

**AN ANALYSIS OF EFFICIENCY AND PRODUCTIVITY IN MONGOLIAN  
CROP FARMING**

**by**

**TUMURDAA VAA BAYARSAIHAN**

**Eng. Ec. (Bratislava Czechoslovakia), M.Sc. (Lond.)**

**A Thesis Submitted for the Degree of Doctor of Philosophy  
of the University of New England**

**University of New England**

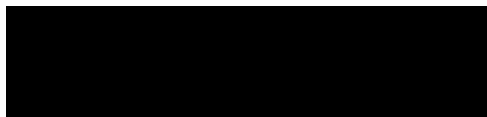
**Armidale, N.S.W.**

**December 1997**

### **Declaration**

I certify that the substance of this thesis has not already been submitted for any degree and is not currently being submitted for any other degree.

I certify that, to the best of my knowledge, any help received in preparing this thesis, and all sources used, have been acknowledged.

A solid black rectangular box used to redact the signature of the author.

### **Abstract**

In the past decade the world has witnessed the collapse of most centrally-planned economies. A large number of hypotheses have been put forward to explain this phenomenon. Among them, lack of efficiency and technical change have often been suggested as the major deficiencies of the system (Bergson, 1987; Moroney and Lovell, 1991). However, there have been few studies which have conducted detailed empirical analysis of pre-1990 firm-level data in an attempt to determine the degree of, and explanation of, the performance decline in these countries.

This study attempts to address these issues in the case of Mongolian crop farming. Detailed information on the inputs and outputs of 48 state farms producing grain and potatoes was collected from the original (hand-written) farm records. Annual data are obtained for the 14 year period from 1976 to 1989. These data cover three distinct policy planning periods. The first period (1976-1980) is characterised by increased input usage, whereas the second (1981-1985) and third (1986-1989) periods are largely characterised by the increased role of new technology, investment in human resources and the introduction of incentive systems (Jnen, 1986) with the aim of improving farm productivity. In particular, during the last four years (1986-1989) of the centrally-planned economic regime, several new forms of farm incentive systems aimed at improving farm performance, were experimented with within the state farm structure, which was a reflection of the new wave of Gorbachev's "Perestroika" reforms, carried out throughout the Eastern Block.

Production in Mongolian crop farms is modelled using stochastic frontier production function (SFPF) and data envelopment analysis (DEA) methods. The SFPF is chosen as the principal method of analysis, because of its ability to accommodate data noise and traditional hypothesis tests. The DEA method is also used as a check to see if the results are robust to alternative methodologies. These methods are used to obtain estimates of technical efficiency for each farm in each of the 14 years considered. Information on technical change, production elasticities, returns to scale and scale efficiencies are also

obtained. The information on technical efficiencies and technical change is also combined to obtain measures of total factor productivity (TFP) change.

Empirical results were obtained for grain and potato farms separately. The grain farm results provided evidence of significant inefficiency, with mean technical efficiency of the order of 81.9 per cent. Technical efficiency declined over the study period by 6.7 per cent, while technical change also declined by 18.1 per cent. This provides an overall decline of 23.6 per cent in TFP for Mongolian grain farms. The relative importance of technical change in the TFP decline is in accordance with results obtained by Moroney and Lovell (1991) for the case of centrally planned economies and Koopman (1989) for the case of the Soviet agriculture. However, it is noted that the majority of the decline in TFP occurred in the first half of the study period. In fact, TFP growth of 41.7 per cent is observed in the final six years. This suggests that the shift away from policies encouraging increased input usage (prevalent in the 1970s) towards the “intensive” technology and “incentive” reform policies of the 1980s was beginning to achieve considerable success in grain farms.

For potato farms the average technical efficiency was approximately 73.6 per cent. In contrast to grain farms, TFP in potato farms actually grew by 11.6 per cent over the 14-year period. This comprised a 15.5 per cent increase in technical change and a small 3.4 per cent decline in technical efficiency. This TFP result is obviously better than that of grain farms, but is still poor in comparison to that achieved in Western economies. In terms of the TFP trend over time, it followed a similar pattern to that seen for grain farms. After an initial decline in the 1970s, a 55.1 per cent of TFP improvement was observed in the final nine years of the study.

