

System Dynamics Modeling for Determining Optimal Ship Sizes and Types in Coastal Liner Services*



Sung-il PARK**·Ying WANG***·Gi-tae YEO****·Adolf K.Y. NG*****

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Abstract

The problem of determining the required ship investment for deployment is an ongoing problem faced by governments and ship operators. The nature of ship investment is capital-intensive and the return on investment is often take long time. This paper attempts to establish system dynamics modeling (SDM) to simulate and solve this problem in order to help ship operators make effective strategic decisions. A case study of coastal liner services between Incheon and Baengnyeong Island in South Korea was performed. Using scenario analysis, the possible ship sizes (small: 350 tons; large: 2,500 tons) and types (new or used) were considered by comparing potential revenue with costs. The results indicated that putting a used large-sized ship into operation would accommodate the increasing passenger and cargo volumes, and improve customer services.

Key Words : Coastal Liner Services, Ship Investment, System Dynamics Modeling (SDM), Baengnyeong Island.

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** Masters Student, Graduate School of Logistics, Incheon National University, Korea, Email : neos85@nate.com

*** Doctoral Student, Graduate School of Logistics, Incheon National University, Korea, Email : yingmickey@daum.net

**** Professor, Graduate School of Logistics, Incheon National University, Korea, Email : ktyeo@incheon.ac.kr, Corresponding author

***** Professor, Department of Supply Chain Management, University of Manitoba, Canada, Email : Adolf.Ng@umanitoba.ca

I. Introduction

A ship investment system is a comprehensive setup comprising many interacting stakeholders, including passengers, ship owners, carriers, shippers and local government, often with different and competing interests. However, the complex nature of ship investment systems has made it difficult to develop, evaluate, and make decisions within a comprehensive, generic ship investment system model.

The combination of increased passenger volumes and limited ship capacity poses a significant challenge for ship company managers. Such challenges are confounded by significant demands for reduction in expenses, and the more effective and efficient utilization of existing resources, while at the same time providing high-quality services. In this paper, the objective is to explore the possibility of using system dynamics modeling (SDM) in decision-making processes related to ship investment: to determine the optimal size and type of ferry ships required to both satisfy increasing volumes and provide better customer service. To illustrate the usefulness of the proposed SDM, a system dynamics simulation approach was used to develop a mathematical model that analyzes typical decision-making scenarios¹⁾.

The paper is organized as follows: In Section II, the study region, including the geography of Baengnyeong Island, the current ships in operation, and the passenger and cargo volumes, is reviewed. Section III presents the methodology of SDM and the proposed ship investment SDM. A detailed case study of the ship investment problem in Baengnyeong Island is also presented. Finally, the conclusion can be found in Section V.

II. Study Region

In this research, it is focus on a ship investment decision making problem in coastal liner services. Korea is a peninsula country, for residents in the island, the unique transportation mode to connect the island and mainland is coastal transport, therefore it's important and necessary to improve the coastal liner services constantly. Recently,

1) Rajasekaram et al.(2010)

benefit from the promotion project of tourism in Baengnyeong Island, the tourist passenger volume is increasing; almost half of the tourists are the Incheon passengers, due to geographical advantage and 50% ticket discount. The increasing volumes begin to affect the regular travel of residents in Baengnyeong Island little by little, especially in the peak tourist season. The limited capacity of ships leads to inconvenience to both Baengnyeong Island residents (have to ticket to go home or go to mainland) and tourists (overcrowding of the ship). Therefore, to solve this problem, the ship investment decision should be made in this coastal liner service. The ship capacity lack problem liking Baengnyeong Island is appearing more and more due to now the coastal liner service is not only to satisfy the island residents' regular travel but for commercial purpose. As a representative case, this research chooses the coastal liner service between Baengnyeong Island and Incheon as a target to find the solution.

