

# A Trust-Aware Framework for Service Selection and Service Quality Review in e-Business Ecosystems

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*Submitted by*  
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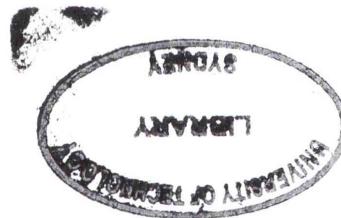
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# Certificate of Authorship/Originality

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I also certify that the thesis has been written by me. Any help that I have received in my research work and the preparation of the thesis itself has been acknowledged. In addition, I certify that all information sources and literature used are indicated in the thesis.



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# Contents

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<i>Certificate of Authorship/Originality</i> .....	2
<i>Acknowledgements</i> .....	3
<i>Contents</i> .....	4
<i>Figures</i> .....	10
<i>Tables</i> .....	12
<i>Listings</i> .....	14
<i>Abstract</i> .....	15
<i>List of Publications</i> .....	16

<b><i>Chapter 1 Introduction</i></b> .....	<b>1</b>
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<b>1.1</b> <b>Introduction</b> .....	<b>1</b>
<b>1.2</b> <b>Thesis Background and Motivation</b> .....	<b>1</b>
1.2.1 <i>History of the Internet and e-Business</i> .....	1
1.2.2 <i>Challenges for Digital Business Ecosystems</i> .....	4
1.2.3 <i>Motivation for Decentralised Service Registration</i> .....	7
1.2.4 <i>Risks in the Digital Economy</i> .....	8
<b>1.3</b> <b>The Importance of Trust in Digital Business Networks</b> .....	<b>10</b>
<b>1.4</b> <b>Objectives of this Thesis</b> .....	<b>14</b>
<b>1.5</b> <b>Contribution and Scope of the Thesis</b> .....	<b>15</b>
<b>1.6</b> <b>Significance of the Thesis</b> .....	<b>17</b>
<b>1.7</b> <b>Structure of Thesis</b> .....	<b>18</b>
<b>1.8</b> <b>Conclusion</b> .....	<b>19</b>
<b>1.9</b> <b>References</b> .....	<b>20</b>

<b><i>Chapter 2 Evaluation of Existing Literature</i></b> .....	<b>23</b>
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<b>2.1</b> <b>Introduction</b> .....	<b>23</b>
<b>2.2</b> <b>Definitions of Trust and Reputation Concepts</b> .....	<b>24</b>
2.2.1 <i>Trust Concepts in Digital Ecosystems</i> .....	24
2.2.2 <i>Reputation Concepts in Digital Ecosystems</i> .....	26
<b>2.3</b> <b>Trust and Reputation Management Protocols</b> .....	<b>27</b>
<b>2.4</b> <b>Computational Models for Trust and Reputation-Based Decision Support</b> .....	<b>29</b>
2.4.1 <i>Critical Aspects for Review</i> .....	31
2.4.2 <i>Deterministic Models</i> .....	33
2.4.3 <i>Probability-based Entity Assessment Models</i> .....	38
2.4.3.1 <i>Bayesian Inference</i> .....	38
2.4.3.2 <i>Dempster-Shafer Theory</i> .....	40
2.4.4 <i>Fuzzy Logic-based Models</i> .....	42
2.4.5 <i>Socio-Cognitive Approaches</i> .....	46
<b>2.5</b> <b>Trust or Reputation-Aware Architectures</b> .....	<b>48</b>
2.5.1 <i>Critical Aspects for Review</i> .....	48
2.5.2 <i>Community Formation based on Network Security</i> .....	49

