A methodology and software environment for testing process model's sequential predictions with protocols

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Table of Contents

I Introduction to TBPA

1. Testing process models through protocol analysis
   1.1 The need for routinely testing process models’ sequential predictions
      1.1.1 The potential benefits of routinely testing process models’ sequential predictions
      1.1.2 The difficulty of testing sequential predictions
   1.2 The steps of testing process models’ sequential predictions with protocol data
   1.3 Developing a methodology for routinely testing process models’ sequential predictions
      1.3.1 A detailed specification of what is necessary for routine testing of process models with protocol data
      1.3.2 An environment to support the needs of routine testing of process models
      1.3.2.1 A tool supporting the interpretation and alignment of the data with respect to the model’s predictions
      1.3.2.2 A measurement system for telling where a model needs improvement
      1.3.2.3 An interface for tracing, understanding, and modifying models
   1.3.3 Documentation of the utility of the environment and methodology
   1.3.4 Testing and extending the sequentiality assumption of verbal protocol generation

2. Testing process models with protocol data: Review of past work
   2.1 The possible relationships between process models and protocols
   2.2 Review of creating and testing models with protocol data
      2.2.1 Exploratory analysis leading to process models
      2.2.2 General testing of process models
      2.2.3 Trace based protocol analysis
      2.2.4 Summary of important data features
   2.3 Tools related to process model testing
      2.3.1 Tools for building models from protocols
      2.3.1.1 Declarative knowledge coding tools
      2.3.1.2 Exploratory protocol analysis tools
      2.3.2 Model testing tools
      2.3.2.1 Strategy classification tools based on process models
      2.3.2.2 Model tracing modules within intelligent tutoring systems
      2.3.2.3 Tools for aligning the sequential predictions with data
   2.3.3 Tools for building and understanding models
      2.3.3.1 Process model induction tools
      2.3.3.2 Tools for understanding and building symbolic cognitive models
      2.3.3.3 Knowledge acquisition tools
      2.3.4 Summary of useful tool features
   2.4 Measures of model to data comparison
      2.4.1 Using criteria to develop a set of measurements
      2.4.2 Description of measurement inputs
      2.4.3 Non-numeric descriptive measures
      2.4.4 Simple numeric measures
      2.4.5 Measures of component utility
      2.4.6 Inferential measures
      2.4.7 A unified view: Criterion based model evaluation
      2.4.8 Summary of measures
   2.5 Previous models of process model testing
   2.6 Summary of lessons for process model testing methodology and tools

Soar/MT - 20 December 1992
Appendix to Chapter 2: Review of the Card model alignment algorithm 55
3. Requirements for testing process models using trace based protocol analysis 57
   3.1 Definition of trace based protocol analysis (TBPA) 57
      3.1.1 The inputs to TBPA 57
         3.1.1.1 A 0th order functional model 57
         3.1.1.2 Transcribed protocol data 58
      3.1.2 The TBPA loop and its requirements 58
         3.1.2.1 Step 1: Run the model to create predictions 59
         3.1.2.2 Step 2: Use the predictions to interpret the data 62
         3.1.2.3 Step 3: Analyze the results of the comparison 63
         3.1.2.4 Step 4: Revise the model to reduce the discrepancies 64
   3.2 Supporting TBPA with an integrated computer environment 66
      3.2.1 Why an integrated environment is needed 66
      3.2.2 The environment must automate what it can 67
      3.2.3 The environment must support the user for the rest 67
   3.3 The role of an intelligent architecture in the testing process 68
      3.3.1 Soar: The architecture used in this environment 68
      3.3.2 Making functional models examinable 70
      3.3.3 Using the architecture to automate the analysis 72
   3.4 Summary of requirements and description of the environment’s design 72
II Supporting the TBPA methodology: A description of the Soar/MT environment 76
   4. A spreadsheet for comparing the model’s predictions with the data 77
      4.1 Displaying and editing the correspondences 78
      4.2 Automatically aligning unambiguous segments 81
      4.3 Interpreting ambiguous actions 83
      4.4 Supporting the global requirements 84
         4.4.1 Providing an integrated system 84
         4.4.2 Automating what it can 84
         4.4.3 Providing a uniform interface including a path to expertise 84
         4.4.4 Providing general tools and a macro language 85
         4.4.5 Displaying and manipulating large amounts of data 85
      4.5 Summary 85
   5. Visual, analytic measures of the predictions’ fit to the data 87
      5.1 Creating the operator support display automatically 87
      5.2 Understanding the relative processing rate 89
         5.2.1 A display for comparing the relative processing rate 89
         5.2.2 Using the relative processing display to test the sequentiality assumption of verbal protocol production 94
      5.3 Creating additional displays 95
         5.3.1 S: An architecture for creating displays 95
         5.3.2 S-mode: An integrated, structured editor for S 96
      5.4 Supporting the global requirements 97
         5.4.1 Providing an integrated system 97
         5.4.2 Automating what it can 97
         5.4.3 Providing a uniform interface including a path to expertise 97
         5.4.4 Providing general tools and a macro language 97
         5.4.5 Displaying and manipulating large amounts of data 98
      5.5 Summary of measures and recommendations for use 98
   6. The model manipulation tool -- the Developmental Soar Interface (DSI) 100
      6.1 Providing the model’s predictions in forms useful for later comparisons and 101

