

# CONTENTS

1	INTRODUCTION	
1.1	Early Lifecycle Software Design .....	1
1.2	Computational Intelligence .....	5
1.3	Research Contributions .....	7
2	BACKGROUND	
2.1	Software Design	
2.1.1	The Design Process .....	10
2.1.2	Conventional Tool Support .....	19
2.2	Computational Intelligence Complementary to Early Lifecycle Design	24
2.3	Search Based Software Engineering .....	35
3	PROPOSED EVOLUTIONARY SEARCH	
3.1	Representation .....	42
3.2	Quantitative Fitness Functions .....	52
3.3	Selection .....	54
3.4	Crossover .....	55
3.5	Mutation .....	57
3.6	Conclusions .....	58
4	METHODOLOGY	
4.1	Research Aims – Revisited .....	59
4.2	Organization of Investigation .....	59
4.3	Strategy .....	60
4.3.1	Local Search .....	62
4.3.2	Global Search .....	63
4.3.3	Empirical Investigation .....	64
4.3.4	Qualitative Elegance .....	66
4.4	Example Software Design Problem Specifications .....	68
4.4.1	Cinema Booking System .....	68
4.4.2	Graduate Development Program .....	69
4.4.3	Select Cruises .....	71
5	EXPERIMENT: LOCAL SEARCH	
5.1	Background .....	74
5.2	Methodology .....	76

5.3	Results .....	77
5.4	Analysis .....	81
5.5	Dynamic Parameter Control .....	83
5.6	Methodology .....	87
5.7	Results .....	89
5.8	Analysis .....	98
5.9	Conclusions .....	102
6	<b>EXPERIMENT: GLOBAL SEARCH</b>	
6.1	Background .....	104
6.2	Methodology .....	105
6.3	Results .....	107
6.4	Analysis .....	108
6.5	Zone Isolator Agent .....	110
6.6	Methodology .....	111
6.7	Findings and Analysis .....	112
6.8	Conclusions .....	116
7	<b>EXPERIMENT: EMPIRICAL INVESTIGATION</b>	
7.1	Background .....	118
7.2	Software Design Problem Domain .....	120
7.3	Method and Empirical Investigation Design .....	121
7.4	Observation and Data Collection .....	123
7.5	Results .....	125
	7.5.1 Duration .....	125
	7.5.2 Software Designs Produced .....	125
	7.5.3 Event Log .....	125
	7.5.4 Comparison of Design Episodes .....	127
	7.5.5 Human Experience .....	131
7.6	Analysis .....	131
7.7	Threats to Validity .....	133
7.8	Conclusions .....	133
8	<b>EXPERIMENT: QUALITATIVE EVALUATION</b>	
8.1	Background .....	135
8.2	Proposed Approach .....	137
	8.2.1 Quantitative Elegance Measures .....	137

8.2.2	Role of Quantitative Elegance Measures .....	139
8.2.3	Elegance Agent and Dynamic Multi-objective Search .....	140
8.2.4	Dynamic Fitness Proportionate Interactive Interval .....	143
8.2.5	Overview of Proposed Approach .....	144
8.3	Methodology .....	145
8.4	Results .....	148
8.4.1	Baseline Elegance Investigations .....	148
8.4.2	Designer Interaction and the Dynamic Interactive Interval .....	155
8.4.3	External Coupling .....	159
8.4.4	Reward .....	161
8.4.5	Elegance and Dynamic Multi-objective Search .....	166
8.4.6	Human Experience .....	171
8.5	Conclusions .....	173
9	CONCLUSIONS	
9.1	Representation .....	177
9.2	Exploration and Exploitation of Software Design Search Space .....	178
9.3	Collaborative Designer / Computer Interaction .....	178
9.4	Elegance and Dynamic Multi-objective Localised Search .....	179
9.5	Overall .....	181
	REFERENCES.....	183
	APPENDIX A - Transcript of Baseline Design Episode of Empirical Investigation	
	APPENDIX B - Transcript of Test Episode for Empirical Investigation	
	APPENDIX C - Empirical Investigation: Participant Suggested Enhancements for Interactive Framework	
	APPENDIX D - Representative Examples of Early Lifecycle Software Designs	
	APPENDIX E – Interaction Data and Analysis for Qualitative Elegance Investigations	
	APPENDIX F – Participant comments for Qualitative Elegance Investigations	
	APPENDIX G – Use Case Specifications for Cinema Booking System	
	APPENDIX H – Use Case Specifications for Graduate Development Program	
	APPENDIX I – Use Case Specifications for Select Cruises	

