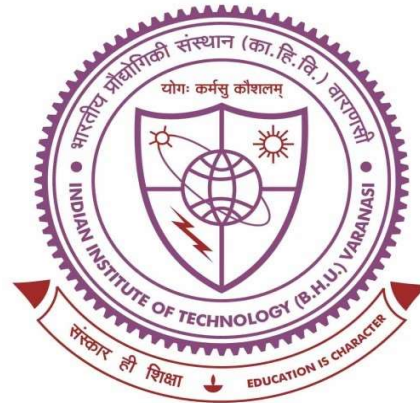


**ROUTE OPTIMIZATION OF MOBILE MEDICAL
UNITS USING MACHINE LEARNING AND
MAINTAINING TRANSPARENCY IN
PHARMACEUTICAL SUPPLY CHAIN**



A Thesis

Submitted for the Degree of
Doctor of Philosophy
In the Faculty of Engineering

By
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Under the supervision of
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***...Dedicated To My Family
and Friends***

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TABLE OF CONTENTS

ACKNOWLEDGEMENTS	v
LIST OF TABLES	xiii
ABSTRACT	xiv
CHAPTER 1	19
INTRODUCTION	19
1.1 BACKGROUND	19
1.2 MOBILE MEDICAL UNITS (MMUs)	21
1.2.1 STRUCTURE AND OPERATION OF MOBILE MEDICAL UNIT	22
1.3 VEHICLE ROUTING OPTMIZATION	25
1.4 REINFORCEMENT LEARNING	27
1.5 MOTIVATION AND NEED FOR STUDY	28
1.6 OBJECTIVE AND SCOPE	30
1.7 RESEARCH SIGNIFICANCE	32
1.8 ACHIEVING GOALS USING SOLUTION METHODOLOGY	33
1.9 THESIS ORGANIZATION	35
CHAPTER 2	36
LITERATURE REVIEW	36
2.1 SUPPLY CHAIN HEALTHCARE	37
2.2 MOBILE MEDICAL UNIT	44
2.2.1 VEHICLE ROUTING IN HEALTHCARE	47
2.2.2 USING MACHINE LEARNING IN HEALTHCARE VRP	50
2.2.3 BRINGING TRANSPARENCY IN DRUG DELIVERY	55
CHAPTER 3	61
THE APPLICATION OF ARTIFICIAL INTELLIGENCE TO THE HEALTHCARE SUPPLY CHAIN: A BIBLIOGRAPHIC STUDY	61
3.1 INTRODUCTION	61
3.2 DATA COLLECTION	64
3.3 INITIAL SEARCH RESULTS	65
3.4 YEARLY DATA PUBLICATION STATISTICS	66
3.5 DATA INVESTIGATION	68
3.6 BIBLIOMETRIC ANALYSIS	68
3.7 GEOGRAPHICAL REGION ANALYSIS	68
3.8 KEYWORDS STATISTICS	70
3.9 NETWORK ANALYSIS	71

3.10	PUBLICATION IN DIFFERENT DISCIPLINES	74
3.11	AFFILIATION STATISTICS	74
3.12	AUTHOR STATISTICS	75
3.13	STATISTICS OF DIFFERENT TYPES OF PUBLICATIONS	76
3.14	ANALYSIS OF CITATIONS	77
3.15	STATISTICS ON SOURCE TITLE	78
3.16	RESEARCH CONSEQUENCE OF THE BIBLIOMETRIC ANALYSIS	78
3.17	CONCLUSION AND FUTURE SCOPE	79
CHAPTER 4		81
MIXED INTEGER NON-LINEAR PROGRAMMING FOR MOBILE MEDICAL UNITS		81
4.1	INTRODUCTION	81
4.2	MIXED INTEGER NON-LINEAR PROGRAMMING FOR MOBILE MEDICAL UNITS (MINLPMMUS)	82
4.3	MODEL DESCRIPTION	83
4.3.1	PROBLEM PRESENTATION	83
4.3.2	MODEL ASSUMPTIONS	85
4.3.3	PROBLEM DEFINITION AND FORMULATION	86
4.3.3.1	PROBLEM DEFINITION	86
4.3.3.2	PROBLEM FORMULATION	87
4.4	META-HEURISTIC APPROACH (MULTI-OBJECTIVE PROBLEM)	92
4.4.1	NON-DOMINATED SORTING ANT COLONY OPTIMIZATION (NS-ACO)	92
4.4.2	ANT COLONY OPTIMIZATION (ACO) ALGORITHM	93
4.4.3	SOLUTION APPROACH USING VARIABLE NEIGHBORHOOD SEARCH	96
4.4.4	MACHINE LEARNING APPROACH	97
4.5	DATASET	99
4.5.1	IMPORTING LIBRARIES	101
4.5.2	DATA CLEANING	101
4.5.3	DATA EXPLORATION	102
4.5.4	DATA INTERPRETATION	103
4.5.5	COMPUTATIONAL RESULTS	104
4.6	SUMMARY	116

