

## การประมวลการชนบัตรออกใช้ใหม่



นางสาวนุยกริน ฤกษ์เมฆ

สถาบันวิทยบริการ  
อุทกศาสตร์มหาวิทยาลัย  
วิทยานิพนธ์นี้เป็นส่วนหนึ่งของการศึกษาตามหลักสูตรปริญญาวิศวกรรมศาสตรมหาบัณฑิต

สาขาวิชาการจัดการทางวิศวกรรม

ศูนย์ระดับภูมิภาคทางวิศวกรรมระบบการผลิต

บัณฑิตวิทยาลัย จุฬาลงกรณ์มหาวิทยาลัย

ปีการศึกษา 2540

ISBN 974-637-210-6

ลิขสิทธิ์ของบัณฑิตวิทยาลัย จุฬาลงกรณ์มหาวิทยาลัย

๓๐ พ.ค. 2544

I18028032

**FORECASTING OF NEW ISSUED BANKNOTES**

**Miss Busagarin Rurkhamet**

สถาบันวิทยบริการ  
จุฬาลงกรณ์มหาวิทยาลัย

A Thesis Submitted in Partial Fulfillment of the Requirements  
for the Degree of Master of Engineering in Engineering Management

Regional Centre for Manufacturing Systems Engineering

Graduate School

Chulalongkorn University

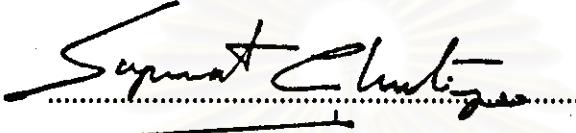
Academic Year 1997

ISBN 974-637-210-6

Thesis Title                    Forecasting of New Issued Banknotes  
By                            Ms.Busagarin Rurkhamet  
Programme                    Engineering Management  
Thesis Advisor                Assistant Professor Manop Reodecha, Ph.D.  
Thesis Co-advisor            Parames Chutima, Ph.D.

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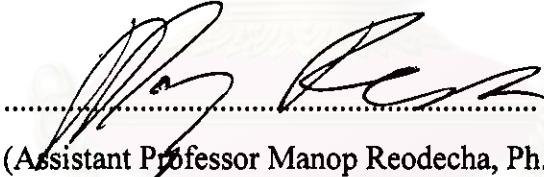
Accepted by the Graduate School, Chulalongkorn University in Partial  
Fulfillment of the Requirements for the Master's Degree

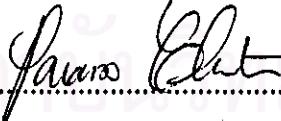
  
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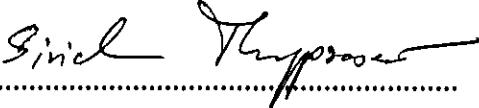
Dean of Graduate School

Thesis Committee

  
Chairman  
(Associate Professor Tatchai Sumitra, Dr.Ing.)

  
Thesis Advisor  
(Assistant Professor Manop Reodecha, Ph.D.)

  
Thesis Co-Advisor  
(Parames Chutima, Ph.D.)

  
Member  
(Professor Sirichan Thongprasert, Ph.D.)

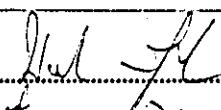
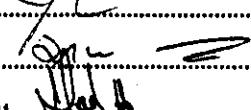
พิมพ์ด้นฉบับปกด้วยวิทยานิพนธ์ภายในกรอบสีเขียวนี้เพียงแผ่นเดียว

บุญกริน อุกขะเมธ : การประมาณการธนบัตรออกใช้ใหม่ (FORECASTING OF NEW ISSUED BANKNOTES) อ.ที่ปรึกษา : ผศ.ดร. นานพ เรี่ยวเดชะ, อ.ที่ปรึกษาร่วม : ดร.ปารเมศ ชุตินา, 212 หน้า. ISBN 974-637-210-6