## LIST OF FIGURES

Figure 2.1. Model of Design Problems (Lawson, 2006) .....	11
Figure 2.2. Thought Process of a Designer (Roozenburg and Eekels, 1995) .....	14
Figure 3.1. Example Class Diagram in UML Representation .....	43
Figure 3.2. Example of Design Problem and Design Solution Representation .....	49
Figure 3.3. Example of a Design Solution Representation.....	49
Figure 3.4. UML Diagram of Design Solution Representation Structure .....	50
Figure 3.5. Example of Trans-Positional Crossover (TPX) .....	56
Figure 3.6. Examples of Mutation .....	58
Figure 4.1. Cinema Booking System Manual Design .....	68
Figure 4.2. Graduate Development Program Manual Design .....	70
Figure 4.3. Select Cruises Manual Design .....	72
Figure 5.1. Flowcharts of GA-inspired and EP-inspired Evolutionary Processes .....	75
Figure 5.2. Population Average COM Cohesion Fitness Curves .....	78
Figure 5.3. Population Average External Coupling Fitness Curves .....	78
Figure 5.4. Example Software Design Visualisation with Three Classes .....	80
Figure 5.5. Example Software Design Visualisation with Four Classes .....	80
Figure 5.6. Example Software Design Visualisation with Five Classes .....	80
Figure 5.7. Flowchart of Evolutionary Process for Local Search .....	85
Figure 5.8. Baseline Average Population Fitness .....	90
Figure 5.9. Baseline Population Average Number of Mutation Attempts .....	90
Figure 5.10. Baseline Average Population Mutation Probabilities .....	91
Figure 5.11. Annealing Average Population Fitness .....	92
Figure 5.12. Annealing Average Number of Mutation Attempts .....	92
Figure 5.13. Annealing Average Population Mutation Probabilities .....	93
Figure 5.14. Rechenberg Average Population Fitness .....	94
Figure 5.15. Rechenberg Average Number of Mutation Attempts .....	94
Figure 5.16. Rechenberg Average Population Mutation Probabilities .....	95
Figure 5.17. Self-adaptive Average Population Fitness .....	96
Figure 5.18. Self-adaptive Average Number of Mutation Attempts .....	96
Figure 5.19. Self-adaptive Average Population Mutation Probabilities .....	97
Figure 5.20. Average Population Fitness for CBS .....	100
Figure 5.21. Average Population Fitness for GDP .....	100

Figure 5.22. Average Population Fitness for SC .....	101
Figure 6.1. Non-dominated Sorting Evolutionary Algorithm .....	106
Figure 6.2. Typical Single Run Population after 50 Generations .....	107
Figure 6.3. Typical Single Run Population after 100 generations .....	107
Figure 6.4. Typical Single Run Population after 200 generations .....	108
Figure 6.5. Typical Single Run Population after 300 generations .....	108
Figure 6.6. Average Population Utility for Cinema Booking System .....	113
Figure 6.7. Average Population Utility for Select Cruises .....	113
Figure 7.1. Design Modes for Baseline Episode .....	127
Figure 7.2. Design Modes for Test Episode .....	127
Figure 7.3. Design Activities for Baseline Episode .....	128
Figure 7.4. Design Activities for Test Episode .....	128
Figure 7.5. Design Events for Baseline Episode .....	129
Figure 7.6. Design Events for Test Episode .....	129
Figure 8.1. Flow Chart of Dynamic Multi-objective Interactive Evolutionary Search	143
Figure 8.2. Best, Average and Worst Elegance 1 Values for CBS .....	149
Figure 8.3. Best, Average and Worst Elegance 2 Values for CBS .....	149
Figure 8.4. Best, Average and Worst Elegance 3 Values for CBS .....	150
Figure 8.5. Best, Average and Worst Elegance 4 Values for CBS .....	150
Figure 8.6. Best, Average and Worst Elegance 1 Values for GDP .....	151
Figure 8.7. Best, Average and Worst Elegance 2 Values for GDP .....	151
Figure 8.8. Best, Average and Worst Elegance 3 Values for GDP .....	152
Figure 8.9. Best, Average and Worst Elegance 4 Values for GDP .....	152
Figure 8.10. Best, Average and Worst Elegance 1 Values for SC .....	153
Figure 8.11. Best, Average and Worst Elegance 2 Values for SC .....	153
Figure 8.12. Best, Average and Worst Elegance 3 Values for SC .....	154
Figure 8.13. Best, Average and Worst Elegance 4 Values for SC .....	154
Figure 8.14. Average Number of Evolutionary Generations at Design Halting .....	157
Figure 8.15. Average Number of Interactions for various Interval Constant Values ..	158
Figure 8.16. Average Population Coupling for various Interval Constant Values .....	160
Figure 8.17. Average Total Reward at each Interaction for Various Values of Interval Constant with Cinema Booking System .....	162
Figure 8.18. Average Total Reward at each Interaction for Various Values of Interval Constant with Graduate Development Program .....	162