2.5.3	<i>Community Formation based on Behavioural Trust Elements</i> .....	51
<b>2.6</b>	<b>Summarising Identified Problems</b> .....	<b>52</b>
2.6.1	<i>General Shortcomings of Trust and Reputation Models</i> .....	53
2.6.2	<i>Lack of Trust and Reputation-aware Architectures for Distributed Communities</i> .....	55
<b>2.7</b>	<b>Conclusion</b> .....	<b>56</b>
<b>2.8</b>	<b>References</b> .....	<b>57</b>
<b>Chapter 3 Problem Definition</b> .....		<b>67</b>
<b>3.1</b>	<b>Introduction</b> .....	<b>67</b>
<b>3.2</b>	<b>General Concepts &amp; Definitions</b> .....	<b>68</b>
3.2.1	<i>Service</i> .....	68
3.2.2	<i>Product</i> .....	69
3.2.3	<i>Agent</i> .....	69
3.2.3.1	<i>Human Agent</i> .....	70
3.2.3.2	<i>Software Agent</i> .....	70
3.2.4	<i>Context</i> .....	70
<b>3.3</b>	<b>Digital Business Concepts</b> .....	<b>70</b>
3.3.1	<i>E-Commerce</i> .....	71
3.3.2	<i>E-Market</i> .....	71
3.3.3	<i>E-Business</i> .....	71
3.3.4	<i>Digital Business Ecosystem</i> .....	71
<b>3.4</b>	<b>E-Business Participants</b> .....	<b>72</b>
3.4.1	<i>Consumer</i> .....	72
3.4.2	<i>Business Partner</i> .....	72
3.4.2.1	<i>Business Service Providers &amp; Manufacturers</i> .....	72
3.4.2.2	<i>Service Broker</i> .....	72
3.4.2.3	<i>Service Reseller &amp; Retailer</i> .....	73
3.4.3	<i>Business Domain</i> .....	73
3.4.4	<i>Business Alliance</i> .....	73
3.4.5	<i>Business Domain Connector</i> .....	74
<b>3.5</b>	<b>Behavioural Trust Elements</b> .....	<b>74</b>
3.5.1	<i>Trust</i> .....	74
3.5.1.1	<i>Trusting Agent</i> .....	76
3.5.1.2	<i>Trusted Agent</i> .....	76
3.5.1.3	<i>Willingness</i> .....	76
3.5.1.4	<i>Capability</i> .....	76
3.5.2	<i>Reputation</i> .....	76
3.5.2.1	<i>Reputation Query</i> .....	77
3.5.2.2	<i>Witness Reputation Opinion</i> .....	77
3.5.2.3	<i>Witness Agent</i> .....	77
3.5.2.4	<i>Reputation Queried Entity</i> .....	77
3.5.3	<i>Credibility</i> .....	77
3.5.4	<i>Confidence</i> .....	78
3.5.5	<i>Trend</i> .....	78
3.5.6	<i>Suitability/Matching</i> .....	78
3.5.7	<i>Satisfiability</i> .....	79
3.5.8	<i>Quality of Service</i> .....	79
<b>3.6</b>	<b>Problem Definition</b> .....	<b>79</b>
3.6.1	<i>Definition of Central Problem</i> .....	79