<Figure 1> Baengnyeong Island



As the northernmost island in the West Sea, Baengnyeong Island, shown in Fig. 1, is the eighth largest island in South Korea with about 10,000 inhabitants. A number of soldiers live on the island because its proximity to North Korea makes it an important military region. Baengnyeong Island is 280 kilometers away from the mainland city, Incheon, and a fast-sailing ship requires five hours to travel from Incheon to Baengnyeong Island. The existing coastal liner services are not only a means of transportation for the residents of the island, but also facility for the island residents' daily cargo transfers.

Passengers who move between Incheon and Baengnyeong Island are classified as residents, tourists, and Incheon passengers with different fees for each category, i.e., tourists: 55,900won; Incheon passengers: 50% discount; and residents: 5,000won). The discounts for Incheon passengers and residents are subsidized by government as the coastal liner services are the only means of transportation for these residents. The passenger volumes for each fee category, shown in Table 1²⁾. The general trend of the total volumes is increasing, although the volume dropped in 2008 causing by economic crisis and in 2010 by military conflict between North Korea and South Korea. In the table, we can know that the volume of residents is not affected by the outside world and keep increasing due to the coastal liner service is the unique transportation mode for residents to get out of the island, but the volumes of Incheon passengers and tourists get bigger affected by the outside world because most of them go to the island for a trip. About the average increase rate, Incheon passengers' increase rate is the highest, possible because Incheon passengers can get 50% discount from the ticket fee. The increase rate of tourists is also high, and the tourist attractions at Baengnyeong Island are drawing more and more people to visit this island, therefore the number of tourists is increasing.

<Table 1> Passenger volume between Incheon and Baengnyeong(unit: person)

Year	Incheon passengers	Tourists	Residents	Total volumes
2005	77,292	55,685	89,960	222,937
2006	87,712	47,425	105,625	240,762
2007	101,118	56,757	104,170	262,045
2008	117,818	69,102	98,257	285,177
2009	92,605	76,012	104,280	272,897
2010	75,707	48,404	107,151	231,262
2011	95,948	61,344	127,449	284,741
2012	123,927	79,233	137,623	340,783
Average increase rate	8.79%	8.02%	6.60%	6.99%

Note: Passenger volumes decreased sharply in 2010 due to the sinking of the Cheonan Navy ship following an attack by North Korea in March of that year.

2) Korea Shipping Association Ongjin military government White Paper(2011)

The majority of cargo volumes between Incheon and Baengnyeong Island are a daily necessity for the residents of Baengnyeong Island, and the number of cargo volumes has increased steadily with an annual average 3.89% rise per year.

Currently, there are three small-sized ships sailing between Incheon and Baengnyeong Island, which are pictured in Fig. 2. These three ships are operated by three different shipping companies and the shipping schedule is shown in table 2 in detail. The total capacity of the three ships is 1,125 people and 1,006 tons. There are only 260 ship-sailing days for these ships each year because small-sized ships cannot sail in adverse weather conditions. The limited sailing days may mean that the ships will not be able to fully accommodate future increases in passenger and cargo volumes.

<Figure 2> Three ships sailing between Baengnyeong Island and Incheon



<Table 2> Shipping schedule between Incheon and Baengnyeong

Shipping Company	Vessel Name	Vessel Kind	Departure from Incheon (time)	Departure from Baengnyeong (time)
Chonghaejin Marine Co., Ltd.	Democracy No. 5	Hi-speed (4 Hours)	08:00	13:00
JH Ferry	Harmony Flower	Car-ferry (4 Hours)	08:50	14:00
URI Express Ferry Co., Ltd	Sea Hope	Hi-speed (4 Hours)	13:00	08:00

Due to the cancellation days causing of small-sized ships, not only residents but also many passengers are denied transport. In addition, shipping companies are suffering from accommodating increasing passengers. As mentioned above, the tourists are increasing recent years. The limited capacity may lead to bad service quality, and then these

additional passengers run away, finally shipping companies may lose their business expansion opportunities. Yong-Gi Port was constructed in 2011 to absorb additional demand and alleviate the existing port stress. This could allow large ships (up to 3,000 ton) to sail between Incheon and Baengnyeong Island through Yong-Gi Port, and the number of days of cancellation could be reduced by as much as 50%. In order to improve passenger services and accommodate the increasing passenger volumes, the coastal liner service should therefore consider investing in larger ships.

