : Siva Kumar Balasundram, PhD
Fakulti : Pertanian

Industri koko menghadapi pelbagai cabaran seperti kos input pertanian yang tinggi dan produktiviti koko yang rendah selain serangan serangga dan penyakit. Sehingga hari ini, koko masih diurus menggunakan cara konvensional dengan menggunakan sumber tenaga buruh dalam pengurusan aktiviti ladang koko. Akan tetapi, satu sistem yang lebih efektif perlu dikenalpasti supaya dapat meningkatkan persaingan dalam rangkaian sektor pengeluaran koko bagi memastikan kelestarian permintaan koko yang tinggi dalam industri hiliran koko. Oleh itu, strategi persis telah dibina atas sistem pengeluaran moden yang bertujuan untuk mengubah sistem pengeluaran koko ke arah input kos rendah, tahap efisien yang tinggi serta pengeluaran koko yang lestari. Setakat ini, tiada kajian yang fokus kepada aplikasi teknologi persis dalam pengeluaran koko di Malaysia. Pada peringkat muda anak benih koko, makro-nutrien seperti nitrogen dan potasium merupakan elemen yang akan mempengaruhi pertumbuhan, penampilan dan yang paling penting adalah hasil tanaman koko selepas anak benih tersebut ditanam di ladang. Walaubagaimanapun, simptom kekurangan makro-nutrien yang ditunjukkan melalui fizikal anak benih adalah lambat dan analisis nutrien mengambil masa yang panjang. Oleh itu, objektif kajian ini adalah untuk mengesan perubahan pada spektrum pancar, pertumbuhan pokok dan ciri-ciri fisiologi antara pokok koko yang diberikan nutrien lengkap dan pokok koko yang mengalami kekurangan nutrien yang spesifik seperti nitrogen dan potasium. Anak benih tersebut berumur enam bulan selepas biji koko disemai dengan aplikasi tiga rawatan (T1: nutrien lengkap dengan nitrogen, fosforus dan potasium; T2: kekurangan nitrogen; T3: kekurangan potasium) di mana anak benih koko disusun dalam rekabentuk blok secara rawak. Melalui kajian ini, refleksi '*hyperspectral*' menunjukkan pokok yang mengalami kekurangan nutrien mempunyai bacaan spektrum pancar yang lebih tinggi pada lingkungan spektrum 550 nm manakala pokok koko dengan nutrien lengkap mempunyai spektrum pancar yang tinggi pada inframerah dalam lingkungan 700–2500 nm. Pokok yang mengalami kekurangan nitrogen mempunyai kesan yang ketara pada pertumbuhan pokok, fotosintesis, kadar transpirasi dan kandungan klorofil pada anak benih koko. Seterusnya, satu pendekatan menggunakan '*geospatial*' untuk menganalisa variasi '*spatial*' dan '*temporal*' telah dijalankan dengan tumpuan kajian pada ciri-ciri tanah,

tahap serangan ulat pengorek buah koko dan hasil berat basah koko pada dua sistem tanaman komersil koko dengan tanaman pokok koko matang. Hasil kajian menunjukkan pengurusan persis koko telah meningkatkan hasil koko sebanyak 58.8% dan 51.1% bagi plot koko-gliciridia dan koko-kelapa masing-masing. Semasa aktiviti penuaian, kualiti biji koko merupakan satu faktor penting untuk mendapatkan harga yang tinggi dan kualiti biji koko dipengaruhi oleh tahap kematangan buah semasa penuaian. Daripada kajian ini, flavonol berkumpul semasa tumbesaran buah koko, akan tetapi, kandungan klorofil dan '*nitrogen balance index*' menurun semasa buah koko mencapai kematangan pada empat bulan selepas pembentukan buah. Ujian biji koko lepas tuai menunjukkan buah yang dituai pada tahap kematangan empat bulan selepas pembentukan buah telah mencapai piawaian pensijilan sebagaimana yang ditentukan di dalam Piawaian Malaysia. Manakala kualiti biji koko yang dituai sebulan lebih awal adalah sama kualiti dengan biji koko yang dituai pada peringkat cukup masak, iaitu lima bulan selepas penghasilan buah.

