

The Study on Selection of Green Supply Chain Partners in USA Logistics Industry

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Abstract—Choosing the suitable green supply chain partners in logistics industry is important to reduce environment risk. The main purpose of this paper is to evaluation of performance measure for green supply chain partners in U.S.A logistics industry using Data development analysis. To conduct a valid and reliable evaluation process while applying the logistics companies case in U.S.A, we integrated the slacks-based measure of super efficiency (super-SBM) and Malmquist index to directly handle the slacks, explore best performer, analyzed the inter-temporal efficiency change, which is decomposed into ‘catch-up’ and ‘frontier-shift’ effects and find influential factors in selecting green supply chain partners (GSCPs) criteria from 2010 to 2013. The results show that most GSCPs have higher efficiency and contribute more effort to improving technical change during 2010-2013. By comparing the efficiency of GSCPs in logistics industry, this research provides an approach of decision-making information in logistics as well as contributes to reduce carbon dioxide (CO₂) emissions in environmental protection.

Keywords—Green supply chain management, logistics, Data development annalysis, Malmquist index, carbon dioxide emissions

I. INTRODUCTION

Nowadays, environmentally sustainable green supply chain management has emerged as an important organizational philosophy to achieve corporate profit and market share objectives by reducing environmental risks and impacts while improving ecological efficiency of these organizations and their partners [1]. Thus, it's important to do business with companies that are demonstrating their commitment to sustainable transportation and logistics providers. Logistics and transportation are one of the most important activities that are essential for sustaining our daily lives. However, the U.N. Framework Convention on Climate Change estimates that more than 20 percent of global emissions of greenhouse gases are produced by the transport of goods and people. As a result, there is a pressing need for action, particularly by the logistics industry. The purpose of this research is to evaluate the performance of green supply chain partners in U.S.A logistics industry by integrating the slacks-based measure of super efficiency (super-SBM) models and Malmquist productivity index in Data development analysis (DEA) to select the most eligible green supplier, in order to achieve environmentally sustainable supply chain and about determining strategies considered as most cost-effective for managing and responding to environmental issues in logistics.

II. PROPOSED METHODOLOY

This study used Supper - efficiency model (Super- SBM-Oriented) based on slack based measure and Malmquist model to evaluate the efficiency in logistics industry, especially in Green supply chain partners (GSCPs). According to Inbound Logistics, there are 75 green supply chain partners in USA logistics industry [2]. To get credible and equitable data, the plants belonging to third party logistics (3PLS) were first selected for evaluation. Next, the plants belonging to air/expedited and trucking with complete financial statement were chosen. Finally, only 16 plants were considered in this study.

The conceptual framework is proposed in four stages. The evaluation process was followed in the framework as below:

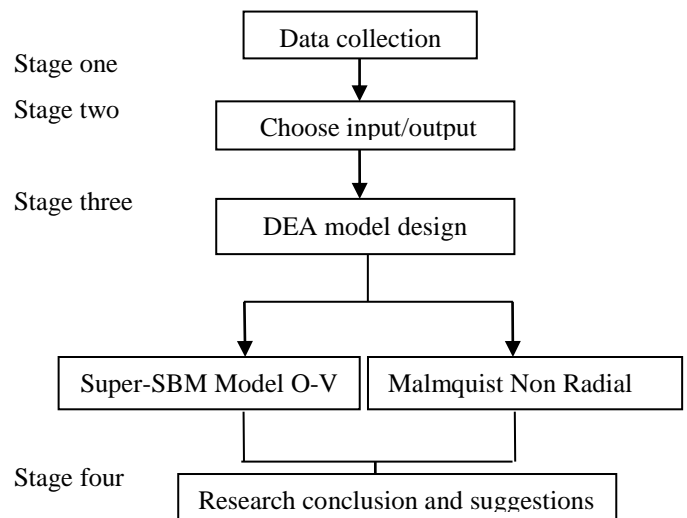


Fig. 1. Procedure of proposed method

Explanation of Figure 1:

- Stage one: Data collection. This study used companies that are related to logistics as DMUs, which includes 3PLS, air/expedited and trucking that are U.S.A listed companies at stock exchange market as Table I
- Stage two: Choose input/ output variable. The data sources for this study consist of 16 plants annual reports for the period from 2010 to 2013. Information was collected from market observation posting system of U.S.A stock exchange cooperation.

- Stage three: model design. Firstly, we use the Super-SBM-O-V model which proposed by Tone (2002) [3] is an appropriate version of DEA for ranking these efficient Green supply chain partner companies in this study. Then, we implement the Output-oriented Malmquist productivity index [4] to a sample of Green supply chain partners. This model was chosen to compute in order to evaluate the productivity change of a DMU between two time periods.
- Stage four: Research conclusion and suggestions. The results show that they can guarantee the viability of the company. Based on the super efficiency scores and MPI index, we find that most GSCPs have higher efficiency and contribute more effort to improving technical change.