To determine the appropriate ship investment for Yong-Gi Port, we developed a system dynamics model to forecast the passenger/cargo volumes. Using simulation to evaluate different ship sizes and types, an optimal ship investment solution was reached by comparing the profits obtained. The possible ship sizes included a large ship with a capacity of 900 people and 2,500 tons, and a small ship for 375 people and 350 tons. In addition, the respective sailing days employed were 310 and 260 days per year. The possible types of ships included new and used models.

III. Ship Investment System Dynamics Modeling

1. Studies of Ship Investment

Many researchers have carried out studies to determine optimal ship sizes and types in order to arrive at beneficial ship investment decisions and reduce shipping costs. Garrod and Miklius (1985) argued that the optimal size of a ship is determined by minimizing the costs per ton in the port while Hsu and Hsieh (2007) suggested that optimal decision-making with respect to ship size tends to transfer the burden of operation from carriers to shippers without allowing for inventory costs. Bendall and Stent (2005) valued the flexibility available to management decision making of ship investment in introducing an express liner service using a multinomial tree under uncertainty environment. Zhong (2000) applied AHP method on the weight of entropy to a ship investment decision making problem. Miyashita (1982) introduced a quarterly econometric method in bulk carrier industry to analysis the planning behavior in ship investment. Fan and Luo (2013) used binary choice and nested log it models to analyze

ship investment and ship choice behavior. Jin (2008) simulated the patterns of the investment in container ship using the system dynamics model for a long time. Ng and Kee (2008) indicated that shipping operators are often confronted with the challenge of deploying the right-sized ship when they attempt to replace their existing small-sized ships with new, bigger ones so as to accommodate their expansion plans. According to Diez and Peri (2010), the potential pay-offs and benefits of such optimization are crucial in the ship design process.

Previous studies solved the ship investment problem by various methods and the target including bulk, container ships, ocean liner and tramp service. However, most of them are focus on cargo ships, and the cost of ship operations without considering increasing passenger and cargo volumes and the provision of better customer service. To fill this gap, this paper attempts to focus on passenger-oriented ships in coastal service, and determine the optimal size and type of ferry ships required to both satisfy increasing volumes of passengers and provide better customer service while simultaneously taking into account the potential costs and profits of the ship investments.

2. System Dynamics Modeling

SDM is a methodology used to develop models that are based on both historical data and dynamic relationships between important variables for the purpose of describing and modeling the behavior of complex systems over time. It is typically used when formal analytical models do not exist but simulations can be developed by linking a number of processes, i.e., developing a system structure.

The application of system dynamics for water management systems³⁾, manufacturing supply chain systems⁴⁾, weather forecasting systems⁵⁾, business modeling⁶⁾, vehicle fuel modeling⁷⁾, energy systems⁸⁾, policy decision making⁹⁾, and public service system¹⁰⁾ has been documented by

3) Chung et al.(2008); Sušnik et al.(2012);Zarghami and Akbariye (2012)

4) Bala and Satter(1991); Baines and Harrison(1999); Ozbayraktet al.(2007); Trappey et al.(2012); Poles(2013)

5) Li and Simonovic(2002); Simonovic and Li(2003); Rajasekaram et al.(2010)

6) MacDonald et al.(2003);Nielsen and Nielsen(2008); Flynn et al.(2010); Prasad and Mall(2012)

7) Rodrigues et al.(2012); Shafiei et al.(2013)

8) Miller et al.(2012); Reddi et al.(2013)

9) Dangerfield(1992); Park et al.(2009); Inghels and Dullaert(2010); Ojoawo et al.(2012)

10) Homer and Hirsch(2006); Wang(2011); Duryan et al.(2012)

various researchers. These studies illustrate the diversity of problems to which SDM can be applied and further show that not only can it be used for natural and anthropogenic systems of various scales, but it can also be utilized effectively to further local stakeholder engagement and knowledge.