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I certify that a Thesis Examination Committee has met on 21 November 2019 to conduct the final examination of Tee Yei Kheng on her thesis entitled "Integration of Precision Agriculture Strategies to Improve Cocoa Productivity and Quality" in accordance with the Universities and University Colleges Act 1971 and the Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the Doctor of Philosophy.

Members of the Thesis Examination Committee were as follows:

Christopher Teh Boon Sung, PhD

Associate Professor
Faculty of Agriculture
Universiti Putra Malaysia
(Chairman)

Osumanu Haruna Ahmed, PhD

Professor
Faculty of Agriculture and Food Science
Universiti Putra Malaysia
(Internal Examiner)

Helmi Zulhaidi Mohd Shafri, PhD

Associate Professor
Faculty of Engineering
Universiti Putra Malaysia
(Internal Examiner)

Viacheslav I. Adamchuk, PhD

Associate Professor
Faculty of Agriculture and Environmental Sciences
McGill University
(External Examiner)

**ZURIATI AHMAD ZUKARNAIN,
PhD**

Professor and Deputy Dean
School of Graduate Studies
Universiti Putra Malaysia

Date:

This thesis was submitted to the Senate of Universiti Putra Malaysia and has been accepted as fulfilment of the requirement for the degree of Doctor of Philosophy. The members of the Supervisory Committee were as follows:

Siva Kumar Balasundram, PhD

Associate Professor
Faculty of Agriculture
Universiti Putra Malaysia
(Chairman)

Abdul Rashid Mohamed Shariff, PhD

Professor Sr Gs
Faculty of Engineering
Universiti Putra Malaysia
(Member)

Phebe Ding, PhD

Associate Professor
Faculty of Agriculture
Universiti Putra Malaysia
(Member)

ZALILAH MOHD SHARIFF, PhD

Professor and Deputy Dean
School of Graduate Studies
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Signature: _____
Name of
Chairman of
Supervisory
Committee: Assoc. Prof. Dr. Siva Kumar Balasundram

Signature: _____
Name of
Member of
Supervisory
Committee: Prof. Sr Gs Dr. Abdul Rashid Mohamed Shariff C. Eng.

Signature: _____
Name of
Member of
Supervisory
Committee: Assoc. Prof. Dr. Phebe Ding

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LIST OF ABBREVIATIONS

ANOVA	Analysis of variance
TE	Trace elements
NIR	Near-infrared
VNIR	Visible near infrared
SWIR	Short-wave infrared
PPFD	Photosynthetic photon flux density
VPD	Vapor pressure deficit
RCBD	Randomised complete block design
DMRT	Duncan's multiple range test
PSII	Photosystem II
CPB	Cocoa pod borer
MCB	Malaysian Cocoa Board
GNSS	Global positioning system
GIS	Geographical information system
ADSI	Average damage severity index
SCL	Sclerotic layer
ME	Mean error
MSE	Mean squared error
RMSSE	Root mean square standardized error
EDA	Exploratory data analysis
ESD	Extreme studentized deviate
RF	Red fluorescence
FRF	Far-red fluorescence
ANTH	Anthocyanin
FLAV	Flavonol
CHL	Chlorophyll
NBI	Nitrogen balance index
FB	Fully brown
PP	Partly purple
FP	Fully purple
UPLC	Ultra performance liquid chromatography
UV	Ultraviolet
CHS	Chalcone synthase
CHI	Chalcone isomerase
F3H	Flavanone-3-hydroxylase
FLS	Flavonol synthase
FI	Fermentation index

CHAPTER 1

INTRODUCTION

Cocoa (*Theobroma cacao* L.) is an understory forest species belonging to the family of Malvaceae which is planted extensively in Africa, America, Asia and Oceanic countries, including Indonesia, Malaysia and the Philippines. Cocoa beans are primarily processed to produce semi-finished products such as cocoa mass, butter, cakes and powder, which are used as ingredients in the manufacture of food, beverages and chocolates. With increasing demand of chocolates and cocoa semi-finished products, cocoa becomes the third major commodity in Malaysia after palm oil and rubber. Cocoa was introduced to Malaysia as a commercial crop in 1950 and was one of the crops for agricultural diversification in the Second Malaysia Plan (1971–1975). Cocoa has been cultivated extensively in Malaysia from 123,855 ha in 1980 to 414,236 ha in 1989 due to the unprecedented high cocoa prices (Lee 2013).

