

**OPTIMIZATION APPLICATIONS IN SEAPORT
CONTAINER TERMINAL OPERATIONS AND FUZZY
LOGIC-BASED INTER TERMINAL TRUCKING**

BUDDHI CHATHUMAL ALWIS WEERASINGHE

218049H

Degree of Master of Science

Department of Transport and Logistics Management

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DECLARATION OF ORIGINALITY

I declare that this is my own work, and this thesis/dissertation does not incorporate without acknowledgement any material previously submitted for a degree or diploma in any other University or institute of higher learning and to the best of my knowledge and belief, it does not contain any material previously published or written by another person except where the acknowledgement is made in the text.

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STATEMENT OF THE SUPERVISOR

The above candidate has carried out research for the Degree of Master of Science under my supervision.

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Signature of the Supervisor:

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Date: 30th September 2022

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ABSTRACT

Operations research techniques have helped optimize container terminal operations over the past decades and have been a regular feature of maritime logistics and maritime supply chain literature in addition to being in practice at container terminals across the globe. The first phase of the project, a systematic review systematically collates through Scopus and analyzes 1631 papers published in the domain to find the main research clusters and understand future research directions. Studies based on both quayside and landside planning are encapsulated for this research. Five research clusters that discuss simulation, scheduling and automation, quayside operations, integrated operations, and container transportation are identified based on author keywords of the systematically derived paper pool. In addition to that, the evolution of applying optimization techniques in container terminal operations planning is discussed in this study alongside the suggested trajectory of the research agenda under each cluster. The analysis finds that genetic algorithms, integer linear programming and heuristics are the most widely used operations research techniques in container terminal optimization. The review proposes the application of methods such as neural network, fuzzy logic and deep learning models related to artificial intelligence to widen our understanding of container terminal operations. The second phase of the project is conducted to optimize ITT truck flows in container terminals by following the research direction that is derived through the cluster, container transportation in the systematic review. The proposed model is developed using fuzzy logic in MATLAB software. The model can allocate ITT trucks based on the demand from terminal yards and current truck arrival rates at gatehouses. More industry and academia as well as inter-terminal collaborations are needed in future studies for enhancing ITT operations and the overall operations in container terminals.

Keywords: container terminals, systematic review, inter-terminal transportation, optimization, maritime logistics, fuzzy logic

ACKNOWLEDGEMENT

The clever guidance of many individuals helps to build this study into this stage. First, I must get this opportunity extend my gratitude to MSc research supervisor of this project, Dr. Niles Perera, Founding Director, Center for Supply Chain Operations, and Logistics Optimization (SCOLO), University of Moratuwa and Senior Lecturer of Department of Transport and Logistics Management, Faculty of Engineering, University of Moratuwa. He was the person who guided throughout this journey and always be the reason behind bringing this study into this level. I must appreciate his contribution in giving all the directions that were given in this journey.

I must extend my thanks to all the members of the research group of SCOLO including Dr. Amila Thibbatuwawa (Deputy Director of SCOLO) for their immense support and guidance throughout the MSc journey. The opportunities that were created by SCOLO always helped me to reach this destination.

I must convey my gratitude to The Senate Research Committee of the University of Moratuwa and the grant bearing ID SRC/LT/2020/20 which makes this project a reality.

I would like to thank Dr. T. Sivakumar, postgraduate research coordinator of the Department of Transport and Logistics Management, for his support during the degree program progress reviews and in administrative processes. I must give my gratitude to Dr. Indika Sigera for all the comments and suggestions that were given to improve the study.

Further, I would like to thank our collaborator for phase 1 of the project Dr. Xiwen Bai, Assistant Professor, Department of Industrial Engineering, Tsinghua University. It must be mentioned that all the insights that she gave me to improve the study always helped me in improving the study.

I should thank Senior Prof. Amal S. Kumarage, the person who made opportunity to earn a degree in transport and logistics for students around the country by initiating the Department of Transport and Logistics Management, Faculty of Engineering, University of Moratuwa. I wish to express my sincere gratitude to Prof. Asoka Perera, Head of the Department, Department of Transport and Logistics Management, University of Moratuwa for guiding and leading us into the correct path.

I must express my gratitude to all the managers and employees of the port of Colombo including, Mr. Pushpika Suranga Walpola (SLPA), Mr. Chandima Senevirathne (CICT), Mr. Prasanga Silva (SAGT) and Ms. Umashi Siyabalagamage (SAGT) who provided me all the needed information whenever I need the support. Without them, this study cannot be improved to this level.

I would like to extend my gratitude to the staff members of the Department of Transport and logistics management including Dr. Ranil Sugathadasa for the incredible support by motivating towards the right destination. At the same time, I would like to extend my gratitude to all the nonacademic staff members of Department of Transport and Logistics Management as well as University of Moratuwa including Ms. Dilani Jayasinghe who supported me in administrative tasks in the MSc project.

Moreover, I should take this opportunity to thank my father, Mr. Lalith Weerasinghe and my mother, Mrs. Sunethra Abesinghe who were always behind me in each challenge that I faced during the MSc journey. I wish to extend my gratitude to Ms. Achala Hasini Perera for giving me an immense support throughout the project. Similarly, I must appreciate my friends including Ms. Kasuni Weerasinghe, Ms. Mahekha Dahanayake and Mr. Dilina Kosgoda and everyone who supported in bringing this study this far.

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LIST OF ABBREVIATIONS

ITT	Inter Terminal Transportation
YC	Yard Crane
MCC	Multi-Country Consolidation
LCL	Less than Container Load
QC	Quay Crane
QGC	Quay Gantry Crane
RMG	Rail Mounted Gantry crane
RTG	Rubber Tired Gantry crane
SC	Straddle Carrier
SFD	Stack and Flow Diagram
YT	Yard Truck
SLPA	Sri Lanka Ports Authority
SAGT	South Asia Gateway Terminals
CICT	Colombo International Container Terminals
JCT	Jaya Container Terminal

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