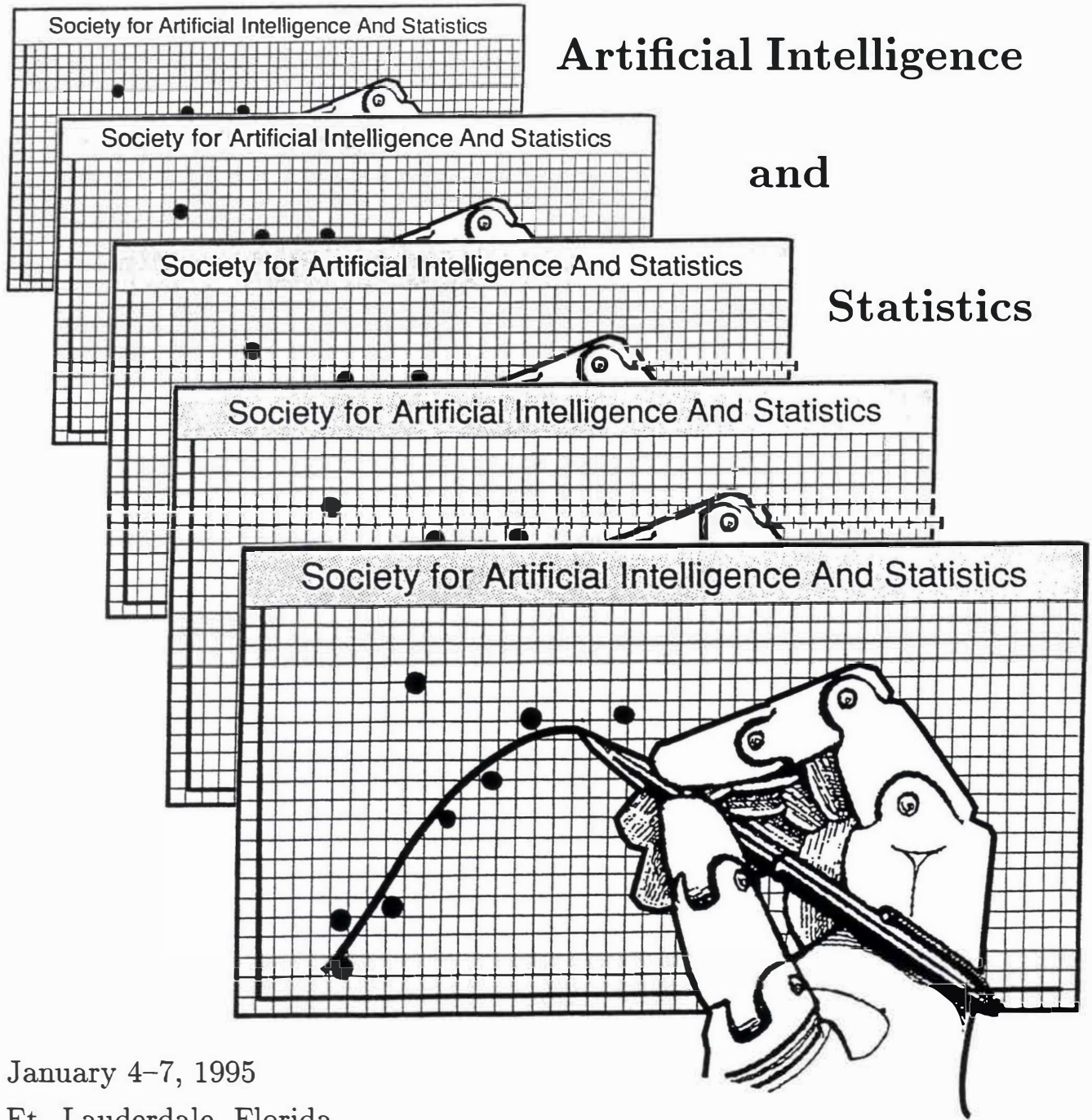


Preliminary Papers  
of the  
**Fifth International Workshop**  
on

**Artificial Intelligence**  
and  
**Statistics**



January 4-7, 1995  
Ft. Lauderdale, Florida

# CONTENTS

|  |      |
|--|------|
| <i>Preface</i> .....   | vii  |
| <i>Organization</i> .....  | viii |
| <i>Tutorials</i> .....   | ix   |
| <i>Schedule</i> .....  | x    |
| A comparative evaluation of sequential feature selection algorithms .....  | 1    |
| <i>D. W. Aha, R. L. Bankert</i>  |      |
| Learning multiple relational rule-based models .....   | 8    |
| <i>K. Ali, C. Brunk, M. Pazzani</i>  |      |
| Hypergraph grammars for knowledge-based model construction .....   | 15   |
| <i>R. G. Almond</i>  |      |
| Missing data models as meta-data .....   | 23   |
| <i>R. G. Almond, J. Schimert</i>   |      |
| Tools for empirically analyzing AI programs .....  | 35   |
| <i>S. D. Anderson, D. M. Hart, D. L. Westbrook, P. R. Cohen, A. Carlson</i>                                      |      |
| Picking the best expert from a sequence .....  | 42   |
| <i>R. Bergman, R. L. Rivest</i>  |      |
| Ploxoma: Testbed for uncertain inference .....   | 49   |
| <i>H. Blau</i>   |      |
| Decision-theoretic case-based reasoning .....  | 56   |
| <i>J. S. Breese, D. Heckerman</i>  |      |
| Discovering morphemic suffixes: A case study in MDL induction .....  | 64   |
| <i>M. R. Brent, S. K. Murthy, A. Lundberg</i>  |      |
| Software for data analysis with graphical models .....   | 76   |
| <i>W. L. Buntine, H. S. Roy</i>  |      |
| Comparing the prediction accuracy of statistical models and artificial neural networks<br>in breast cancer ..... | 87   |
| <i>H. B. Burke, D. B. Rosen, P. H. Goodman</i>   |      |
| Tailoring rulesets to misclassification costs .....  | 88   |
| <i>J. Catlett</i>  |      |