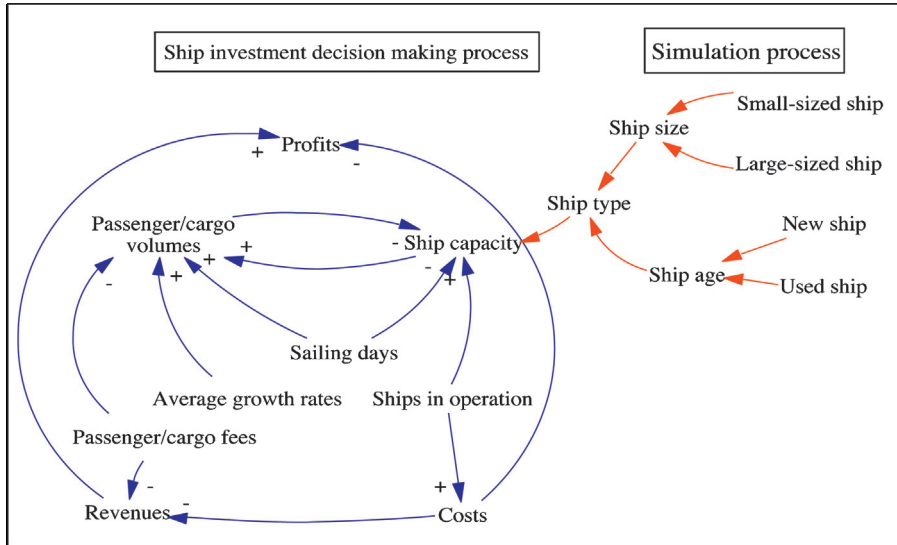
Indeed, ship investment systems are complex and comprehensive and cannot be modeled easily. The reason the SDM is advocated in this paper is that modern system dynamics packages use a simple graphic interface, making the modeling of complex systems much easier than before, with delays and feedback effects. By using diagrammatical representation along with underlying equations, building a detailed model of a complex system with delays and balancing and reinforcing loops is relatively uncomplicated. SDM has the ability to simulate complex, non-linear feedback-driven systems, thus justifying its use.

3. Ship Investment SDM

In this paper, a system dynamic model was developed to simulate and facilitate ship investment decisions at Yong-Gi Port. The conceptual and causal diagram for the ship investment SDM is shown in Fig. 3. The model variables are passenger/cargo volumes, fees, average growth rates, ship capacity, sailing days, the number of ships in operation, revenues, and the costs and profits of the shipping company. It consists of three major subsystems: (1) the passenger/cargo volumes, (2) the capacity of the ships, and (3) a simulation process for determining the required ship investment of the shipping company. The model was designed based on the passenger and cargo volumes data from 2005 to 2012, and under the model establish process, the Delphi method has been fulfilled with shipping company that operating the coastal line service between Incheon and Baengnyeong Island. Especially when decide some value of variables (e.g. the value of passenger rates of three groups- Incheon passenger, tourists and residents, impact index from external factors that may dampen the growth of the volumes from Incheon passenger and tourists), the discussions and interviews have been done for gathering ideas and suggestions from these experts, therefore make the model more realistic. Passenger/cargo volumes supply (ship capacity) and demand (volume forecasting) management strategies were applied in the model in order to obtain the current

economic conditions of the shipping company and then make a decision about ship investment. To move from the causal diagram to the stock-flow model, the three subsystems were examined in detail.

<Figure 3> Causal diagram for the ship investment SDM



1) Dynamics of Passenger/Cargo Volumes

The parameters that determine passenger/cargo volumes are passenger/cargo growth rate, initial passenger/cargo volume, fees, ship capacity, and sailing days, as shown in Eq.1:

$$V_{t+1} = V_t + V_t * P_r * P_f * P_s * P_c \quad (1)$$

where V_{t+1} is the forecasted passenger/cargo volume; V_t is the initial volume of the passenger/cargo at the starting year t ; and P_r , P_f , P_s , and P_c are the parameters of the passenger/cargo growth rate, fees, ship capacity, and sailing days, respectively. All the parameters change over time and a trend of increasing volume can be observed.