Unfortunately, the cocoa industry faces disconcerting scenarios with a tremendous decline in planted area from 393,465 ha in 1990 to 190,127 in 1995 and as of 2017, the cocoa planted area was reduced to 17,554 ha. Cocoa bean production declined from 250,000 tonnes in 1990 to 1,029 tonnes in 2017. However, there is an apparent uptrend in the cocoa grinding industry and is expected to grow further in future between 350,000 to 400,000 tonnes. It is believed that the major gap between the supply of low bean production and high demand of bean grinding is caused by poor world cocoa prices, severe infestation of cocoa pod borer (CPB), escalating production costs, labor constraints and competition of land use from oil palm cultivation (Lee et al. 2013).

As an industrial crop, cocoa trees can be planted in monoculture or intercropped with other economical crops such as coconut, durian, oil palm and rubber with favorable commodity prices to increase income of smallholders. Currently, cocoa is planted by smallholders on an average of one hectare of land and cocoa is managed conventionally using labor for manuring, pruning, weeding and harvesting. However, the aging smallholder population and labor constraints are causing the failure in well managed cocoa farms. In this aspect, efforts need to be focused in increasing cocoa productivity and maintaining high quality of cocoa beans with lower environmental impacts. For Malaysia to revitalize agricultural sectors, the government realizes the importance of creating a comprehensive overhaul in production agriculture by adopting smart farming or precision agriculture in order to move forward. Precision agriculture is believed to offer solutions to the problems faced by the cocoa industry.

Precision agriculture is a modern integrated technology that allows site- and time-specific agriculture practices. Application of precision agriculture in cocoa production is regarded as a game changer in the cocoa industry. The main targets of precision agriculture include cocoa productivity, labor constraints and sustainable green environment of cocoa planting. Technologies such as global positioning system (GNSS), geographical information system (GIS), proximal and remote sensing might be able to provide new levels of intelligent management for agriculture so as to

improve efficiency in crop and soil testing, fertilization, pest and disease control and harvesting efficiencies. Precision agriculture has been well adopted in developed economies such as United States of America, Canada and the European Union. A study by Lambert and Lowenberg-DeBoer (2000) confirmed that 63% of the farmers obtained profits and showed a payoff after adoption of precision agriculture. In the long run, farmers benefit from the precision farm management as cropping becomes more profitable. Maximized resource allocation based on optimal fruiting densities in the farm will save farmers money and labor, and eventually, increase product quality.

In 2016, the Malaysian government identified an opportunity to increase the competitiveness of Malaysian cocoa smallholders by targeting the challenges incurred along the cocoa production chain, from young cocoa seedling stage at the nursery to bean quality through precision technology under 11th Malaysian Plan (2016–2020). The five year program aimed transforming the cocoa upstream industry using various innovative approaches in cocoa field management and production system. The government believes that precision cocoa farm management has a strong potential to be scaled up in the future, and this study identified strategies in three key production stages of cocoa. In this context, precision agriculture should provide solutions to sustainable cocoa production. Questions that remain unanswered include; What caused the tremendous decline in cocoa planting area and bean production in Malaysia? What should be the most effective solution to increase cocoa productivity while conserving the ecological biodiversity in cocoa planting and thus, create sustainable development of cocoa production in Malaysia? In this study, it is crucial to scientifically validating the concept of adopting remote sensing and site-specific crop management to test the null hypothesis proposed in this study, i.e. uniform management or conventional methods are the optimal strategy to increase cocoa productivity and bean quality, considering variations are homogenous. While the alternative hypothesis is proposed if the variability can be identified and quantified using precision techniques with rapid and non-destructive methods to increase cocoa productivity and bean quality, then precision cocoa management can be employed in attempts to refute the proposed null hypothesis.