3.6.2	<i>Additional Identified Issues and Challenges</i> .....	80
3.6.2.1	<i>Trust-based, Transparent and Autonomous Formation of Business Network</i> .....	80
3.6.2.2	<i>Trust-based Decision Support</i> .....	81
3.6.2.3	<i>Information Access &amp; Ownership</i> .....	81
3.6.2.4	<i>Fairness &amp; Transparency</i> .....	81
3.6.2.5	<i>Openness</i> .....	82
3.6.2.6	<i>Scalability &amp; Fault Tolerance</i> .....	83
3.6.2.7	<i>Infrastructure &amp; Real-Time Aspects</i> .....	83
3.6.2.8	<i>Interoperability</i> .....	83
3.6.2.9	<i>Addressing Malicious Behaviour</i> .....	84
<b>3.7</b>	<b>Selection of Solution Approach</b> .....	<b>84</b>
3.7.1	<i>Architecture</i> .....	85
3.7.1.1	<i>Choice of Architectural Style for e-Business Networks</i> .....	85
3.7.1.2	<i>Choice of Message Formats</i> .....	87
3.7.2	<i>Choice of Assessment Methodology for Trust, Reputation &amp; Credibility</i> .....	88
<b>3.8</b>	<b>Research Methodology</b> .....	<b>89</b>
<b>3.9</b>	<b>Conclusion</b> .....	<b>91</b>
<b>3.10</b>	<b>References</b> .....	<b>91</b>
<b>Chapter 4 Definition of Architecture</b> .....		<b>94</b>
<b>4.1</b>	<b>Introduction</b> .....	<b>94</b>
<b>4.2</b>	<b>The DEco Arch Framework</b> .....	<b>95</b>
4.2.1	<i>Motivation for Decentralised Architecture</i> .....	95
4.2.2	<i>Architecture</i> .....	98
4.2.3	<i>The Business Domain Connector Agent</i> .....	110
<b>4.3</b>	<b>Service Discovery &amp; Matching</b> .....	<b>112</b>
<b>4.4</b>	<b>Business Domain Evolution</b> .....	<b>113</b>
4.4.1	<i>A Business Service Provider Agent joins an existing Business Domain (Service Registration)</i> .....	114
4.4.2	<i>A Business Service Provider establishes a new Business Domain</i> .....	115
4.4.3	<i>Reputation Review of Business Service Providers within a Business Domain</i> .....	115
4.4.4	<i>Business Domain Voting Criteria and Procedures</i> .....	116
<b>4.5</b>	<b>Global Business Interaction Choreography</b> .....	<b>118</b>
<b>4.6</b>	<b>Addressing Malicious Behaviour in Digital Business Ecosystems</b> .....	<b>120</b>
4.6.1	<i>Identity Fraud</i> .....	121
4.6.2	<i>Dishonest Opinions</i> .....	122
4.6.3	<i>Fake Ratings</i> .....	122
4.6.4	<i>Shilling</i> .....	123
4.6.5	<i>Man in the Middle Attack</i> .....	123
<b>4.7</b>	<b>Conclusion</b> .....	<b>124</b>
<b>4.8</b>	<b>References</b> .....	<b>125</b>
<b>Chapter 5 Fuzzy Business Partner Assessment and Selection</b> .....		<b>128</b>
<b>5.1</b>	<b>Introduction</b> .....	<b>128</b>
<b>5.2</b>	<b>Criteria and Relationships Assessed during Business Partner Trustworthiness Assessment</b> .....	<b>130</b>
5.2.1	<i>Additional Advantages of Individual Business Partner Element Assessment</i> .....	131
5.2.2	<i>Trustworthiness Assessment</i> .....	133
5.2.2.1	<i>Direct Reputation</i> .....	134

5.2.2.2	<i>Indirect Reputation</i> .....	134
5.2.2.3	<i>Credibility</i> .....	135
5.2.3	<i>Business Partner Satisfiability</i> .....	136
5.3	<b>Choice of Fuzzy Logic for Reputation, Credibility and Trustworthiness Assessment</b> .....	137
5.4	<b>Business Trustworthiness Assessment</b> .....	138
5.4.1	<i>Opinion Aggregation</i> .....	140
5.4.2	<i>Trend Calculation</i> .....	143
5.4.3	<i>Confidence Calculation</i> .....	145
5.4.4	<i>Direct Trust, Reputation and Credibility Inference (DEco Arch Stage 1)</i> .....	146
5.4.5	<i>Trustworthiness Inference (DEco Arch Stage 2)</i> .....	147
5.5	<b>Business Partner Selection</b> .....	148
5.5.1	<i>Satisfiability Assessment (DEco Arch Stage 3)</i> .....	149
5.5.2	<i>Business Selection</i> .....	150
5.6	<b>Conclusion</b> .....	150
5.7	<b>References</b> .....	151
	<b>Chapter 6 Business Interaction Review and Trust Adjustment</b> .....	153
6.1	<b>Introduction</b> .....	153
6.2	<b>Motivation</b> .....	154
6.3	<b>Fuzzy Extension of CCCI Metrics</b> .....	155
6.3.1	<i>Commitment to a Criterion</i> .....	157
6.3.2	<i>Clarity of a Criterion</i> .....	159
6.3.3	<i>Influence of a Criterion</i> .....	160
6.4	<b>Review of Business Transactions</b> .....	162
6.5	<b>Adjustment of Behavioural Trust Elements</b> .....	165
6.5.1	<i>Direct Reputation Value Adjustment</i> .....	165
6.5.2	<i>Adjustment of Direct Trust Value, Indirect Reputation Value and Witness Credibility Value</i> .....	170
6.6	<b>Conclusion</b> .....	172
6.7	<b>References</b> .....	173
	<b>Chapter 7 Case Study</b> .....	174
7.1	<b>Introduction</b> .....	174
7.2	<b>Case Study Context and Requirements Description</b> .....	175
7.3	<b>Business Network Architecture</b> .....	176
7.4	<b>Business Partner Selection Process Details</b> .....	177
7.4.1	<i>Step 1: Initialise Agent &amp; Load User Preferences</i> .....	178
7.4.2	<i>Step 2: Find all Registered Business Domain Connectors</i> .....	180
7.4.3	<i>Step 3: Select most suitable Business Domains and request Business Service Provider Contact Details from Business Domain Connector</i> .....	182
7.4.4	<i>Step 4: Contact suitable BPAs or Alliances directly and request Offer</i> .....	184
7.4.5	<i>Step 5: Query Witness Agents for Opinions about Potential Business Partners</i> .....	187
7.4.6	<i>Step 6: Calculate Weighted Reputation Values</i> .....	190
7.4.7	<i>Step 7: Calculate Business Element Reputation Values, Direct Trust Value and the Credibility Value for each Potential Business Partner</i> .....	192
7.4.8	<i>Step 8: Calculate Overall Business Partner Trustworthiness and select most Satisfiable Business Partner</i> .....	195