2) Dynamics of Ship Capacity

The ship capacity level is affected by factors such as the number of ships in operation, passenger/cargo volumes, and sailing days, as shown in Eq. 2:

$$S_{t+1} = S_t + S_t * P_n * P_v * P_s \quad (2)$$

where S_{t+1} is the forecasting ship capacity level; S_t is the initial ship capacity level at the starting year t ; and P_n , P_v , and P_s are the parameters of the number of ships in operation, the passenger/cargo volume, and the sailing days, respectively.

3) The Dynamics of Ship Investment Decision Making

The ship investment decision can be made by simulation via the SDM. The economic analysis of the shipping company depends on the revenues, costs, and profits associated with the new ship capacity investment, and can be calculated as follows:

$$R_t = F_t - C_t \quad (3)$$

$$C_t = F_o \quad (4)$$

$$P_t = R_t - C_t = F_t - C_t - F_o \quad (5)$$

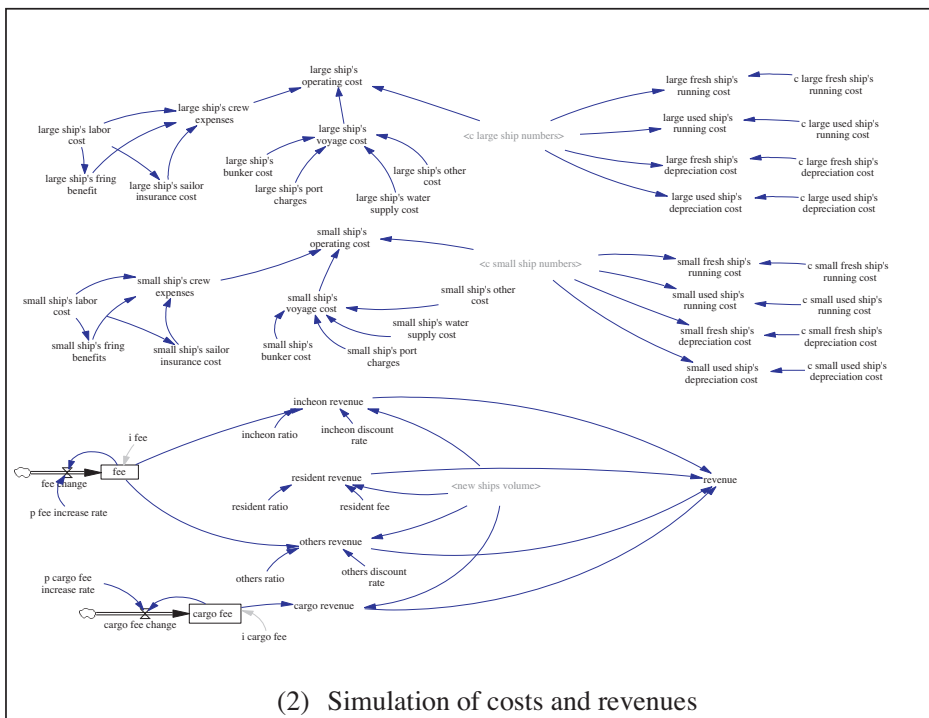
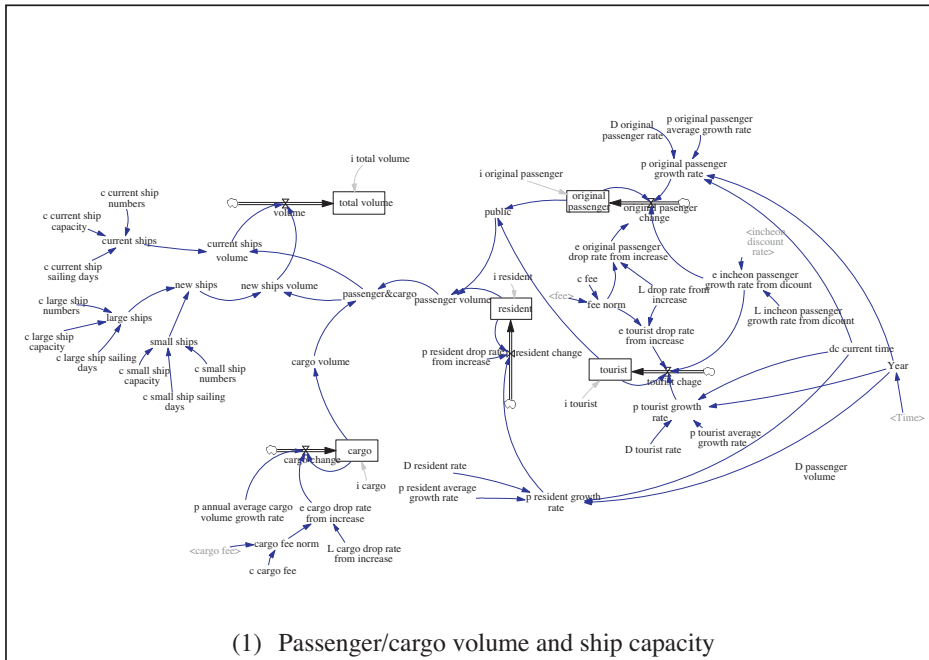
Where R_t is the total revenue of the shipping company calculated by subtracting the total costs from the fees obtained from the passengers and cargo; C_t is the total cost at the starting year t ; P_t is the total profit calculated by subtracting the total costs from the total revenue.

