

資料包絡分析與應用

DATA ENVELOPMENT ANALYSIS AND APPLICATIONS

國立臺灣大學農業經濟研究所

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學分：3

全年或半年：半年

必修或選修：選修

授課對象：碩士班、博士班研究生及相關研究單位專家學者

軟體程式：

(1) **GAMS: Release 2.25, 1992**, Washington, D.C.: GAMS Development Corp.

本程式置於臺灣大學農業經濟學研究所電腦室，請向電腦室 吳信東先生申請使用。

評分標準：(1) 課堂討論佔學期總分 20%

(2) 習題作業(或期中考試)佔學期總分 40%

(3) 期末考試(或期末報告)佔學期總分 40%

授課目的：

- 1) 從公理性架構(Axiomatic Framework)探討生產經濟學(Production Theory)基本理論
- 2) 強調在應用生產經濟領域，無效率(Inefficiency)現象的普遍存在及其測度方法
- 1) 介紹Data Envelopment Analysis (DEA)相關文獻、理論架構及其應用
- 2) 介紹非意欲產出(Undesirable Outputs)的概念、相關文獻、理論架構及其應用
- 3) Malmquist 總要素生產力的介紹、測度與拆解及實例應用與說明
- 3) 熟悉GAMS 相關軟體程式的操作及其在生產經濟學的應用

主要用書：

- Fare, R., S. Grosskopf and C.A. K. Lovell (1985), *The Measurement of Efficiency of Production*, Boston: Kluwer Academic Publishers. [HB241.F335]
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授課大綱

I. The Measurement of Productive Efficiency:

Introduction

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The Mathematical Programming Approach: Data Envelopment Analysis

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9) Towards Empirical Implementation

- 9.0 Introduction
- 9.1 Summary of the Main Results
- 9.2 Unfinished Business
- 9.3 Toward Empirical Implementation

10) References

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VI. Productivity Growth Measurement with Time Series Data

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VII. Other Applications

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