Figure 8.19. Average Total Reward at each Interaction for Various Values of Interval Constant with Select Cruises .....	163
Figure 8.20. Stacked Histogram of Typical Elegance Selection Weights for the Cinema Booking System, interval constant = 25 .....	167
Figure 8.21. Stacked Histogram of Typical Elegance Selection Weights for the Graduate Development Program, interval constant = 35 .....	168
Figure 8.22. Stacked Histogram of Typical Elegance Selection Weights for Select Cruises, interval constant = 40 .....	168
Figure 8.23. Example 1 of Quantitative Elegance Measures during a Design Episode for Cinema Booking System, interval constant = 25 .....	169
Figure 8.24. Example 2 of Quantitative Elegance Measures during a Design Episode for Cinema Booking System, interval constant = 25 .....	170

## LIST OF TABLES

Table 2.1. Examples of Reports of IEC and Machine Learning .....	34
Table 3.1. $ S $ as a function of the number of attributes, $a$ , the number of methods, $m$ , and the number of classes, $c$ .....	52
Table 4.1. Cohesion Values of Manual Design for CBS .....	69
Table 4.2. Cohesion Values of Manual Design for GDP .....	70
Table 4.3. Cohesion Values of Manual Design for SC .....	73
Table 5.1. Search Average Run Times (seconds) .....	79
Table 5.2. Search Average Population Fitness Search Results .....	79
Table 5.3. Plateau Mean Population Coupling Fitness .....	98
Table 5.4. Cinema Booking System T-Test Actual Confidence Levels for Means .....	98
Table 5.5. Graduate Development Program T-Test Actual Confidence Levels for Means .....	99
Table 5.6. Select Cruises T-Test Actual Confidence Levels for Means .....	99
Table 5.7. Average Execution Time for Run of 500 Generations .....	102
Table 6.1. Slope and Intercept for Utility Values .....	113
Table 6.2. Zone Isolation Tactics Results for Cinema Booking System .....	115
Table 6.3. Zone Isolation Tactics Results for Select Cruises .....	115
Table 7.1 Observational Data .....	130
Table 8.1. Interaction Intervals in Generations for various Interval Constants .....	145
Table 8.2. Trial Participant Information .....	146
Table 8.3. Comparison of Average Number of Interactions for Design Problems .....	155
Table 8.4. T-test Actual Confidence Levels for Average Number of Interactions .....	156
Table 8.5. Average Number of Generations at Designer Halting for Various Values of Interval Constant .....	156
Table 8.6. Average Population Coupling Fitness for various Interval Constant Values .....	160
Table 8.7. Mean Reward for Individual Elegance Measures, Cinema Booking System .....	164
Table 8.8. T-test Actual Confidence Levels for Comparisons of Mean Reward for Cinema Booking System .....	164
Table 8.9. Mean Reward for Individual Elegance Measures, Graduate Development Program .....	165

Table 8.10. T-test Actual Confidence Levels for Comparison of Mean Reward for Graduate Development Program .....	165
Table 8.11. Mean Reward for Individual Elegance Measures, Select Cruises .....	165
Table 8.12. T-test Actual Confidence Levels for Comparison of Mean Reward for Select Cruises .....	165
Table 8.13. Evolutionary Generation Selection Weightings at Design Halting shown in Figures 9.9, 9.10 and 9.11 .....	169



## LIST OF PUBLICATIONS

This research has generated the following publications:

- Simons, C.L., Parmee, I.C. and Gwynllyw, R. (2010) "Interactive, Evolutionary Search in Upstream Object-Oriented Class Design", *IEEE Transactions on Software Engineering*, vol. 36, no. 6, pp. 798-816.
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