The result of the analysis can provide an overview of the shipping company with respect to the current ship investment situation, and it can reveal the changes in profit after the new ship capacity investment. This information can aid decision-makers in deciding what type and size of ship to invest in in order to maximize benefits as part of their future strategies.

Based on these sub-models, the general stock-flow structure was developed and is shown in Fig 4. The stock and flow model was developed using VENSIM PLE® software.

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<Figure 4> The stock-flow diagram of the proposed ship investment SDM



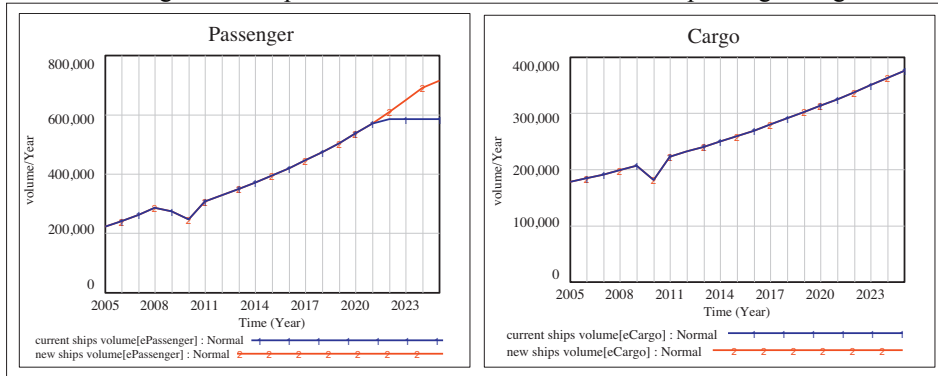
A. Validation of the Model

The ship investment SDM was validated and revised with structural tests, structure-oriented behavior tests, and behavior pattern tests¹¹⁾.

B. Calibration of the Model

The model was calibrated after validation using historical data from 2005 to 2012. Some parameters, such as the Incheon passenger growth rate, tourist growth rate, resident growth rate, cargo growth rate, fee increase rate, and sailing control costs, were revised. The calibration process for the passenger/cargo volumes is shown in Fig 5. The estimated passenger and cargo volumes in recent years have correlation coefficients of 0.89 and 0.95, respectively, which is acceptable.

<Figure 5> Ship investment SDM estimation for the passenger/cargo.



