KEY DRIVERS TO THE GROWTH OF AIR CARGO DEMAND FOR COMBI-CARRIERS; BASED ON AIR NETWORK OF SRI LANKA

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Dr. Anuja Fernando

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ABSTRACT

Today air transportation is vital for implementing best international business practices, including just-in-time inventory management and build-to-order production. Regardless of the geographical location, air cargo transportation enables regions and nations to connect distant markets and sustain the global supply chain efficiently and faster. According to the IATA reports, nearly 40 percent of the value of global trade is carried by air, where more than 50 percent of the air cargo is carried on passenger flights (Moving Air Cargo Globally, 2016) (IATA, 2020). Therefore, it is essential to identify the optimum route network coupling in both passenger and cargo demand-driven networks. Cargo demand-driven networks are dynamic upon the factors that affect the cargo demand in respective destinations. This study mainly focuses on identifying the key influencing factors and industries that could affect the growth of air cargo demand in the cargo and passenger demand-driven network.

Unfortunately, most airlines focus only on passenger demand, whereas cargo demand at the destination is often neglected. However, more than 98% of air cargo trades in Sri Lanka are happening through Combi carriers. As the first step to address this issue, it is necessary to understand air cargo generation and attraction at a destination. Sri Lanka will be a best-case study to analyze the Combi carriers. Hence, this study introduces preliminary criteria on how air cargo is generated and assigned to a particular demand.

Five years of export air cargo data, including more than five hundred thousand shipment details, have been used for the cluster analysis to identify similar commodity groups based on air cargo weight and value. Before the analysis, all the export air cargo was classified into 97 commodity groups (According to HS code classification) to get clear output from the analysis. Nine distinct clusters were identified below, showing apparent differences in air cargo behavior.

Cluster Number	**HS Code**						**Cluster Number**	**HS Code**
Cluster 01	1	22	37	53	75	92	***Cluster 02***	3
	2	23	38	54	76	93		6
	4	24	39	55	78	94	***Cluster 03***	7
	5	25	40	56	79	95		8
	9	26	41	57	80	96	***Cluster 04***	14
	10	27	42	59	81	97	***Cluster 05***	21
	11	28	43	65	82			58

	12	29	44	66	83			60
	13	30	45	67	84			63
	15	31	46	68	85			64
	16	32	47	69	86		***Cluster 06***	49
	17	33	48	70	87		***Cluster 07***	61
	18	34	50	72	89		***Cluster 08***	62
	19	35	51	73	90			88
	20	36	52	74	91		***Cluster 09***	71

Identified clusters were classified into four quadrants according to high-high, high-low, low-high and low-low value to weight ratio. In addition, the social and economic impact on cargo generation, the final destinations of the cargo, sub-commodity types, and characteristics are discussed. The findings will benefit airlines in strengthening their air route network and increasing global market access & traffic growth. Likewise, a country could implement the basement to enhance the overall level of productivity. It will help to boost exports and the competition in the home market.

Many research studies have been conducted using different factors and models to forecast air cargo demand, and those did not consider demand from Combi and All-cargo carriers together. More than 30 factors were identified through literature reviews and interviews with industry experts. The independent variables for the analysis were selected, covering different areas that would affect air cargo demand growth at a destination, like an airport and airline capabilities, economic, market, environmental, and human factors. The population of a country, Population Growth, GDP, GDP Growth, Total Passenger demand, Total Cargo Demand, Hub Connectivity, Employment rate, and CO2 emission due to the aviation industry are the selected factors under-considered areas. Regression analysis was conducted for the analysis, and the Connectivity index and the air cargo demand at the destination were identified as the key influencing factors for the growth of air cargo demand at a destination for Combi carriers. These derived factors can assist in assigning flight schedules, route development, and facility improvements of airports and airlines. Hence the outcomes of this research would benefit the airlines, airports, and freight forwarders in their strategic decision-making.

Keywords – Air cargo, Cluster analysis, Regression analysis, HS code

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LIST OF ACRONYMS

IATA	International Air Transportation Association
WTO	World Trade Organization
CTK	Cargo Tonne Kilometers
HS	Harmonized Commodity Description and Coding System
WCO	World Customs Organization
ANN	Artificial Nural Network
COP	Crude Oil Prices
UK	United Kingdom
USA	United States America
UAE	United Arab Emirates
GDP	Gross Domestic Products
GSP+	Generalised Scheme of Preferences Plus

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