<b>7.5</b>	<b>Business Interaction Review.....</b>	<b>196</b>
7.5.1	<i>Review of Business Transaction .....</i>	197
7.5.2	<i>Adjustment of Direct Trust Value, Indirect Reputation Value and Witness Credibility value .....</i>	199
<b>7.6</b>	<b>Conclusion.....</b>	<b>201</b>
<b>7.7</b>	<b>References .....</b>	<b>202</b>
<b>Chapter 8 Validation and Verification of Empirical Results.....</b>		<b>204</b>
<b>8.1</b>	<b>Introduction.....</b>	<b>204</b>
<b>8.2</b>	<b>Experimentation Methodology and Evaluation Criteria .....</b>	<b>205</b>
8.2.1	<i>General Evaluation Criteria .....</i>	206
8.2.2	<i>Experimentation Principles.....</i>	208
8.2.3	<i>Issues in Experimenting with Behavioural Trust Models .....</i>	210
8.2.4	<i>Complexity of Comparative Experiments .....</i>	211
<b>8.3</b>	<b>Experimental Setup.....</b>	<b>212</b>
8.3.1	<i>Technical Simulation Environments.....</i>	213
8.3.2	<i>Simulation Environment Parameters .....</i>	213
8.3.3	<i>Configuration of Average-based Models to Support Comparison and Analysis in the Experiments.....</i>	217
8.3.4	<i>Validity and Reproducibility of the Experiments.....</i>	218
<b>8.4</b>	<b>Observations for Individual Business Partner Types.....</b>	<b>219</b>
8.4.1	<i>Static Business Partner Behaviour Configurations.....</i>	220
8.4.1.1	<i>Honest Business Partner Type .....</i>	220
8.4.1.2	<i>Cheating Business Partner Type.....</i>	223
8.4.2	<i>Dynamic Business Partner Behaviour Configurations.....</i>	225
8.4.2.1	<i>Random Business Partner Type .....</i>	225
8.4.2.2	<i>Alternating Business Partner Type .....</i>	227
8.4.2.3	<i>Cyclic Cheating Business Partner Type .....</i>	229
8.4.3	<i>Reputation and Credibility Assessment .....</i>	232
<b>8.5</b>	<b>Observations for Trustworthiness and Satisfiability Measures.....</b>	<b>234</b>
8.5.1	<i>DEco Arch Stage 2 Trustworthiness Value .....</i>	234
8.5.2	<i>DEco Arch Stage 3 Satisfiability Value .....</i>	238
<b>8.6</b>	<b>Other Considerations.....</b>	<b>242</b>
8.6.1	<i>Statistical Validation of DEco Arch Trustworthiness Assessment Criteria .....</i>	242
8.6.2	<i>Risk Settings in Fuzzy Logic Controllers.....</i>	246
8.6.3	<i>Resource Efficiency of the DEco Arch framework .....</i>	248
<b>8.7</b>	<b>Revisit of Evaluation Criteria .....</b>	<b>251</b>
<b>8.8</b>	<b>Conclusion.....</b>	<b>253</b>
<b>8.9</b>	<b>References .....</b>	<b>254</b>
<b>Chapter 9 Conclusion and Future Work .....</b>		<b>257</b>
<b>9.1</b>	<b>Introduction .....</b>	<b>257</b>
<b>9.2</b>	<b>Recapitulation of Research Contributions to the State of the Art.....</b>	<b>258</b>
9.2.1	<i>Architecture that supports Autonomous Formation of an e-Business Ecosystem.....</i>	258
9.2.2	<i>Methodology for Business Partner Assessment and Selection .....</i>	259
9.2.3	<i>Methodology for Business Interaction Review and Adjustment of Behavioural Trust Elements .....</i>	261
9.2.4	<i>Case Study and Empirical Results .....</i>	261
<b>9.3</b>	<b>Future Work and Research Directions.....</b>	<b>262</b>