For the case of grain farms, data on certain farm-specific socio-economic characteristics were available for the 1987-1989 period which was used to explain the efficiency variation among the grain farms. It was found that technical efficiency was significantly and positively correlated to the levels of technical education and experience of the farm workers, and to the degree of management autonomy and the extent of Russian technical assistance. This may suggest that Government investment in human capital, the

successive incentive reform attempts and Russian technical assistance may have been translated into a higher farm performance. It was also observed that the efficiency scores of large and medium farms were consistently higher than those of small farms. In addition, it was noted that these farms were characterised by either constant or mildly increasing returns to scale. Thus, this evidence suggests that the current economic reform of splitting the original state farms into smaller units may not be justified on the grounds of farm size or scale economies.

In general, the DEA results supported the SFPF results, suggesting that the results of the latter approach were robust. The efficiency scores of the two approaches were comparable. The TFP changes, both in terms of magnitudes and trends, were generally similar. Moreover, the DEA results on scale efficiencies of grain and potato farms supported the scale-economies findings of the SFPF approach.

## Table of Contents

	<b>Page</b>
<b>Declaration</b>	<b>ii</b>
<b>Abstract</b>	<b>iii</b>
<b>List of Tables</b>	<b>x</b>
<b>List of Figures</b>	<b>xv</b>
<b>Acknowledgments</b>	<b>xvii</b>
<b>Dedication</b>	<b>xix</b>
 <b>Chapter</b>	
<b>1. Introduction to the Research</b>	<b>1</b>
1.1 Introduction	1
1.2 Historical Overview and Current Economic Reform	1
1.3 Justification of the Study	5
1.4 Objectives and Hypotheses	13
1.5 Analytical Methods and Data	14
1.6 Organisation of the Thesis	15
<b>2. Literature Review: Methodology</b>	<b>16</b>
2.1 Introduction	16
2.2 Efficiency Measurement	16
2.2.1 Concepts of efficiency	16
2.2.2 Parametric frontiers	20
2.2.3 Non-parametric frontiers	34
2.3 Productivity Measurement	42
2.3.1 Total factor productivity (TFP)	42
2.3.2 Traditional TFP measurement approaches	43
2.3.3 TFP measurement approaches based on frontier techniques	44
2.4 Summary and Conclusions	49
<b>3. Literature Review: Performance in Centrally- planned Agriculture</b>	<b>52</b>
3.1 Introduction	52

3.2 The Performance of Socialist Farming: Productivity and Efficiency Aspects	52
3.3 Productivity Studies	54
3.4 Efficiency Studies	57
3.5 Summary and Conclusions	63
<b>4. Discussion of Mongolian Crop Farming and Data Sources</b>	<b>69</b>
4.1 Introduction	69
4.2 Crop Farming in Mongolia	69
4.2.1 Crop land and topography	69
4.2.2 Farming practice, farm structure and functioning	72
4.2.3 Development practices	78
4.3 Data Sources and Variable Definitions	91
4.3.1 Nature of data on centrally-planned economies	91
4.3.2 Nature and sources of data on Mongolian crop farming	93
4.4 Summary and Conclusions	104
<b>5. Analysis of Efficiency and Productivity Changes in Grain Farming: Stochastic Frontier Production Function Approach</b>	<b>107</b>
5.1 Introduction	107
5.2 Partial Factor Productivity Measures	107
5.3 Stochastic Frontier Production Function with Time-varying Inefficiency Effects Model	112
5.3.1 Model specification and estimation	113
5.3.2 Functional forms, variables and statistical tests	116
5.3.3 Empirical results	119
5.4 Stochastic Frontier Production Function with Technical Inefficiency Effects Model	149
5.4.1 Model specification and estimation	149
5.4.2 Variables and statistical tests	151
5.4.3 Empirical results	153
5.5 Summary and Conclusions	158
<b>6. Analysis of Efficiency and Productivity Changes in Potato Farming: Stochastic Frontier Production Function Approach</b>	<b>164</b>
6.1 Introduction	164
6.2 Partial Factor Productivity Measures	164

6.3 Stochastic Frontier Production Function with Time- varying Inefficiency Effects Model	166
6.3.1 Empirical results	167
6.4 Summary and Conclusions	194
<b>7. Analysis of Efficiency and Productivity Changes in Grain and Potato Farming: Data Envelopment Analysis Approach</b>	<b>197</b>
7.1 Introduction	197
7.2 Measurement of Efficiency	197
7.2.1 Empirical results	201
7.3 Measurement of TFP Change	204
7.3.1 Empirical results	210
7.4 Comparison of Results from Data Envelopment Analysis and Stochastic Frontier Production Function Approaches	215
7.5 Summary and Conclusions	220
<b>8. Synthesis</b>	<b>222</b>
8.1 Introduction	222
8.2 Summary of Findings and Conclusions	222
8.3 Policy Implications	232
8.4 Suggestions for Further Research	239