TABLE I. GREEN SUPPLY CHAIN PARTNERS LIST

DMU _s	Full English name of companies	Stock name
DMU ₁	Ryder	R
DMU ₂	Werner Enterprises, Inc.	WERN
DMU ₃	Hub Group Inc	HUBG
DMU ₄	C.H. Robinson Worldwide	CHRW
DMU ₅	FedEx Corporation	FDX
DMU ₆	United Parcel Service, Inc.	UPS
DMU ₇	Con-way Freight	CNW
DMU ₈	J.B. Hunt Transport Services, Inc	JBHT
DMU ₉	Celadon Group, Inc.	CGI
DMU ₁₀	Old Dominion Freight Line	ODFL
DMU ₁₁	Saia Inc	SAIA
DMU ₁₂	CSX Corporation	CSX
DMU ₁₃	Norfolk Southern Corp.	NSC
DMU ₁₄	Knight Transportation	KNX
DMU ₁₅	Union Pacific Coporation	UNP
DMU ₁₆	Swift Transportation Co	SWFT

III. RESEARCH RESULTS

A. Performance rankings- Super SBM

The Super-SBM oriented (Super-SBM-O-V) model is applied to assess the relative performances and used as a ranking measure of the 16 GSCPS in U.S.A. It can be found out from Table II, Super SBM is highly in the measurement of efficiency and the rank is clear [5]. The results show that the sixth (United Parcel Service, Inc.) DMU6 has best value and the score always larger than 1 from 2010 to 2013, it is also ranked in the first place in 2013. DMU4 (C.H. Robinson Worldwide, Inc.) is ranked in the second place, and DMU10 (Old Dominion Freight Line) is ranked as the third best DMUs in 2013. That means these company reach the efficiency of output. In other words, DMU7 over invested in input. Thus, if it wants to reach the efficiency level, it should lower its inputs.

B. Components of the Malmquist productivity index: (1) efficiency change

First, we observe the efficiency effect of DMUs. The change in efficiency is called “catch-up” effect [4]. The annual efficiency change index for each DMUs is shown in Table III and figure 2.

Table III shows the results of efficiency change scores of GSCPs as well as their components of the companies which belong to Green supply chain partners. The results of output technical efficiency change present that there are 3 companies (DMU₉, DMU₁₁, DMU₁₄) having no evidence of changes in the input technical efficiency level during the period of 2010-2013.

TABLE II. EFFICIENCY RANK AND SCORE

DMU	2010		2011		2012		2013	
	Score	Rank	Score	Rank	Score	Rank	Score	Rank
DMU ₁	0.390304	15	1.046552	8	1.046552	8	1.084461	7
DMU ₂	0.764153	13	0.909759	14	0.909759	14	1.012374	9
DMU ₃	1.32628	4	1.130601	6	1.130601	6	1	11
DMU ₄	1.610008	1	1.701967	1	1.701967	1	1.331328	2
DMU ₅	1.115172	7	1.15746	5	1.15746	5	1.140892	5
DMU ₆	1.419855	3	1.383747	2	1.383747	2	1.366234	1
DMU ₇	2.15E-02	16	0.472521	16	0.472521	16	0.449934	16
DMU ₈	0.788557	12	1.019557	9	1.019557	9	1.05502	8
DMU ₉	0.999893	10	1	11	1	11	1	11
DMU ₁₀	0.674219	14	1.126958	7	1.126958	7	1.290887	3
DMU ₁₁	0.999711	11	1	11	1	11	1	11
DMU ₁₂	1.000338	8	1.003082	10	1.003082	10	0.576199	15
DMU ₁₃	1.130438	6	1.315366	3	1.315366	3	1.132695	6
DMU ₁₄	1	9	1	11	1	11	1	11
DMU ₁₅	1.184168	5	1.171036	4	1.171036	4	1.269728	4
DMU ₁₆	1.524519	2	0.628216	15	0.628216	15	1.003267	10