9.3.1	<i>Ontological Representation of Behavioural Trust Concepts in Digital Business Ecosystems.....</i>	263
9.3.2	<i>Integration of Ontology Matchmaking Methodology into DEco Arch Service Discovery Model.....</i>	263
9.3.3	<i>Integration of the DEco Arch E-Business Framework into a Large Field Study.....</i>	263
9.3.4	<i>Fine-tuning and Auto Adjustment of Fuzzy Rule Bases.....</i>	264
9.3.5	<i>Reducing Bootstrapping Times for Business Partners entering the DEco Arch framework.....</i>	264
9.3.6	<i>Extension and Integration of Business Choreography (WS-CDL) into Field Study Environment.....</i>	265
9.4	<b>References .....</b>	<b>265</b>
<b>Appendix A      <i>Introduction to Fuzzy Logic .....</i></b>		<b>267</b>
A.1	<b>Fuzzy Set Theory .....</b>	<b>267</b>
A.2	<b>Fuzzy Rule Bases.....</b>	<b>269</b>
A.3	<b>Fuzzy Inference Methodologies .....</b>	<b>271</b>
A.4	<b>Fuzzy Expert System Example .....</b>	<b>272</b>
A.5	<b>References .....</b>	<b>274</b>
<b>Appendix B      <i>Fuzzy Inference Engines .....</i></b>		<b>275</b>
B.1	<b>DEco Arch Stage 1 FLC Controller Configuration.....</b>	<b>275</b>
B.2	<b>DEco Arch Stage 2 FLC Controller Configuration.....</b>	<b>277</b>
B.3	<b>DEco Arch Stage 3 FLC Controller Configuration.....</b>	<b>279</b>

# Figures

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Figure 1.1 – Adoption ladder of ICT for Business.....	6
Figure 1.2 – Roles in the elementary SOA .....	8
Figure 2.1 – Decision Tree [96].....	48
Figure 3.1 – A Systems Development Research approach (adapted from [27]) .....	90
Figure 4.1 – Example of the <i>DEco Arch</i> framework.....	100
Figure 4.2 – Layered view of the <i>DEco Arch</i> framework .....	102
Figure 4.3 – Integration of JXTA virtual network layer and <i>DEco Arch</i> business network layer with information data sources (DHT) layer .....	104
Figure 4.4 – Business partner selection and review in the <i>DEco Arch</i> framework from a service consumer perspective .....	106
Figure 4.5 – <i>DEco Arch</i> interaction sequence overview .....	109
Figure 5.1 – Business partner assessment and its influencing factors.....	131
Figure 5.2 – Influencing Factors for the Trust Concept.....	133
Figure 5.3 – Direct reputation and its influencing factors.....	134
Figure 5.4 – Indirect reputation and its influencing factors .....	135
Figure 5.5 – Satisfiability and its influencing factors .....	137
Figure 5.6 – Example fuzzy sets for trustworthiness, reputation or credibility values using triangular fuzzy membership functions.....	141
Figure 5.7 – Influence of $\alpha$ -denominator for rate of decay of opinions over time.....	142
Figure 5.8 – Example fuzzy sets for trend value using triangular fuzzy membership functions .....	144
Figure 5.9 – Example fuzzy sets for confidence value using triangular fuzzy membership functions.....	145
Figure 5.10 – <i>DEco Arch</i> (stage 1) reputation fuzzy inference module for business partner element .....	146
Figure 5.11 – <i>DEco Arch</i> (stage 2) business partner trustworthiness evaluation model .....	148
Figure 5.12 – Example fuzzy sets for service suitability and service cost factors using triangular fuzzy membership functions .....	149
Figure 5.13 – <i>DEco Arch</i> (stage 3) Business Partner Satisfiability Fuzzy Inference .....	150
Figure 6.1 – Business partner assessment cycle.....	154
Figure 6.2 – Fuzzy membership functions for commitment variable.....	159
Figure 6.3 – Fuzzy membership functions for the clarity variable.....	160
Figure 6.4 – Fuzzy membership functions for the influence variable .....	161
Figure 6.5 – Fuzzy membership functions for the output ‘service quality’ variable.....	162
Figure 6.6 – Fuzzy QoS calculation system architecture .....	164
Figure 6.7 – Functions for credibility increase, credibility decrease assuming minimal opinion fluctuation .....	169
Figure 6.8 – Direct reputation assessment & review cycle .....	170
Figure 6.9 – Complete trust, reputation and credibility assessment & review cycle.....	172
Figure 7.1 – Business Domains & Business Alliances applicable to case study .....	177

