

## **CONTENTS**

		Page No
Γitle		
Certificate	ii	
Abstract		iii
Acknowledgment		iv
List of Tables		vii
List of Figures		viii
List of Symbols	and Abbreviations	X
CHAPTER 1:	INTRODUCTION	1-4
1.1. PRELIME	NARY INSIGHT	1
1.2. BRIEF SURVEY OF LITERATURE		3
1.3. PROBLEM STATEMENT		3
1.4. ORGANIZATION OF THESIS		3
<b>CHAPTER 2:</b>	MACHINE LEARNING TECHNIQUES	5-13
2.1. BACKGR	OUND	5
2.2. SUPERVISED LEARNING		7
2.3. UNSUPERVISED LEARNING		11
2.4. REINFORCEMENT LEARNING		12
CHAPTER 3: CONVOLUTIONAL NEURAL NETWORKS		14-32
3.1. NEURONS		14
3.2. PERCEPTRON		16
3.3. BACKPROPAGATION		17
3.4 NEOCOGNITRON		18

3.5. LeNet: THE FIRST MAINSTREAM CNN	20
3.6. AlexNet AND GoogleNet	21
3.7. VGG	23
3.8. ResNet	25
3.9. OBJECT DETECTION	27
3.10. FASTER R-CNN	30
CHAPTER 4: REINFORCEMENT LEARNING	33-40
4.1. INTRODUCTION	33
4.2. BASIC REINFORCEMENT LEARNING PROBLEM	34
4.3. MARKOV DECISION PROCESS	35
4.4. Q-LEARNING	38
4.5. DEEP Q-NETWORKS	39
CHAPTER 5: PROBLEM STATEMENT	41-44
5.1. MOTIVATION	41
5.2. INTERSECTION OVER UNION AND BOUNDING BOX	42
5.3. METHODOLOGY	42
CHAPTER 6: RESULT AND DISCUSSION	45-52
6.1. MODIFIED Faster R-CNN IMPLEMENTATION	45
6.2. DQN IMPLEMENTATION	49
CHAPTER 7: FUTURE SCOPE	54
REFERENCES	55-62
PUBLICATIONS	63

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## **PUBLICATIONS**

1. IEEE International Conference on "Machine Learning, Big Data, Cloud and Parallel Computing: Trends, Perspectives and Prospects" (Com-IT-Con-2022), 26<sup>th</sup>-27<sup>th</sup> May 2022, Manav Rachna International Institute of Research & Studies, Faridabad, India

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