TABLE III. ANNUAL EFFICIENCY CHANGE FROM 2010 TO 2013

Catch-up	10=>11	11=>12	12=>13	Average
DMU ₁	2.681378	1.00908	1.026899	1.572452
DMU ₂	1.190547	1.099574	1.012022	1.100714
DMU ₃	0.85246	0.992735	0.890958	0.912051
DMU ₄	1.057117	1.002585	0.780212	0.946638
DMU ₅	1.037921	1.127276	0.874396	1.013198
DMU ₆	0.974569	0.777484	1.269922	1.007325
DMU ₇	21.98297	0.989519	0.962285	7.978257
DMU ₈	1.292941	1.035065	0.999727	1.109244
DMU ₉	1	1	1	1
DMU ₁₀	1.6715	0.994086	1.152276	1.272621
DMU ₁₁	1	1	1	1
DMU ₁₂	1.002743	0.639761	0.897881	0.846795
DMU ₁₃	1.16359	0.874917	0.984236	1.007581
DMU ₁₄	1	1	1	1
DMU ₁₅	0.98891	1.114017	0.973304	1.02541
DMU ₁₆	0.412075	0.998849	1.59885	1.003258
Average	2.456795	0.978434	1.026436	1.487222
Max	21.98297	1.127276	1.59885	7.978257
Min	0.412075	0.639761	0.780212	0.846795
SD	5.228949	0.123321	0.188527	1.738908

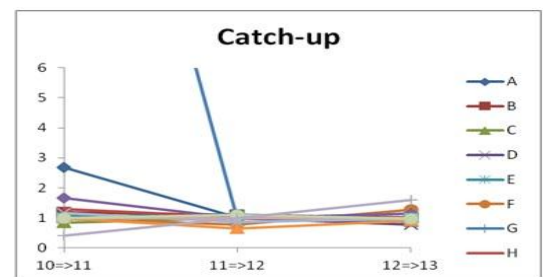


Fig. 2. Annual efficiency change from 2010 to 2013

In 2013, DMU₇ (Con-way Freight) had the largest improvement in efficiency change with score is 7.978257. According average index shows that as a whole, the performance of these companies had been improved from 2010 to 2013. The efficiency change score of these companies was always larger than 1 except for DMU₁₂, its efficiency change scores lower than other companies.

C. Components of the Malmquist productivity index: (2) technical change

Technical-efficiency or the so-called “innovation” or “frontier-shift” effect measures can be compared across time by means of the Malmquist index. In turn, the Malmquist index can be decomposed into two parts: change in technical efficiency and change in best- practice [4].

The results show that during the period of 2010 to 2013. There are 8 logistics companies that having the output technical improvement. There are 8 companies still improve their level of input technical change during the period of 2010 to 2013 as the previous year. Table IV and figure3 shows that DMU₉ (Celadon Group, Inc.) has an efficiency score of one in all the years. There are have 8 companies with technical change scores have efficiency score larger than 1, which indicates that they were reach efficiency change level. DMU₆ (United Parcel Service, Inc.) has the highest average in the technical efficiency in the period 2010 to 2013. DMU₁₆ (Swift Transportation Co) has scores smaller than 1 from 2011 to 2013. The interpretation of this is that Swift Transportation Co. has low per capital incomes because it seems that it was not investment in new technologies.

TABLE IV. TECHNICAL (FRONTIER) CHANGE OVER THE PERIOD 2010 TO 2013

Frontier	10=>11	11=>12	12=>13	Average
DMU ₁	0.938197	1.336349	1.211213	1.16192
DMU ₂	0.913608	1.04317	0.992737	0.983171
DMU ₃	1.029052	1.0419	1.027608	1.032853
DMU ₄	1.015689	1.040676	1.033418	1.029928
DMU ₅	1.184574	0.860028	1.240945	1.095182
DMU ₆	1.068291	1.00985	2.048535	1.375558
DMU ₇	0.834259	1.131308	0.970415	0.978661
DMU ₈	0.866662	1.026548	0.98498	0.959397
DMU ₉	1	1	1	1
DMU ₁₀	0.838103	1.076613	1.033319	0.982678
DMU ₁₁	1.17893	1.12247	1.044798	1.115399
DMU ₁₂	1.291143	1.56839	1.083977	1.314503
DMU ₁₃	1.114362	0.986038	1.038669	1.046356
DMU ₁₄	1.00802	1.019136	1.006997	1.011384
DMU ₁₅	1.070172	1.080795	1.021964	1.057644
DMU ₁₆	1.04493	0.79002	0.963337	0.932762
Average	1.024749	1.070831	1.106432	1.067337
Max	1.291143	1.56839	2.048535	1.375558
Min	0.834259	0.79002	0.963337	0.932762
SD	0.129004	0.177179	0.262985	0.124039