Figure 7.2 – Agent Task Configuration in the <i>DEco Arch</i> application .....	178
Figure 7.3 – Risk configuration in the <i>DEco Arch</i> application .....	179
Figure 7.4 – Fuzzy rule base editor in the <i>DEco Arch</i> application.....	180
Figure 7.5 – Extract from the <i>DEco Arch</i> stage 1 fuzzy inference process for reputation assessment of service business partner element.....	194
Figure 7.6 – Business review undertaken by the agent owner after the completion of the business interaction .....	198
Figure 8.1 – Simulation Setting Dialogue of the <i>DEco Arch</i> testbed.....	215
Figure 8.2 – Simulation results in the <i>DEco Arch</i> testbed application.....	217
Figure 8.3 – Direct trust value modelling of <i>VeryGood</i> (honest) potential business partner at cold start .....	221
Figure 8.4 – Direct trust value modelling of <i>VeryGood</i> (honest) potential business partner .....	222
Figure 8.5 – Direct trust value modelling of <i>VeryBad</i> (cheating) potential business partner .....	224
Figure 8.6 – Direct trust value modelling of <i>Neutral</i> potential business partner.....	226
Figure 8.7 – Direct trust value modelling of <i>Neutral</i> potential business partner with periods of consistent behaviour patterns .....	227
Figure 8.8 – Direct trust value modelling of potential business partner which alternates behaviour from <i>VeryGood</i> to <i>VeryBad</i> at half-time .....	229
Figure 8.9 – Direct trust value modelling of potential business partner which alternates its behaviour with a probability of 0.1 .....	231
Figure 8.10 – Direct trust value modelling of potential business partner which alternates its behaviour with a probability of 0.05 .....	232
Figure 8.11 – Direct Reputation Value Assessment for Alternating Business Partner Type .....	233
Figure 8.12 – Business Partner Trustworthiness Assessment for 6 Potential Business Partners with Different Behaviour Patterns and Different Historic Records.....	237
Figure 8.13 – Business Partner Trustworthiness Assessment for 7 Potential Business Partners with Different Behaviour Patterns and Similar Historic Records.....	238
Figure 8.14 – Business Partner Satisfiability Assessment for 6 Potential Business Partners with Different Behaviour Patterns and Historic Records.....	239
Figure 8.15 – Fuzzy Rule Base Surface Visualisation ( <i>DEco Arch</i> stage 3 medium risk configuration).....	240
Figure 8.16 – Business Partner Satisfiability Assessment for 7 Potential Business Partners with Different Behaviour Patterns and Similar Historic Records .....	241
Figure 8.17 – Trustworthiness Assessment Error Rates of <i>DEco Arch</i> Stage 2 Input Parameters .....	244
Figure 8.18 – Impact of Different Risk Configurations for <i>DEco Arch</i> Business Partner Assessment Modules .....	248
Figure 8.19 – Execution Time Comparison of MA and TSK-type FIS for small rulebases [3 rules] (left) and large rulebases [30 rules] (right) [28] .....	250
Figure A.1 – Classical (two-valued) sets vs. fuzzy (multi-valued) sets .....	268
Figure A.2 – Fuzzification of an input temperature of 30°C.....	269
Figure A.3 – Representation of a Fuzzy Rule.....	269
Figure A.4 – Fuzzy inference system example for simple weather model.....	273

