## Human Behaviour Modelling for Gaming Using Agent Technology

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Final Dissertation submitted to the Faculty of Information Technology, University of Moratuwa, Sri Lanka for the partial fulfillment of the requirements of the Degree of

MSc in Artificial Intelligence

November 2013

University of Moratuwa

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#### **Declaration**

I declare that this dissertation does not incorporate, without acknowledgment, any material previously submitted for a Degree or a Diploma in any University and to the best of my knowledge and belief, it does not contain any material previously published or written by another person or myself except where due reference is made in the text. I also hereby give consent for my dissertation, if accepted, to be made available for photocopying and for interlibrary loans, and for the title and summary to be made available to outside organization.

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### **Dedication**

"To the person who taught us not only the technical theories, but also many lessons to the real life – Professor Asoka S. Karunananda"

"To my soul, my life and my wife - Kavija Sachinthani Gunathilake"

### Acknowledgements

Professor Asoka Karunananda, former dean- faculty of Information Technology, University of Moratuwa and my main supervisor of this research project for his tremendous support during the research work.

Dr. Romesh Ranawana, Managing Director – Simcentric Technologies and my co-supervisor for this research project. My gratitude for his endless support and invaluable advices throughout the research work. Apart from that, as my employer for the freedom he gave me in various ways to accomplish this research tasks one by one.

Mrs. Kavija Gunathilake, my wife for her all the sacrifices throughout the research period and priceless encouragements.

Mr Dimuthu and Ms. Nadeeka as the backup supporters from the faculty of information technology, University of Moratuwa.

All the office colleagues who helped me by playing the game scenario for me and for capturing the data. All the batchmates, school friends who supported me in various ways during this period.

#### **Abstract**

The incorporation of real human behaviour for non-player characters (NPCs) in games is a significant research challenge. The nature of events and actions within a game scenario is associated with temporal and spatial redundancies. Such data cannot be considered in isolation, and should be processed in sequence. Multi Agent Systems are proposed as a potential technology to model natural human behaviour into non player characters in game environments. A three phase solution is proposed for this purpose. During the first phase real data in a game are collected by letting a human player play the game unconditionally and naturally as possible. All objects around the player and each action executed by the player are recorded against the time. The second phase involves the cleaning and normalization of the noise present within data gathered during phase 1. Then for each sequence of data are modelled as HMM along with player current action. Rules are generated with these HMM and player actions. The NPC decision making strategy, consequently are implemented by agents using these rules. HMMs are mapped as resource agents and the NPC in the game is mapped as a request agent. Based on the observation sequence that NPC receives, it broadcasts those information to the resource agents and bid for the best deal and try to find the most suitable state sequence (that is action sequence). Jade is used as the agent framework and Jahmm is used for HMM modelling. As the test bed (simulation platform) of this experiment, Virtual Battle Space2 (VBS2) along with the VBS2Fusion library is used to prototype the approach. The validity of the proposed method is verified by experiments in two major aspects. One is to check hiding of the facts that NPC behaviours are artificial. The other one is to check the time performance to achieve the target during the game. Experimental results show that difference of recognizing the artificial facts of NPC is comparatively low and it proves the proposed method of applying the human behaviours in a complex scenario like game can be proven statistically.