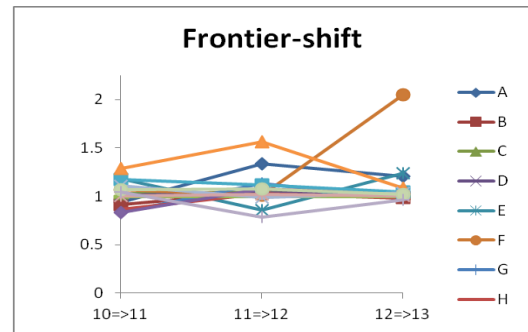


Fig. 3. Technical (Frontier) Change over the Period 2010 to 2013

D. Productivity changes: (3)the Malmquist productivity index and its decomposition.

The Malmquist index indicates the change of productivity between period t and t+1. In this case, if MI > 1, this indicates an improvement in efficiency by which is meant that the productivity of a specific logistic companies increases over the previous year that’s mean these companies are moving along the best production frontier; while MI = 1 and MI < 1 indicate a reduction in efficiency which means that the productivity of a specific logistics companies decreases over the previous year.

Table V and figure 4 shows the results of Malmquist index during 2010 to 2011 that there are an improvement on the productivity level in 14 logistics companies with a MPI values larger than 1. On the contrary, the productivity levels of 2 companies in the same period are decrease with a MPI less than 1, which indicates that productivity loss. The worse productivity in this period comes from the deterioration of input technical efficiency in most cases.

From 2012 to 2013, ten of the companies had productivity growth and other six of the companies had productivity loss. The reduction of the productivity level in this period is mostly from the regression of the input technical efficiency. DMU₇ had the highest productivity growth, followed by DMU₁. The main source of improvement comes from the development of technical efficiency and technical change.

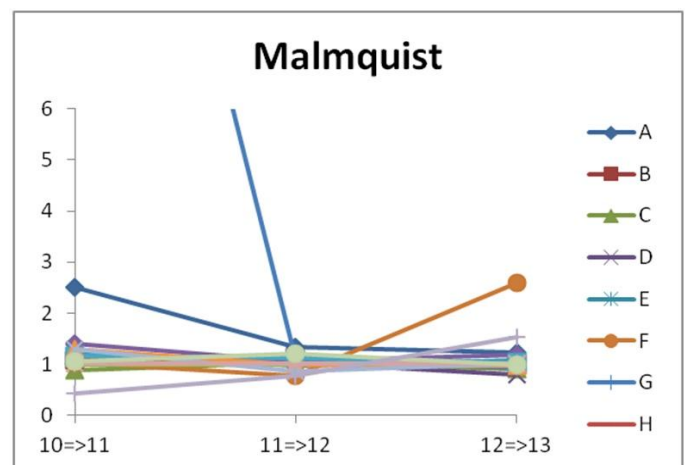


Fig. 4. Annual productivity change (MPI) from 2010 to 2013

TABLE V. ANNUAL PRODUCTIVITY CHANGE (MPI) FROM 2010 TO 2013

Malmquist	10=>11	11=>12	12=>13	Average
DMU ₁	2.515661	1.348482	1.243794	1.702646
DMU ₂	1.087692	1.147042	1.004672	1.079802
DMU ₃	0.877226	1.034331	0.915556	0.942371
DMU ₄	1.073702	1.043366	0.806286	0.974451
DMU ₅	1.229495	0.969489	1.085077	1.094687
DMU ₆	1.041123	0.785142	2.601479	1.475915
DMU ₇	18.33948	1.119451	0.933815	6.797581
DMU ₈	1.120543	1.062544	0.984711	1.055933
DMU ₉	1	1	1	1
DMU ₁₀	1.400889	1.070246	1.190669	1.220602
DMU ₁₁	1.17893	1.12247	1.044798	1.115399
DMU ₁₂	1.294685	1.003394	0.973282	1.090454
DMU ₁₃	1.296661	0.862701	1.022296	1.060553
DMU ₁₄	1.00802	1.019136	1.006997	1.011384
DMU ₁₅	1.058304	1.204024	0.994682	1.08567
DMU ₁₆	0.43059	0.78911	1.540231	0.919977
Average	2.247062	1.036308	1.146771	1.476714
Max	18.33948	1.348482	2.601479	6.797581
Min	0.43059	0.785142	0.806286	0.919977
SD	4.311724	0.145044	0.421705	1.43309

IV. CONCLUSION

The purpose of this study research is evaluate the performance of green supply chain partners to select the most eligible green supplier in order to achieve environmentally sustainable supply chain and about determining strategies considered as most cost-effective for managing and responding to environmental issues in supply chain.

The evaluation of green supply chain partners which was published by Inbound Logistics used the technical called Data Envelopment Analysis and Malmquist productivity index to estimate the efficiency scores of the green supply chain partners in U.S.A.

The empirical evidence of this paper provides some implications and suggestions for green supply chain companies to improve more their profit, technical, scale efficiencies and CO2 emission.

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