# Tables

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Table 4.1 – Aggregated reputation votes for a business domain with 6 BPAs (including 1 BDCA) .....	117
Table 4.2 – Business domain membership criteria and BDCA selection.....	117
Table 5.1 – Semantic and Numeric Representations of Trustworthiness, Reputation & Credibility Values .....	140
Table 5.2 – Semantic and Numeric Representations of Trend Measure .....	144
Table 5.3 – Semantic and Numeric Representations of Confidence Measure.....	145
Table 6.1 – Quality criteria as defined by the trusting agent in the ‘Internet solutions’ business domain and context .....	156
Table 6.2 – Quality criteria as defined by the trusted agent in the ‘Internet solutions’ business domain and context	156
Table 6.3 – Semantics, description & value ranges of the commitment criterion.....	158
Table 6.4 – Semantics, description & value ranges of the clarity criterion.....	159
Table 6.5 – Semantics, description & value ranges of the influence criterion .....	161
Table 6.6 – Example service criteria, expected behaviour, influence metrics, and responsibilities specified in the service contract.....	165
Table 6.7 – Example criteria used during review process during or after the business interaction.....	166
Table 7.1 – Initial Travel Requirements .....	176
Table 7.2 – Business domain discovery results .....	182
Table 7.3 – Business domain suitability values .....	183
Table 7.4 – Service attributes and suitability of potential business partners.....	184
Table 7.5 – Business offers collected from BPA (uuid_596[..]).....	186
Table 7.6 – Business offers collected from other BPAs .....	187
Table 7.7 – Example reputation value table for one potential business partner .....	190
Table 7.8 – Reputation values, direct trust value and credibility value for a potential business partner .....	195
Table 7.9 – Trustworthiness values for 3 potential business partners.....	195
Table 7.10 – Satisfiability values for 3 potential business partners .....	196
Table 7.11 – Service quality values for all business partner elements after review .....	199
Table 7.12 – Value change decision based on the review outcome .....	200
Table 8.1 – Relevant simulation model parameters for static behaviour observations for honest (VeryGood) agent configuration at cold start .....	220
Table 8.2 – Relevant simulation model parameters for static behaviour observations for cheating (VeryBad) agent configuration.....	223
Table 8.3 – Relevant simulation model parameters for behaviour observations for random agent configuration .....	225
Table 8.4 – Relevant simulation model parameters for alternating behaviour observations.....	228
Table 8.5 – Relevant simulation model parameters for behaviour observations for cyclic cheating business partner configuration.....	230
Table 8.6 – Simulation model parameters for <i>DEco Arch</i> stage 2 trustworthiness experiment with 6 potential business partners .....	235

Table 8.7 – Relevant simulation model parameters for <i>DEco Arch</i> Trustworthiness Assessment Criteria Comparison .....	243
Table 8.8 – Critical Values for $t$ .....	245
Table 8.9 – Statistical Data for Trustworthiness Assessment Inputs .....	245
Table 8.10 – t-scores and Statistic Significance Tests for $H_0(1)$ , $H_0(2)$ and $H_0(2)$ .....	246
Table 8.11 – Risk Configuration Impact Experiment Settings.....	247
Table 8.12 – Business Transaction Assessment Execution Time Comparison .....	249