C. Model Testing

There are various types of model tests; the most common ones compare the forecasting error with other methods or use descriptive statistics to assess the point-by-point fit, then calculate the error between a data series and the model output. To test the model, forecasting error between the real data of passenger volumes and the forecasted data was calculated in Table

11) Barlas(1996)

3 shown below. The average forecasting error from 2005 to 2012 of passenger is 2.25%, it means using this SDM, the accuracy can reach to 97.75% and also can prove that the proposed method is suitable for forecasting.

<Table 3> Forecasting error of passenger volumes

Passengers (people)				
Year	Real volumes	Forecasted volumes	Error (%)	Average error (%)
2005	222,937	222,937	0.00%	2.25%
2006	240,762	240,783	0.01%	
2007	262,045	262,073	0.01%	
2008	285,177	285,207	0.01%	
2009	272,897	272,897	0.00%	
2010	231,262	244,818	5.86%	
2011	284,741	307,708	8.07%	
2012	340,783	326,928	4.07%	

IV. Model Simulations of Different Scenarios

1. The Influence of Ship Size

Due to the ever-increasing passenger and cargo volumes, new ship capacity is an inevitable requirement for the coastal liner services between Incheon and Baengnyeong Island. In this section, the passenger and cargo volumes will be forecasted for the period 2013–2025 based on the current increase rates, as well as scenarios that include a new ship capacity with better service and higher passenger satisfaction. The forecasted results are shown in Table 4.

<Table 4> Forecasted passenger and cargo volumes

Passengers (people)			Cargo (tons)		
Year	Current ships	New ships	Year	Current ships	New ships
2013	347,467	347,467	2013	240,155	240,155
2014	369,382	369,382	2014	249,497	249,497
2015	392,770	392,770	2015	259,198	259,198
2016	417,733	417,733	2016	269,224	269,224
2017	444,379	444,379	2017	279,583	279,583
2018	472,824	472,824	2018	290,283	290,283
2019	503,195	503,195	2019	301,330	301,330

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2020	535,622	535,622	2020	312,732	312,732
2021	570,249	570,249	2021	324,494	324,494
2022	585,000	607,228	2022	336,625	336,625
2023	585,000	646,719	2023	349,129	349,129
2024	585,000	688,895	2024	362,014	362,014
2025	585,000	714,000	2025	375,283	375,283

The aim of Table 3 is to show the forecast volume of the passenger and cargo volume when using the current ships and new ships, thus find whether the capacity of the current ships can accommodate the increasing passenger and cargo volumes. As illustrated by Table 3, the passenger volumes will increase steadily according to the average rate of increase. The passenger volumes of the current ships will increase until 2022, but the capacity of the current ships will not be able to satisfy the increasing numbers of passengers (capacity of the current ships: 585,000 people, forecasted increased number of passengers: 607,228 people). Therefore, given the capacity of the current ships the number of passengers will be constant from 2022 to 2025. However, the number of passengers accommodated by the new ships will increase steadily until 2025 because the new capacity will provide ample space, which will satisfy the increasing number of passengers.

The results show that the new ship capacity should be added before 2021. However, the problem is what type of ship size should be invested to both accommodate the increasing passenger volumes and maximize the benefits for the shipping company. This decision can be made via SDM. When deploying a small-sized ship, the additional ship capacity can accommodate 156,000 people. With the addition of the current ships, the total ship capacity will be 741,000. In 2025, the passenger demand is expected to be 642,718, and this will increase steadily in the future. It is clear that a small-sized ship will not be able to meet the demands of the future passenger volumes. A large-sized ship has a ship capacity of 558,000 people, bringing the total ship capacity to 1,143,000 people. A large-sized ship is a much more suitable investment than a small-sized ship from the viewpoint of passenger volumes.

The cargo shipments between Incheon and Baengnyeong Island are a daily necessity for the residents of Baengnyeong Island. However, the cargo capacity for the current and new ship forecasts have the same result because the cargo needs are much lower than the ships' capacity (2025

cargo: 375,283 tons, capacity of the current ships:523,120 tons).

As a result, in order to meet the increasing passenger and cargo volumes, the coastal liner services between Incheon and Baengnyeong Island should invest in a large-sized ship.

