# ANALYSIS OF TECHNICAL EFFICIENCY OF INTENSIVE WHITE-LEG SHRIMP FARMING IN NINH THUAN, VIETNAM: AN APPLICATION OF THE DOUBLE-BOOTSTRAP DATA ENVELOPMENT ANALYSIS

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#### 1. Introduction

area.

- ➤ Ninh Thuan province has an area of about 10 km² and favorable condition for shrimp farming that contribute 15% GDP of the
- In spite of its success, it **faces** some challenges; limited area, low harvest, lack of technical knowledge, disease and pollution.
- As researchers, we worked for the best method to improve the technical efficiency of the area.
- Therefore, we undertake this study to improve understanding of the inter-farm differences which will give opportunities to owners and policy makers.

# 2. Research objectives

- (1) Determination of TE of white-leg shrimp farming.
- (2) Analysis of factors affecting TE of white-leg shrimp farming.
- (3) Policy suggestions to improve EE of whiteleg shrimp farms in Ninh Thuan, Vietnam

# 3. Theory (Previous research)

- The most popular techniques in efficiency
   measurement are: Data envelopment analysis
   (DEA) and Stochastic frontier analysis (SFA);
- The advantage of deterministic DEA is non-parametric hence not require any parametric assumptions.
- However, it does not have a solid statistical foundation behind it and is sensitive to outliers.
- On the other hand, SFA approach predominates in efficiency studies on aquaculture due to the stochastic nature of aquatic culture.

# 3. Theory (Previous research) (con't)

- Simar and Wilson (2000) have introduced bootstrapping into the DEA framework to overcome these drawbacks.
- Their method is based on: statistical well-defined models for consistent estimation, corresponding technical efficiencies, confidence intervals for efficiency estimates and consistent inferences for efficiencies' factors.
- This paper extends previous studies by adopting the double bootstrap DEA model in comparison with the deterministic DEA approach to analyze efficiency.

# 4. Methodology

#### Step 1. Technical Efficiency measurement

The input-oriented DEA framework, *TE<sub>j</sub>*, is defined as:

$$TE_j(X,Y) = \min_{\theta_j,\lambda} \theta_j$$

such that:

$$Y_j \leq Y\lambda$$
;  $\theta_j X_j \geq X\lambda$ ;  $\lambda \geq 0$ ;  $\sum_{j=1}^{102} \lambda_j = 1$ 

Using both deterministic and double bootstrap DEA estimates (Simar and Wilson 2007)

# 4. Methodology (con't)

#### Step 2. Analysis of factors affecting TE

Truncated regression estimation using the double bootstrap method (Simar and Wilson 2007)

$$\widehat{\delta_j} = \beta Z_j + \varepsilon_j \ge 1$$
 where  $\widehat{\delta_j} = 1/\overline{TE_j}$ 

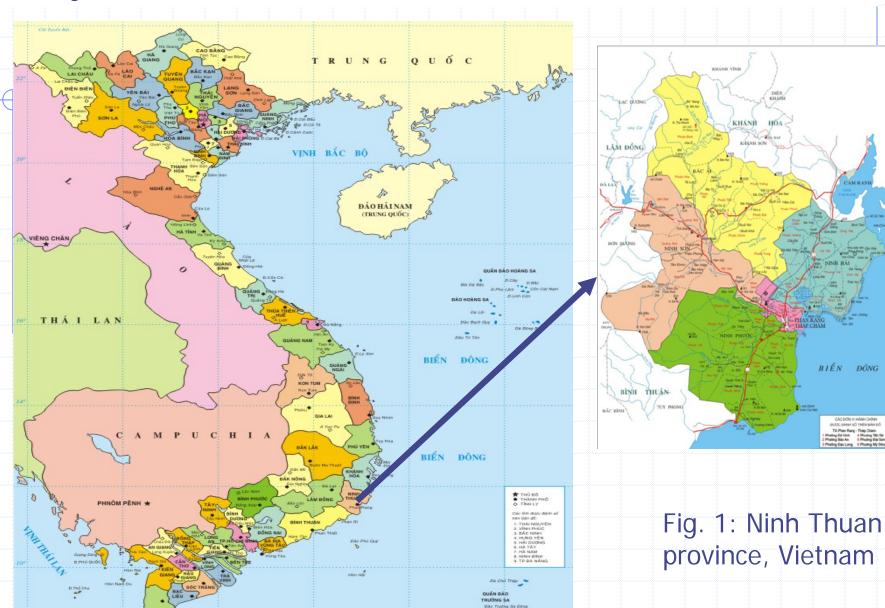
The deterministic two-stage DEA analysis with Tobit regression is also conducted:

$$TE_j = \beta_0 + \beta Z_j + u_j$$

#### **Table 1: Description of variables**

Variables	Description	Unit					
Production model for DEA framework							
Output (Y)	Total quantity of shrimp produced per ha per year	Kilogram					
Input (X)							
Seed (X <sub>1</sub> )	Fingerlings stocked in the farm per ha per year	1000ind					
Feed (X <sub>2</sub> )	Total quantity of feed used per ha per year	Kilogram					
Labor (X <sub>3</sub> )	Total number of man-hours per ha per year	Hour					
Chemicals (X <sub>4</sub> )	Total amount of fertilizer/chemical applied per ha per year	Kilogram					
Power (X <sub>5</sub> )	Total Kw of electricity per ha per year	Kw					
Farm specific variables	S						
Farm size (Z <sub>1</sub> )	Total area for shrimp aquaculture of the farm	Hectare					
Financial stress (Z <sub>2</sub> )	Borrowing for production cost (1 = yes, 0 = otherwise)	Dummy					
Culture length (Z <sub>3</sub> )	The length of shrimp farming per year	Day					
Experience (Z <sub>4</sub> )	Years the shrimp farmer/manager spent in shrimp farming	Year					
Training (Z <sub>5</sub> )	Technical training from extension agents (1 = yes, 0 = otherwise)	Dummy					
Education (Z <sub>6</sub> )	Level of education of shrimp farmer/manager (1 = college or higher, 0 = otherwise)	Dummy					

#### **Study Site**



#### 5. Results and Discussion

Table 2. Deterministic and double bootstrap DEA estimates.

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Description	Determ	ninistic	Double bootstrap		
	TE_CRS	TE_VRS	TE_CRS	TE_VRS	
Mean	0.69	0.79	0.63	0.73	
Median	0.70	0.80	0.63	0.75	
Min	0.39	0.40	0.35	0.37	
Max	1.00	1.00	0.88	0.91	
Upper 95%	-	-	0.67	0.80	
CI for Mean					
Lower 95% CI for Mean	-	-	0.59	0.68	
				10	

## 5. Results and Discussion (con't)

Table 3. Mean comparison and correlations of efficiency rankings

Efficiency	Mean		t-ratio	Spearman rank correlation	Kruskal- Wallis rank
	Deterministic	Double bootstrap		(ρ)	sum test
TE_CRS	0.69	0.63	19.028	0.980***	14.748***
TE_VRS	0.79	0.73	20.022	0.981***	9.615***

<sup>\*\*\*, \*\*, \*</sup> Significant at 1%, 5% and 10% levels, respectively

## 5. Results and Discussion (con't)

Table 4 Determinants of technical efficiency score<sup>(a)</sup>:
double bootstrap estimation

Varia	bles	Coefficients	Lower	Upper	Lower	Upper
			95% CI	95% CI	90% CI	90% CI
Inter	cept	0.2923	-0.8719	1.1264	-0.6147	1.0051
Farm	size	-0.3149**	-0.7216	-0.0521	-0.7098	-0.1053
Finar	ncial	0.3538**	0.0292	0.8300	0.0665	0.7075
stres	S					
Cultu	ire	0.0030**	0.0007	0.0059	0.0010	0.0053
lengt	h					
Expe	rience	0.0174	-0.0174	0.0539	-0.0111	0.0482
Train	ing	-0.0757	-0.3440	0.1969	-0.3062	0.1572
Educ	ation	-0.0089	-0.3822	0.3375	-0.3183	0.3041

<sup>\*\*, \*</sup> Significant at 1%, 5% and 10% levels, respectively.

<sup>(</sup>a) Technical efficiency score is the reciprocal of technical efficiency value

# 5. Results and Discussion (con't)

Table 5: Determinants of technical efficiency score<sup>(a)</sup>:

Tobit regressed estimation

Variables	Coefficient	Standard error	t-value	P-value
Intercept	0.9788**	0.1818	5.384	0.0000
Farm size	-0.1960**	0.0774	-2.530	0.0114
Financial stress	0.1316*	0.0748	1.758	0.0787
Culture length	0.0015**	0.0005	2.778	0.0054
Experience	0.0053	0.0084	0.636	0.5245
Training	-0.0523	0.0662	-0.789	0.4299
Education	0.0348	0.0835	0.417	0.6769

<sup>\*\*, \*</sup> Significant at 1%, 5% and 10% levels, respectively.

<sup>(</sup>a) Technical efficiency score is the reciprocal of technical efficiency value

#### 6. Conclusion

- There is considerable room for improvement in technical efficiency in the sample of farms analyzed.
- An improvement in technical efficiency among these whiteleg shrimp farmers can help to reduce the gap in yield between the most and the least efficient farmers.
- The factors that could **enhance** TE are education, extension training, farming using **earthen** ponds, and the increased size of farms.
- The variables that are negatively related to TE are financial stress, farmer experience and a longer cultivation period.

# 6. Conclusion (con't)

The potential improvement in TE (double bootstrap) used in this study is certainly greater than that using deterministic DEA.

Using a deterministic DEA two step approach, largely remain valid. However, it is advisable to use the Simar and Wilson (2007) double bootstrap procedure on TE in aquaculture studies.

6. Further works

Determination of AE, CE, EE

Analysis of factors affecting AE,
 CE, EE using deterministic approach compared to Double bootstrap DEA approach





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