# Contents

1.1.       Prolegomena       1         1.2.       Background and motivation       1         1.3.       Aim and objectives       2         1.4.       Proposed solution       2         1.5.       Summary       3         Chapter 2 Current trends in human behaviour modelling         2.1.       Introduction       4         2.2.       Different Test Beds       7         2.3.       Different Test Beds       7         2.4.       Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1.       Introduction       9         3.2.       Hidden Markov Model       9         3.3.1       Agent Technology       11         3.3.2.       Characteristics of Agent       12         3.3.1       Agent Concept       12         3.3.2       Characteristics of Agent       12         3.3.3       Rational Vs Logical       13         3.4.       Summary       14         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1.       Introduction       19         4.2.1       Hypothesis       19         4.2.2	Chapter 1	Introduction	1
1.2       Background and motivation       1         1.3       Aim and objectives       2         1.4       Proposed solution       2         1.5       Summary       3         Chapter 2 Current trends in human behaviour modelling         2.1       Introduction       4         2.2.       Different Test Beds       7         2.4       Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1       Introduction       9         3.2       Hidden Markov Model       9         3.3.1       Agent Technology       11         3.3.2       Characteristics of Agent       12         3.3.1       Agent Concept       12         3.3.2       Characteristics of Agent       12         3.3.4       Agent Programs       14         3.4       Summary       18         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1       Introduction       19         4.2.1       Hypothesis       19         4.2.2       Users       20         4.2.3       Input       20         4.2.4       Process       20			
1.3. Aim and objectives       2         1.4. Proposed solution       2         1.5. Summary       3         Chapter 2 Current trends in human behaviour modelling         2.1. Introduction       4         2.2. Different Technologies       4         2.3. Different Test Beds       7         2.4. Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1. Introduction       9         3.2. Hidden Markov Model       9         3.3. Agent Technology       11         3.3.1 Agent Concept       12         3.3.2 Characteristics of Agent       12         3.3.3 Rational Vs Logical       13         3.3.4 Agent Programs       14         3.4. Summary       18         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1. Introduction       19         4.2.1 Hypothesis       19         4.2.2 Users       20         4.2.3 Input       20         4.2.4 Process       20         4.2.5 Output       20         4.3. Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1. Introduction	1.2	Background and motivation	
1.4.       Proposed solution       2         1.5.       Summary       3         Chapter 2 Current trends in human behaviour modelling       4         2.1.       Introduction       4         2.2.       Different Technologies       4         2.3.       Different Test Beds       7         2.4.       Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1.       Introduction       9         3.2.       Hidden Markov Model       9         3.3.1.       Agent Technology       11         3.3.2.       Characteristics of Agent       12         3.3.3.       Rational Vs Logical       13         3.3.4.       Agent Programs       14         3.4.       Summary       18         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1.       Introduction       19         4.2.1       Hypothesis       19         4.2.2       Users       20         4.2.3       Input       20         4.2.4       Process       20         4.2.5       Output       20         4.3.       Summary       20<	1.3.	Aim and objectives	
Chapter 2   Current trends in human behaviour modelling   2.1.   Introduction   4   2.2.   Different Technologies   4   4   2.3.   Different Test Beds   7   2.4.   Summary   8   8	1.4.	Proposed solution	
2.1.       Introduction       4         2.2.       Different Technologies       4         2.3.       Different Test Beds       7         2.4.       Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1.       Introduction       9         3.2.       Hidden Markov Model       9         3.3.       Agent Technology       11         3.3.1.       Agent Concept       12         3.3.2.       Characteristics of Agent       12         3.3.3.       Rational Vs Logical       13         3.4.       Summary       18         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1.       Introduction       19         4.2.       Proposed Approach       19         4.2.1       Hypothesis       19         4.2.2       Users       20         4.2.3       Input       20         4.2.4       Process       20         4.2.5       Output       20         4.3.       Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1.       Introduction       21	1.5.	Summary	
2.1.       Introduction       4         2.2.       Different Technologies       4         2.3.       Different Test Beds       7         2.4.       Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1.       Introduction       9         3.2.       Hidden Markov Model       9         3.3.       Agent Technology       11         3.3.1.       Agent Concept       12         3.3.2.       Characteristics of Agent       12         3.3.3.       Rational Vs Logical       13         3.4.       Summary       18         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1.       Introduction       19         4.2.       Proposed Approach       19         4.2.1       Hypothesis       19         4.2.2       Users       20         4.2.3       Input       20         4.2.4       Process       20         4.2.5       Output       20         4.3.       Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1.       Introduction       21	Chapter 2	Current trends in human behaviour modelling	4
2.3. Different Test Beds       7         2.4. Summary       8         Chapter 3 Technologies for modelling human behaviours         3.1. Introduction       9         3.2. Hidden Markov Model       9         3.3. Agent Technology       11         3.3.1 Agent Concept       12         3.3.2 Characteristics of Agent       12         3.3.3 Rational Vs Logical       13         3.4. Summary       18         Chapter 4 Agent based dynamic human behaviour modelling         4.1. Introduction       19         4.2. Proposed Approach       19         4.2.1 Hypothesis       19         4.2.2 Users       20         4.2.3 Input       20         4.2.4 Process       20         4.2.5 Output       20         4.3. Summary       20         Chapter 5 Design of dynamic human behaviour agent         5.1. Introduction       21         5.2. Data Record       21         5.3. Cleaning and Data Clustering       27         5.4. Apply the Behaviours       28			4