**Appendix**

1. Additional Information Related to Chapter 5	240
2. Additional Information Related to Chapter 6	259
3. Calculation of the Rate of Technical Change in Grain Farming	276
4. Calculation of the Rate of Technical Change in Potato Farming	280
5. List of Acronyms	<b>285</b>

<b>References</b>	<b>287</b>
-------------------	------------

## List of Tables

### Table

1.1 Sown area and harvest for grain, potato and vegetable, selected years 1970-1989	6
1.2 Total agricultural workforce, selected years 1980-1988	7
1.3 Agricultural machinery stocks of state farms, selected years, 1960-1988	8
1.4 Selected performance indicators of state farm sector, 1981-1987	11
3.1 Productivity and efficiency studies of centrally-planned agriculture	66
4.1 Land assessed as suitable for crop farming	71
4.2 Distribution of cultivated land between state farms and co-operatives, 1960-1990	73
4.3 Resource endowment and output of an average state farm, crop sector, 1981-1987	76
4.4 Input and output growth of an average state farm, 1976-1990	80
4.5 The results of "intensive technology" application in grain production, 1986-1990	82
4.6 Age structure of farm workforce, 1983	83
4.7 Work experience of farm workforce, 1983	83
4.8 Education structure of farm workforce, 1975 and 1982-1986	84
4.9 Education structure of farm workforce, 1975 and 1982-1986 (percentage of total workforce)	86
4.10 Share of skilled workers in total farm workers, 1975 and 1981-1986	87
4.11 Education, age and experience of farm managers, 1983	88
4.12 Summary statistics on input and output data for grain farms, 1976-1989	99
4.13 Summary statistics on input and output data for potato farms, 1976-1989	100
4.14 Summary statistics on the selected farm-specific variables associated with efficiency of grain farms (percentage), 1987-1989	102
5.1 Partial factor productivities of grain farms, 1976-1989	110
5.2 Output elasticities of the SFPFs with time-varying inefficiency effects model for grain farms under alternative functional forms, 1976-1980; 1981-1985; 1986-1989	121
5.3 Mean efficiency scores of grain farms under alternative functional forms, 1976-1980; 1981-1985; 1986-1989	122
5.4 Generalised likelihood-ratio tests of hypotheses for parameters of the SFPF models for grain farms, 1976-1980; 1981-1985; 1986-1989	125

5.5 Output elasticities of the SFPFs for grain farms under alternative inefficiency-effects models, 1976-1980; 1981-1985; 1986-1989	127
5.6 Mean efficiency scores of grain farms under alternative inefficiency-effects models, 1976-1980; 1981-1985; 1986-1989	128
5.7 Generalised likelihood-ratio tests of hypotheses for variance parameters of the SFPF models for grain farms, 1976-1980; 1981-1985; 1986-1989	130
5.8 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects models for grain farms, the preferred models, 1976-1980; 1981-1985; 1986-1989	134
5.9 Returns to scale of grain farms, 1976-1980; 1981-1985; 1986-1989	136
5.10 Summary of technical efficiency scores of grain farms, 1976-1980; 1981-1985; 1986-1989	138
5.11 Distribution of efficiency scores of grain farms, 1976-1980; 1981-1985; 1986-1989	144
5.12 Efficiency scores ranked by size of farm measured as sown area; grain farms, 1976-1980; 1981-1985; 1986-1989	145
5.13 Efficiency scores ranked by capital; grain farms, 1976-1980; 1981-1985; 1986-1989	145
5.14 Efficiency scores of grain farms ranked by agro-ecological region, 1976-1980; 1981-1985; 1986-1989	146
5.15 Cumulative index of changes in efficiency, technology and TFP of grain farms, 1976-1989	148
5.16 Generalised likelihood-ratio tests of hypotheses for parameters of the SFPF models for grain farms; inefficiency effects model; 1987-1989	154
5.17 Maximum-likelihood estimates for the parameters of the SFPFs with inefficiency-effects model, 1987-1989	157
6.1 Partial factor productivities of potato farms, 1976-1989	165
6.2 Output elasticities of the SFPFs with time-varying inefficiency effects model for potato farms under alternative functional forms, 1976-1980; 1981-1985; 1986-1989	168
6.3 Mean efficiency scores of potato farms under alternative functional forms, 1976-1980; 1981-1985; 1986-1989	169
6.4 Generalised likelihood-ratio tests of hypotheses for parameters of the SFPF models for potato farms, 1976-1980; 1981-1985; 1986-1989	172
6.5 Output elasticities of the SFPFs for potato farms under alternative inefficiency-effects models <sup>a</sup> , 1976-1980; 1981-1985; 1986-1989	175
6.6 Mean efficiency scores of potato farms under alternative inefficiency-effects models, 1976-1980; 1981-1985; 1986-1989	176