2. The Influence of Ship Type

The issue of determining what type of ship, i.e., new or used, to invest in is an ongoing problem faced by local government and the ship operators in this case study given that the nature of the investment is capital-intensive and there is often a slow return on investment¹²⁾. To this end, a financial analysis was conducted for the period 2013 to 2022 to enable a decision to be made about this problem. The forecasted profits are presented in Table 5.

<Table 5> Forecasted profits

Year	New ship	Used ship
2013	(₩4,291,720,192)	(₩1,905,720,320)
2014	(₩7,937,613,824)	(₩3,220,656,128)
2015	(₩10,390,298,624)	(₩3,395,854,336)
2016	(₩11,590,746,112)	(₩2,370,764,800)
2017	(₩11,479,916,544)	(₩84,893,696)
2018	(₩9,996,976,128)	₩3,524,018,176
2019	(₩7,077,486,592)	₩8,521,777,152
2020	(₩2,653,421,568)	₩14,977,744,896
2021	₩3,346,874,368	₩22,964,854,784
2022	₩10,998,628,352	₩32,559,579,136

Notes: (₩) means deficit, ₩ means profit.

According to our analysis, an investment in a new ship would result in the shipping company making a loss for eight years until 2020 because the sailing revenue would be smaller than the sailing costs. Similarly, the purchase of a used ship would make a loss until 2017 after which the company would see profits. Sailing between Incheon and Baengnyeong Island will not produce generous profits for the ship operators due to the passenger fee discounts for residents and Incheon citizens. In addition, Baengnyeong Island holds a military position between North Korea and South Korea, so the government pays more attention to the stability of this

12) Ng and Kee(2008)

island. Therefore, the local government should provide some financial assistance to the ship operators so that the coastal liner services can supply more convenient transport services to the island's residents and tourists. The huge capital investment required for a new ship cannot be absorbed by local government and the ship operators, particularly considering the time wasted between ordering a ship and the new ship becoming operational. A new ship investment is therefore not an optimal choice. Hence, our results suggest that the purchase of a used ship would be preferable so as to accommodate the increasing passenger and cargo volumes and provide better customer service while still generating profits, albeit over the long term.

In this section, different scenarios were simulated in the proposed ship investment SDM. The results show that the addition of a used large-sized ship will accommodate the increasing passenger volumes and improve customer service due to the increased number of sailing days.

V. Conclusion

In order to implement investment plans with respect to ship and port construction, accurate forecasts are required because these investments are mostly taken over the long term. This study forecasted passenger and cargo volumes between Incheon and Baengnyeong Island from 2013 to 2025 by using an SDM to solve the social problems emanating from causal relationships in order to accommodate the increasing passenger and cargo volumes and improve customer service. Using the SDM, we employed the existing passenger fee structure to divide the passengers into three groups, i.e., Incheon passengers, tourists, and residents, and proceeded to provide forecasts while taking into consideration the individual growth rates and variables associated with demand. We then investigated whether profits would emerge following investment in a new ship by comparing the revenue created through the forecasted volumes with the costs of the ship operations. It was concluded that deploying a used large-sized ship would accommodate the increasing passenger and cargo volumes, and improve customer service due to the increased number of sailing days.

The results of this study can support decision-makers in both private shipping businesses and in public agencies overseeing the development of

the shipping industry. It can help shipping companies to determine the best ship investment strategies that will help them maintain their optimum performance, avoid overcapacity and be successful to service passengers. For the public agencies, they are responsible for development of the shipping industry, using the results they can stipulate economic and financial policies and to promote the development of a specific industry to meet the public needs.

As this study only focused on the increasing volumes and the capacity of the ships, it did not address other factors such as financing factors, economic environment and so on. In order to perform more accurate forecasts, future research should consider supply and demand more closely from both practical and managerial perspectives. Also, to confirm the accuracy of the passenger and cargo forecasts, analyses performed by alternative methodologies, such as ARIMA, are encouraged. Finally, future studies would benefit from not only considering the ability to accommodate demand but also other causal relationships with respect to passengers and ships.*

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