2.4. Summary 8  Chapter 3 Technologies for modelling human behaviours 9 3.1. Introduction 9 3.2. Hidden Markov Model 9 3.3. Agent Technology 11 3.3.1 Agent Concept 12 3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 13 3.4 Agent Programs 14 3.4. Summary 18  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 19 4.2. Proposed Approach 19 4.2.1 Hypothesis 19 4.2.2 Users 20 4.2.3 Input 4.2.4 Process 4.2.5 Output 20 4.3. Summary 20  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 21 5.2. Data Record 21 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours 28	2.2.	Different Technologies	4
Chapter 3 Technologies for modelling human behaviours   3.1.	2.3.	Different Test Beds	7
3.1. Introduction 3.2. Hidden Markov Model 3.3. Agent Technology 3.3.1 Agent Concept 3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 3.3.4 Agent Programs 14 3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 4.3. Summary  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 21 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours	2.4.	Summary	
3.1. Introduction 3.2. Hidden Markov Model 3.3. Agent Technology 3.3.1 Agent Concept 3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 3.3.4 Agent Programs 14 3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 4.3. Summary  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 21 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours	Chapter 3	Technologies for modelling human behaviours	9
3.2. Hidden Markov Model  3.3. Agent Technology 3.3.1 Agent Concept 3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 3.3.4 Agent Programs 14 3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 20 4.3. Summary  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours			
3.3. Agent Technology 3.3.1 Agent Concept 3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 3.3.4 Agent Programs 14 3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 4.3. Summary  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 21 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours	3.2.	Hidden Markov Model	
3.3.1 Agent Concept 3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 3.3.4 Agent Programs 14 3.4. Summary 18  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 20 4.3. Summary 20  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours	3.3.	Agent Technology	
3.3.2 Characteristics of Agent 3.3.3 Rational Vs Logical 3.3.4 Agent Programs  3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 4.3. Summary  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours  12 3.3.4 Agent Programs 14 19 19 19 19 19 19 19 19 19 19 19 19 19		3.3.1 Agent Concept	
3.3.3 Rational Vs Logical 3.3.4 Agent Programs  3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling 4.1. Introduction 4.2. Proposed Approach 4.2.1 Hypothesis 4.2.2 Users 4.2.3 Input 4.2.4 Process 4.2.5 Output 20 4.3. Summary  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours  13 14 14 15 16 17 18 19 19 19 19 19 19 19 19 19 19 19 19 19		3.3.2 Characteristics of Agent	
3.3.4 Agent Programs  3.4. Summary  Chapter 4 Agent based dynamic human behaviour modelling  4.1. Introduction  4.2. Proposed Approach  4.2.1 Hypothesis  4.2.2 Users  4.2.3 Input  4.2.4 Process  4.2.5 Output  20  4.3. Summary  Chapter 5 Design of dynamic human behaviour agent  5.1. Introduction  5.2. Data Record  5.3. Cleaning and Data Clustering  5.4. Apply the Behaviours  21  28		3.3.3 Rational Vs Logical	
3.4. Summary       18         Chapter 4 Agent based dynamic human behaviour modelling       19         4.1. Introduction       19         4.2. Proposed Approach       19         4.2.1 Hypothesis       19         4.2.2 Users       20         4.2.3 Input       20         4.2.4 Process       20         4.2.5 Output       20         4.3. Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1. Introduction       21         5.2. Data Record       21         5.3. Cleaning and Data Clustering       27         5.4. Apply the Behaviours       28			
4.1. Introduction       19         4.2. Proposed Approach       19         4.2.1 Hypothesis       19         4.2.2 Users       20         4.2.3 Input       20         4.2.4 Process       20         4.2.5 Output       20         4.3. Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1. Introduction       21         5.2. Data Record       21         5.3. Cleaning and Data Clustering       27         5.4. Apply the Behaviours       28	3.4.	Summary	18
4.1. Introduction       19         4.2. Proposed Approach       19         4.2.1 Hypothesis       19         4.2.2 Users       20         4.2.3 Input       20         4.2.4 Process       20         4.2.5 Output       20         4.3. Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1. Introduction       21         5.2. Data Record       21         5.3. Cleaning and Data Clustering       27         5.4. Apply the Behaviours       28	Chapter 4	Agent based dynamic human behaviour modelling	19
4.2. Proposed Approach       19         4.2.1 Hypothesis       19         4.2.2 Users       20         4.2.3 Input       20         4.2.4 Process       20         4.2.5 Output       20         4.3. Summary       20         Chapter 5 Design of dynamic human behaviour agent       21         5.1. Introduction       21         5.2. Data Record       21         5.3. Cleaning and Data Clustering       27         5.4. Apply the Behaviours       28		<u> </u>	19
4.2.1 Hypothesis 4.2.2 Users 20 4.2.3 Input 20 4.2.4 Process 4.2.5 Output 20 4.3. Summary 20  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours 21 22	4.2.	Proposed Approach	
4.2.2 Users 4.2.3 Input 20 4.2.4 Process 4.2.5 Output 20 4.3. Summary 20  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 21 5.2. Data Record 21 5.3. Cleaning and Data Clustering 27 5.4. Apply the Behaviours 20  21 22 23 24 25 26 27 28 28			
4.2.3 Input 4.2.4 Process 20 4.2.5 Output 20 4.3. Summary 20  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours 22  28		4.2.2 Users	
4.2.5 Output  4.3. Summary  Chapter 5 Design of dynamic human behaviour agent  5.1. Introduction  5.2. Data Record  5.3. Cleaning and Data Clustering  5.4. Apply the Behaviours  20  21  21  22  23  24  25  26  27  27  28		4.2.3 Input	20
4.3. Summary 20  Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 21 5.2. Data Record 21 5.3. Cleaning and Data Clustering 27 5.4. Apply the Behaviours 28		4.2.4 Process	20
Chapter 5 Design of dynamic human behaviour agent 5.1. Introduction 5.2. Data Record 5.3. Cleaning and Data Clustering 5.4. Apply the Behaviours 21 27 28		4.2.5 Output	20
<ul> <li>5.1. Introduction</li> <li>5.2. Data Record</li> <li>5.3. Cleaning and Data Clustering</li> <li>5.4. Apply the Behaviours</li> </ul>	4.3.	Summary	20
<ul> <li>5.1. Introduction</li> <li>5.2. Data Record</li> <li>5.3. Cleaning and Data Clustering</li> <li>5.4. Apply the Behaviours</li> </ul>	Chapter 5	Design of dynamic human behaviour agent	21
<ul> <li>5.2. Data Record</li> <li>5.3. Cleaning and Data Clustering</li> <li>5.4. Apply the Behaviours</li> <li>21</li> <li>27</li> <li>28</li> </ul>			
<ul><li>5.3. Cleaning and Data Clustering</li><li>5.4. Apply the Behaviours</li><li>27</li><li>28</li></ul>	5.2.	Data Record	
5.4. Apply the Behaviours 28	5.3.	Cleaning and Data Clustering	27
	5.4.		
	5.5.	Summary	29