6.7 Generalised likelihood-ratio tests of hypotheses for variance parameters of the SFPF models for potato farms, 1976-1980; 1981-1985; 1986-1989	179
6.8 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects models for potato farms, preferred models, 1976-1980; 1981-1985; 1986-1989	181
6.9 Returns to scale of potato farms, 1976-1980; 1981-1985; 1986-1989	182
6.10 Summary of technical efficiency scores of potato farms, 1976-1980; 1981-1985; 1986-1989	184
6.11 Distribution of efficiency scores of potato farms, 1976-1980; 1981-1985; 1986-1989	189
6.12 Efficiency scores ranked by size of farm measured as sown area; potato farms, 1976-1980; 1981-1985; 1986-1989	189
6.13 Efficiency scores of potato farms ranked by capital; potato farms, 1976-1980; 1981-1985; 1986-1989	190
6.14 Efficiency scores of potato farms ranked by agro-ecological region, 1976-1980; 1981-1985; 1986-1989	191
6.15 Cumulative index of changes in efficiency, technology and TFP of potato farms, 1976-1989	193
7.1 Summary of technical, pure technical and scale efficiencies for grain and potato farms from DEA results, 1976-1980; 1981-1985; 1986-1989	202
7.2 Returns-to-scale classification of grain and potato farms from DEA results, 1976-1980; 1981-1985; 1986-1989	203
7.3 Average annual change in Malmquist index of TFP change of grain and potato farms decomposed with scale effects, 1976-1989 (percentage)	210
7.4 Cumulative Malmquist index of TFP change decomposed into efficiency change and technical change for grain and potato farms, 1976-1989	212
7.5 Comparison of mean efficiency scores between DEA and SFPF results in grain and potato farms, 1976-1980; 1981-1985; 1986-1989	216
7.6 Comparison of annual average rates of TFP change and its components between DEA and SFPF results in grain and potato farms, 1976-1989	216
8.1 Sown area and output of grain, potato and vegetables, 1965; 1985; 1990-1994	234
8.2 Abandoned land by agro-ecological region and province, 1992	237
A1.1 Estimation of annual growth rates of PFPs of individual inputs of grain farms, 1976-1989	241
A1.2 Regression statistics of annual growth rates of PFPs of individual inputs of grain farms, 1976-1989	242

A1.3 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for grain farms, translog form, 1976-1989	243
A1.4 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for grain farms under different functional forms, 1976-1980	245
A1.5 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for grain farms under different functional forms, 1981-1985	247
A1.6 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for grain farms under different functional forms, 1986-1989	249
A1.7 Returns-to-scale statistics of grain farms, 1986-1989	251
A1.8 Efficiency scores of grain farms, 1976-1980	252
A1.9 Efficiency scores of grain farms, 1981-1985	253
A1.10 Efficiency scores of grain farms, 1986-1989	254
A1.11 Maximum-likelihood estimates for the parameters of the SFPFs for grain farms using Aigner <i>et al.</i> (1977) model, 1976-1989	255
A1.12 Efficiency scores of grain farms using Aigner <i>et al.</i> (1977) model, 1976-1989	257
A1.13 Efficiency scores of grain farms <sup>1</sup> , 1987-1989; (SFPF with technical inefficiency effects model)	258
A2.1 The estimation of annual growth rates of PFPs of individual inputs of potato farms, 1976-1989	260
A2.2 Regression statistics of annual growth rates of PFPs of individual inputs on potato farms, 1976-1989	261
A2.3 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for potato farms, translog form <sup>a</sup> , 1976-1989	262
A2.4 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for potato farms under different functional forms, 1976-1980	264
A2.5 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for potato farms under different functional forms, 1981-1985	266
A2.6 Maximum-likelihood estimates for the parameters of the SFPFs with time-varying inefficiency effects for potato farms under different functional forms, 1986-1989	268
A2.7 Efficiency scores of potato farms, 1976-1980	270
A2.8 Efficiency scores of potato farms, 1981-1985	271

A2.9 Efficiency scores of potato farms 1986-1989	272
A2.10 Maximum-likelihood estimates for the parameters of the SFPFs for potato farms using Aigner <i>et al.</i> (1977) model, 1976-1989	273
A2.11 Efficiency scores of potato farms using Aigner <i>et al.</i> (1977) model, 1976-1989	275