This dissertation shows how precision agriculture techniques can be applied at three production stages of cocoa; from young cocoa seedlings at the nursery to mature cocoa trees at the field and finally the cocoa beans harvested from the pods to improve the cocoa productivity and bean quality. The organizational of the thesis is as follows. Chapter 1 of the thesis comprised history and current scenario of cocoa industry in Malaysia, background of the challenges being faced by the industry, justifications on the reason to shift conventional to precision farming in cocoa management and objectives of the study. Chapter 2 provides literature review of the cocoa as one of the important commodities in Malaysia, existing technologies applied in the farm for cocoa sustainability and comparison between conventional and precision approach in field management. Methods carried out in each production system were outlined below to Chapter 3, 4 and 5 (Figure 1). Lastly, Chapter 6 presented the significant and summarized conclusions from each of the studies and recommendations of research for the future.

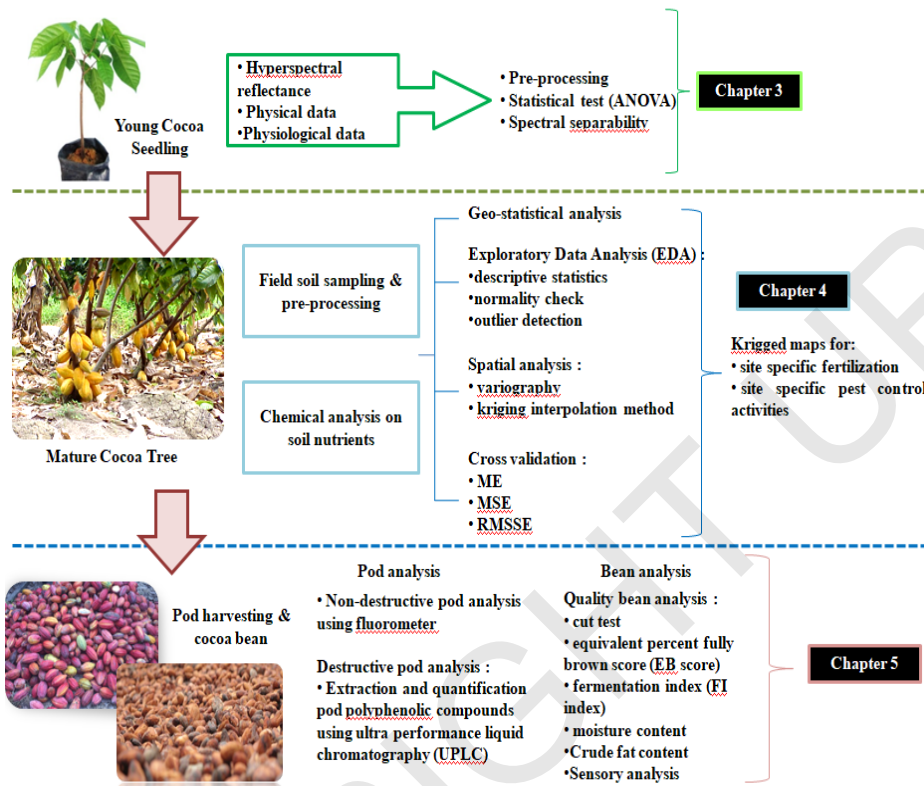


Figure 1: Organizational flow chart of the study

Overall, general objective of the study was to identify precision strategies that can be applied in three main production stages of cocoa with the aims to increase the cocoa productivity and bean quality. Thus, the specific objectives of this study were:

1. To quantify the spectral reflectance response of cocoa to different levels of nitrogen and potassium.
2. To quantify the spatial and temporal variability of soil nutrient, cocoa yield and cocoa pod borer (CPB) infestation under integration system of cocoa-gliciridia and cocoa-coconut.
3. To determine the optimum harvest period of commercial cocoa based on fluorescence indices during cocoa pod development.

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