วิทยานิพนธ์ฉบับนี้ได้นำเสนอเทคนิค Neural Network สำหรับการประมาณการธนบัตรออกใช้ใหม่ โดยพิจารณาเทคนิค Widrow-Hoff และ Backpropagation สำหรับประมาณการปี 1993-1996 โดยใช้ข้อมูลรายปีข้อนหลัง 12-15 ปีสำหรับการฝึกและทดสอบข้อมูล ผลการศึกษาพบว่าเทคนิค Backpropagation โดยมีพารามิเตอร์คือ อัตราการเรียนรู้ ( $10^{-1}$ - $1$ ) ของพิเศษลักษณะที่ต้องการ ( $10^{-2}$ - $10^{-1}$ ) และ sum-squared error ของข้อมูลที่ใช้ฝึก ( $9.30 \times 10^{-4}$ - $3.26 \times 10^{-3}$ ) ให้ผลการประมาณการใกล้เคียงกับข้อมูลจริงมากที่สุด และเมื่อนำผลลัพธ์ไปเปรียบเทียบกับเทคนิค Regression ซึ่งเป็นวิธีการที่ธนาคารแห่งประเทศไทยใช้ในปัจจุบัน เทคนิคนี้มีความแม่นยำมากกว่าวิธีปัจจุบันอย่างเห็นได้ชัด

## สถาบันวิทยบริการ จุฬาลงกรณ์มหาวิทยาลัย

ภาควิชา ศูนย์อุดมวิทยานิพนธ์  
สาขาวิชา การจัดการทางวิศวกรรม  
ปีการศึกษา ..... ๔๕.๔๐

ลายมือชื่อนิติบุคคล .....   
ลายมือชื่ออาจารย์ที่ปรึกษา .....   
ลายมือชื่ออาจารย์ที่ปรึกษาร่วม ..... 

พิมพ์ด้วยเครื่องถ่ายเอกสารโดยวิธีทางไฟฟ้า

# # 3972775221, MAJOR ENGINEERING MANAGEMENT  
KEY WORD: NEURAL NETWORK / BACKPROPAGATION

BUSAGARIN RURKHAMET: FORECASTING OF NEW ISSUED  
BANKNOTES. THESIS ADVISOR: ASSIST. PROF. MANOP REODECHA,  
Ph.D. THESIS COADVISOR: PARAMES CHUTIMA, Ph.D. 212pp. ISBN  
974-637-210-6

This study presents neural network techniques for forecasting the requirements of new issued banknotes. It employs Widrow-Hoff and backpropagation techniques to make the forecasts during 1993-1996 using the data in the preceding 12-15 years. It is found that the backpropagation technique provides the forecasting results closest to the actual figures with the following parameters: learning rates ( $10^{-1}$  to 1), error goals ( $10^{-2}$  to  $10^{-1}$ ), and sum-squared error of training data ( $9.30 \times 10^{-4}$  to  $3.26 \times 10^{-3}$ ). When compared to the regression technique being used at the Bank of Thailand, this technique gives significantly more accurate results.

สถาบันวิทยบริการ  
จุฬาลงกรณ์มหาวิทยาลัย

ภาควิชา ศูนย์ด้านภูมิศาสตร์ทางเศรษฐกิจและมนุษย์  
สาขาวิชา กนลัตการทางวิศวกรรม  
ปีการศึกษา ๒๕๔๐

ลายมือชื่อนิสิต \_\_\_\_\_  
ลายมือชื่ออาจารย์ที่ปรึกษา \_\_\_\_\_  
ลายมือชื่ออาจารย์ที่ปรึกษาร่วม \_\_\_\_\_

## ACKNOWLEDGEMENTS

I started this program in late April, 1996. Until the end of this program, I have been supported by a number of gurus who contribute their valuable knowledges, experiences and great support to my study and life. I would like to give my thankfulness to:

Dr.Manop Reodecha is my advisor who has a number of advisees and never refuse any students. He has given precious suggestions and patient to my writing as well as listening to my complaints.

Dr.Parames Chutima is my co-advisor who always supports me generously all the way and instructs me in many aspects of life to become a better person.

Dr.Chidchanok Lursinsap, Dr.Anuchit Anuchitanukul, Ms.Pornpen Sodsrichai, Mr.Karaket Kongkiat-Ngam, Dr.Sornkrit Rungroekrit, Dr.Supoj Chinveeraphan, and also to my friends, classmates for their kindly support in all aspects.

Last but not least, to my mom who strengthens me and my dad for his everyday cooking. Without them, I will never know how to live and survive in the world.

สถาบันวิทยบริการ  
จุฬาลงกรณ์มหาวิทยาลัย

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## ABBREVIATION

BOT	=	Bank Of Thailand
NN	=	Neural Network
PE	=	Processing Element
ART	=	Adaptive Resonance Theory
SSE	=	Sum-Squared Error

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