CHAPTER 5	117
EVALUATION OF CRITICAL CHARACTERISTICS IN PHARMACEUTICAL SUPPLY CHAIN MANAGEMENT USING FUZZY ANALYTIC HIERARCHY PROCESS AND IMPLEMENTING BLOCKCHAIN TECHNOLOGY TO MAINTAIN TRANSPARENCY	117
5.1 INTRODUCTION	117
5.2 LITERATURE REVIEW	122
5.3 METHOD USED FOR MULTI CRITERIA DECISION MAKING - FAHP	124
5.4 RESULTS	133
5.4.1 WORKING OF TRADITIONAL DRUG DISTRIBUTION SYSTEM	134
5.4.2 MANAGERIAL INSIGHTS	141
5.5 DATASET	141
5.5.1 ALGORITHMS USED	144
5.6 RESULTS	151
5.7 CONCLUSION	155
CHAPTER 6	158
CONCLUSION AND FUTURE SCOPE	158
6.1 CONCLUSION	158
6.2 FUTURE SCOPE	160

LIST OF FIGURES

Figure 1.1 VRP with multi-depot [Dixit 2018]	26
Figure 3.1 Healthcare Supply Chain (Kritchanchai et al., 2010)	63
Figure 3.2 Publication Count Year wise	67
Figure 3.3 Geographical representation of supply chain	69
Figure 3.4 Top Ten Countries publishing papers on Supply Chain in Healthcare using Artificial Intelligence	70
Figure 3.5 Relationship of keywords and source title	71
Figure 3.6 Cluster of Year-wise Publications	72
Figure 3.7 Relationship of keywords and authors appearing on the same topic	72
Figure 3.8 Relationship of keywords and authors in the same topic	73
Figure 3.9 A constellation of affiliation, language, and type	73
Figure 3.10 Publication percentage in different Disciplines	74
Figure 3.11 Number of Publications based on the affiliation of universities	75
Figure 3.12 Number of Publication Count by different authors	76
Figure 3.13 Statistics of different types of Publications.	77
Figure 4.1 Vehicle Routing of Mobile Medical Units with specialist	87
Figure 4.2: ACO algorithm flowchart (Khanna et al., 2015)	96
Figure 4.3 Health issues of patients	106
Figure 4.4 Number of patients per village	106
Figure 4.5 Scatter plot for different villages around SUHRC	107
Figure 4.6 Optimal Routes of Villages	107
Figure 4.7 Route for MMU for Day 0	109
Figure 4.8 Route for MMU for Day 1	110
Figure 4.9 Route for MMU for Day 2	110
Figure 4.10 Route for MMU for Day 3	111

Figure 4.11 Route of MMU for Day 4	112
Figure 4.12 Optimal route of MMU	112
Figure 4.13 Accuracy score of different Classification algorithm heuristics	115
Figure 5.1 Membership Function showing triangular fuzzy number	125
Figure 5.2 Synthesized weights for ranking of characteristic of blockchain technology that success the pharmaceutical supply chain	134
Figure 5.3 Traditional Drug Supply Chain Process [Sahoo et al. 2020]	135
Figure 5.4 Choosing whether or not to use Blockchain Technology	137
Figure 5.5 Process of storing information in Blockchain architecture.	139
Figure 5.6 Bar chart representing transaction types	144
Figure 5.7 Decision Tree for Random Forest Algorithm	145
Figure 5.8 Gradient Boosting basic diagram	147
Figure 5.9 Workflow of Proposed Methodology	150
Figure 5.10 Code depicting the input from user	151
Figure 5.11 Bar graph to compare the accuracy	154
Figure 5.12 Accuracy improvement through learning.	154

LIST OF TABLES

Table 1.1 Details of Mobile Medicals Units (Operational) under National Health Mission (NHM)	22
Table 1.2 Composition of Mobile Medical Unit	24
Table 3.1 Keywords for data analysis	65
Table 3.2 Publications on master keywords in different languages	65
Table 3.3 Documents Publication Access Type	66
Table 3.4 Different types of documents in the healthcare supply chain	66
Table 3.5 Yearly Publication Data Trend	67
Table 3.6 Publication Data Count based on keywords	70
Table 3.7: Statistics report for citations of publication from the year 2010 to 2019 for the first 2000 documents	77
Table 3.8: Statistics report for a number of publications from different sources	78
Table 4.1 Notations	99
Table 4.2 Sample Data	100
Table 4.3 Summary of problem instances	104
Table 4.4 Number indicating villages in Figure 10	108
Table 5.1 Satty's Crisp scale and fuzzified scale used for pairwise comparison	126
Table 5.2 Characteristics of pharmaceutical supply chain for pairwise comparison	127
Table 5.3 Pairwise comparison matrix of characteristics of pharmaceutical supply chain	129
Table 5.4 Details of transactions (sample)	140
Table 5.5 Dataset Representation	142
Table 5.6 Type of Transactions	143
Table 5.7 Output for User Inputs	152
Table 5.8 Accuracy Comparison	153