## List of Figures

### Figure

1.1 Administrative Map of Mongolia	2
1.2 Fertiliser imports, 1976-1992	9
2.1 Farrell productive efficiency	19
2.2 Distributional assumptions of the one-sided error term, $U$	25
2.3 Input-orientated efficiency measurement in DEA context	36
2.4 Scale effects of DEA	39
2.5 Malmquist index (output-based) of productivity change	48
4.1 Principal agro-ecological regions of Mongolia	70
4.2 Share of individual enterprises in total state farm output, average 1981-1987 (per cent)	74
4.3 Sown area and total output of grain, 1955-1994 (five- year moving average)	79
5.1 Partial factor productivity indices of grain farms, 1976-1989	111
5.2 Effects of alternative functional forms on efficiency scores of grain farms, 1976-1980; 1981-1985; 1986-1989	123
5.3 Effects of alternative inefficiency-effects models on efficiency scores of grain farms, 1976-1980; 1981-1985; 1986-1989	129
5.4 Relationship between farm size and scale economies for grain farms, 1986-1989	137
5.5 Efficiency trend of grain farms, 1976-1989	140
5.6 Efficiency trend of grain farms using Aigner <i>et al.</i> (1977) model, translog, 1976-1989	140
5.7 Distribution of efficiency scores of grain farms, 1976-1980; 1981-1985; 1986-1989	141
5.8 Cumulative index of changes in efficiency, technology and TFP of grain farms, 1976-1989	149
6.1 Partial factor productivities of potato farms, 1976-1989	166
6.2 Effects of alternative functional forms on efficiency scores of potato farms, 1976-1980; 1981-1985; 1986-1989	170
6.3 Effects of alternative inefficiency-effects models on efficiency scores, of potato farms, 1976-1980; 1981-1985; 1986-1989	177
6.4 Efficiency trend of potato farms, 1976-1989	187
6.5 Efficiency trend of potato farms using Aigner <i>et al.</i> (1977) model, translog, 1976-1989	187

6.6 Distribution of efficiency scores of potato farms, 1976-1980; 1981-1985; 1986-1989	188
6.7 Cumulative index of changes in efficiency, technology and TFP of potato farms, 1976-1989	194
7.1 Output-orientated efficiency measurement in DEA context	199
7.2 Cumulative Malmquist index of TFP change decomposed into technical change and efficiency change for grain and potato farms, 1976-1989	214
7.3 Comparison of the trends in TFP and its components between DEA and SFPP approaches: grain farms, 1976-1989	218
7.4 Comparison of the trends in TFP and its components between DEA and SFPP approaches: potato farms, 1976-1989	219

### **Acknowledgments**

First of all I would like to extend my sincere gratitude to my supervisors, Professor John L. Dillon and Dr Tim J. Coelli for their invaluable assistance provided to me during my study period. Professor J. L. Dillon has been instrumental in my thesis being completed at this time in this manner. His much-admired wisdom and long sighted advice have profoundly influenced the current work. Dr T. J. Coelli has enormously inspired me throughout the whole study with a lot of new ideas and kept me abreast of the latest developments in the subject area. I have most benefited from his deep knowledge in the efficiency and productivity measurement field. His constant encouragement, and enormous patience helped me greatly. I am privileged to have been the student of these admirable people.

I would like to express my sincere gratitude to Associate Professor George E. Battese for giving me many helpful suggestions during his supervision period. I also wish to thank Dr Munir Ahmad from the University of Faisalabad, whose knowledge into the area of production economics and efficiency measurement helped me significantly.

I truly appreciate Professor R. R. Piggott for his consistent and continuous support during my study period. My sincere appreciation goes to Dr Oscar Cacho for helping me with frequent computer problems and some useful discussions during the initial period of my study. My appreciation also goes to Mrs. Priscilla Connor for reading the whole thesis and helping with my English. Much appreciated administrative help from Mr. Ron Coleman will also be remembered.

I am indebted to AusAID (and hence to the Australian taxpayers) for providing me with financial assistance to complete this work. I also wish to thank my work colleagues from the Ministry of Food and Agriculture in Mongolia who have been most helpful in providing me with the necessary facilities and giving me access to data sources.

Above all, I owe most to my dear wife Dashdondog Azzaya and beloved sons, Tselmeg and Saruul, who have been the fundamental support throughout all these hard-working years. After all, it was their love and support that made it possible for me to finish this work.

## **Dedication**

I dedicate this work to my beloved mother Sandag Tumurdavaa.