# Listings

---

Listing 2.1 – Sample RDF response to trust query [48].....	35
Listing 4.1 – Simple Attribute Matching Algorithm.....	113
Listing 4.2 – Extract from WS-CDL Document.....	119
Listing 5.1 – DHT response to <i>get</i> request by SCA.....	139
Listing 7.1 – <i>DEco Arch</i> JXTA peer group advertisement .....	181
Listing 7.2 – Contact detail request .....	183
Listing 7.3 – Contact detail response .....	184
Listing 7.4 – Offer request.....	185
Listing 7.5 – Binding Offer Response .....	185
Listing 7.6 – DHT ‘put’ witness opinion submission .....	188
Listing 7.7 – DHT get response for witness opinion.....	189
Listing B.1 – <i>DEco Arch</i> Stage 1 FLC Controller Configuration .....	276
Listing B.2 – <i>DEco Arch</i> Stage 2 FLC Controller Configuration .....	278
Listing B.3 – <i>DEco Arch</i> Stage 3 FLC Controller Configuration .....	280

# Abstract

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As e-Business has moved from a niche market to a decisive contributor for the success of most companies, some issues need to be solved in order to assist the continued success of e-Business. The challenge, to deploy fully autonomous business service agents which undertake transactions on behalf of their owners, often fails due to lack of trust in the agent and its decisions. Four aspects can overcome this challenge. Firstly, intelligent agents need to be equipped with self-adjusting reputation, trustworthiness and credibility evaluation mechanisms to assess the trustworthiness of potential counterparts prior to a business transaction. Secondly, such evaluation mechanisms must be transparent and easy to comprehend so agent owners develop trust in their agents' decisions. Thirdly, the calculations of an agent must be highly customisable so that the agent owner can apply his personal experiences and security requirements to govern the decision making process of the intelligent agent. And finally, agents must communicate via standardised and open protocols in order to facilitate interaction between services deployed across different architectures and technologies. This thesis proposes the *DEco Arch* framework which integrates behavioural trust element relationships into various decision making processes found in e-Business ecosystems. We apply fuzzy-logic based soft computing techniques to increase user confidence and therefore enhance the adoption of the proposed assessment and review methodologies. A proof-of-concept implementation of the *DEco Arch* framework has been developed to showcase the proposed concepts in a case study and to conduct empirical experiments to evaluate the robustness and practicability of the proposed methodologies.

# List of Publications

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- [1] Schmidt, S., Steele, R. & Dillon, T., “Fuzzy Service Selection and Interaction Review in Distributed Electronic Markets”, *4th International Conference on Trust, Privacy & Security in Digital Business*, Regensburg, Germany, 2007, pp. 237-245.
- [2] Schmidt, S., Dillon, T., Steele, R. & Chang, E., “Trust and Reputation Ontologies for Electronic Business”, *9th International Conference on Enterprise Information Systems*, Funchal, Madeira - Portugal, 2007, pp. 215-223.
- [3] Schmidt, S., Chang, E., Dillon, T. & Steele, R., “Fuzzy Decision Support for Service Selection in E-Business Environments”, in *IEEE Symposium on Computational Intelligence in Multi-Criteria Decision-Making* Honolulu, USA, 2007, pp. 374-381.
- [4] Schmidt, S., Steele, R. & Dillon, “DEco Arch: Trust and Reputation Aware Service Brokering in Digital Ecosystems”, in *IEEE International Conference on Digital Ecosystems and Technologies* Cairns, Australia, 2007, pp. 285-291.
- [5] Schmidt, S., Steele, R., Dillon, T. “Fuzzy Trust Evaluation and Credibility Development in Multi-Agent Systems”, *Applied Soft Computing*, vol. 7, pp. 492-505, 2006.
- [6] Schmidt, S., Steele, R. & Dillon, “Towards Usage Policies for Fuzzy Inference Methodologies for Trust and QoS Assessment”, in *International Conference on Computational Intelligence* Dortmund, Germany, 2006, pp. 263-274.
- [7] Schmidt, S., Steele, R., Dillon, T. & Chang, E., “Fuzzy Service Quality Review in Service Oriented Architectures”, in *IEEE International Conference on Fuzzy Systems* Vancouver, Canada, 2006, pp. 2247-2254.
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- [9] Schmidt, S., Steele, R., Dillon, T. & Chang, E. 2005a, “Applying a Fuzzy Trust Model to E-Commerce Systems”, in *Joint Conference on Artificial Intelligence* Sydney, Australia, 2005, pp. 318-329.