Soar/MT - 20 December 1992
analysis
6.1.1 Providing predictions for comparison with the data 102
6.1.2 Aggregating the model's performance 103
6.2 Displaying the model so that it can be understood 104
6.2.1 Normative displays of the model 106
6.2.2 Descriptive displays of the model's performance 109
6.2.3 The working memory walker 111
6.2.4 A pop-up menu and dialog boxes to drive the display 112
6.3 Creating and modifying the model 114
6.3.1 Soar-mode: An integrated, structured editor for Soar 114
6.3.2 Taql-mode: An integrated, structured editor for TAQL 115
6.3.3 The Soar Command Interpreter 115
6.4 Supporting the requirements based on the whole process and its size 116
6.4.1 Providing consistent representations and functionality 116
6.4.2 Automating what it can: Keystroke savings 117
6.4.3 Providing a uniform interface including a path to expertise 117
6.4.4 Providing a set of general tools and a macro language 118
6.4.5 Displaying and manipulating large amounts of information 119
6.5 Lessons learned from the DSI 119
6.5.1 The relatively large size of the TAQL grammar 119
6.5.2 Behavior in Soar models is not just search in problem spaces 119
6.5.3 Soar models do not have explicit operators 122
6.6 Summary 123

III Performance demonstrations of Soar/MT and Conclusions 125
7. Performance demonstration I: Analyzing the Browser-Soar model faster and more deeply 126
7.1 Description of Browser-Soar and its data 126
7.2 Producing richer analyses more quickly 133
7.2.1 The interpretation of data with respect to the model trace done faster and tighter 133
7.2.2 Operator support displays created automatically -- as a set they highlight periodicity in behavior 134
7.3 Where the model and subject process at different rates shown clearly 137
7.3.1 Processing rate display based on decision cycles shows that the quality of fit is high 137
7.3.2 The processing rate display can be based on other measures of the model's effort 140
7.4 High level features of the Browser-Soar model made apparent 141
7.4.1 Browser-Soar as routine behavior is made directly visible 141
7.4.2 Noting Browser-Soar's large goal depth 142
7.4.3 Modifying Browser-Soar 142
7.4.4 Testing the modified Browser-Soar 143
7.5 Testing and extending the sequentiality assumptions of protocol generation theory 144
7.5.1 Are verbalizations generated sequentially? 148
7.5.2 Are mouse actions generated sequentially? 148
7.5.3 Does the sequentiality assumption hold across verbalizations and mouse actions? 148
7.6 Conclusions about Browser-Soar and the TBPA methodology 150
7.6.1 Some conclusions about Browser-Soar 150
7.6.2 Some conclusions about the methodology 151

Appendixes to Chapter 7 152
<table>
<thead>
<tr>
<th>Section</th>
<th>Page</th>
</tr>
</thead>
<tbody>
<tr>
<td>1 Alignment of the Write episode of Browser-Soar</td>
<td>152</td>
</tr>
<tr>
<td>2 Displays of each analytical measure for each episode of Browser-Soar</td>
<td>158</td>
</tr>
<tr>
<td>8. Performance demonstration II: Use of Soar/MT components by others</td>
<td>164</td>
</tr>
<tr>
<td>8.1 Usage of the Developmental Soar Interface to develop Soar models</td>
<td>164</td>
</tr>
<tr>
<td>8.2 Usage of S-mode to create functions in S</td>
<td>166</td>
</tr>
<tr>
<td>Appendix to Chapter 8: Survey distributed to Soar users</td>
<td>168</td>
</tr>
<tr>
<td>9. Contributions and steps toward the vision of routine automatic model testing</td>
<td>172</td>
</tr>
<tr>
<td>9.1 A methodology for testing the sequential predictions of process models</td>
<td>173</td>
</tr>
<tr>
<td>9.2 Each step in the methodology was supported in a software environment</td>
<td>174</td>
</tr>
<tr>
<td>9.2.1 Interpreting and aligning the model's predictions and the data</td>
<td>174</td>
</tr>
<tr>
<td>9.2.2 Analyzing the results of the testing process</td>
<td>175</td>
</tr>
<tr>
<td>9.2.3 Steps related to manipulating the model: Prediction generation and modification</td>
<td>175</td>
</tr>
<tr>
<td>9.2.4 The synergy from integration</td>
<td>176</td>
</tr>
<tr>
<td>9.3 Validated and extended the sequentiality assumption of protocol generation theory</td>
<td>176</td>
</tr>
<tr>
<td>9.4 Progress toward the vision of routine applied theoretically guided protocol analysis</td>
<td>177</td>
</tr>
<tr>
<td>9.5 Concluding remarks</td>
<td>178</td>
</tr>
<tr>
<td>References</td>
<td>179</td>
</tr>
<tr>
<td>I. How to obtain the software described in this thesis</td>
<td>193</td>
</tr>
</tbody>
</table>