Chapter 6 Implementation		30
6.1.	Introduction	30
6.2.	Implementation	30
6.2.1	Data Recording	31
6.2.2	Data Processing	32
6.2.3	Apply Behaviours Through Communication	37
6.3.	Summary	39
Chapter 7	Evaluation	40
7.1.	Introduction	40
7.2.	Human like NPC Behaviours	40
7.3.	The Time Spent for Achieving the Target	43
7.4	Summary	43
Chapter 8	Conclusion and Further work	44
8.1.	Introduction	44
8.2.	General Discussion	44
8.3.	Findings	45
8.4	Limitations	45
8.5	Further Work	46
8.6	Conclusion	46
Reference	s	48
Appendix	A	51
Annendiy R		(2)

# **List of Figures**

	Page
Figure 3.1: Probabilistic parameters of a discrete hidden Markov model	10
Figure 3.2: Diagram of simple reflex agent	15
Figure 3.3: Diagram of model based agent	16
Figure 3.4: Diagram of goal based agent	17
Figure 3.5: Diagram of utility based agent	17
Figure 5.1: Top level design diagram of the system	21
Figure 5.2: Possible discrete states for the player	23
Figure 5.3: 'Critical' observation status	23
Figure 5.4: Areas to be considered for observations	23
Figure 5.5: 'Covered' observation status	24
Figure 5.6: 'LeftCovered' observation status	24
Figure 5.7: 'RightCritical' observation status	24
Figure 5.8: 'RightCovered' observation status	24
Figure 5.9: Top level architecture for the phase 1	25
Figure 5.10: Action transitions	26
Figure 5.11: Caclulate HMMs	26
Figure 5.12: Top level architecture for the phase 3	28
Figure 6.1: Main components of the implementation	30
Figure 6.2: Sequential data records at each time step	31
Figure 6.3: Representation of the data segment	31
Figure 6.4: NPC communicate and determine the actions based on the obse	rvations
	38
Figure 6.5: Rule class in Java application	38