| Predicting stock returns with genetic programming: Do the short-term nonlinear<br>regularities exist? .....      | 95   |
| <i>S-H. Chen, C-H. Yeh</i>   |      |
| Analysis and Application of the Generalized Mean-Shift Process .....   | 102  |
| <i>Y. Cheng</i>  |      |
| Learning Bayesian networks: Search methods and experimental results .....  | 112  |
| <i>D. M. Chickering, D. Geiger, D. Heckerman</i>   |      |

|   |     |
|---|-----|
| Two algorithms for inducing structural equation models from data .....  | 129 |
| <i>P. R. Cohen, D. E. Gregory, L. Ballesteros, R. St Amant</i>  |     |
| Causal discovery from data in the presence of selection bias .....  | 140 |
| <i>G. F. Cooper</i>   |     |
| Using causal knowledge to learn more useful decision rules from data .....                                    | 151 |
| <i>L. A. Cox, Jr.</i>   |     |
| Truncated Gaussians as tolerance sets .....   | 161 |
| <i>F. Cozman, E. Krotkov</i>  |     |
| Textual data mining .....   | 168 |
| <i>S. J. Cunningham</i>   |     |
| Learning in hybrid noise environments using statistical queries .....   | 175 |
| <i>S. E. Decatur</i>  |     |
| Non-Linear dimensionality reduction: A comparative performance analysis .....                                 | 186 |
| <i>O. de Vel, S. Li, D. Coomans</i>   |     |
| Two applications of statistical modelling to natural language processing .....                                | 192 |
| <i>W. DuMouchel, C. Friedman, G. Hripcsak, S. B. Johnson, P. D. Clayton</i>                                   |     |
| Heuristic search for model structure .....  | 199 |
| <i>J. F. Elder</i>  |     |
| A further study of pruning methods in decision tree induction .....   | 211 |
| <i>F. Esposito, D. Malerba, G. Semeraro</i>   |     |
| Which method learns most from the data? Methodological issues in the analysis of<br>comparative studies ..... | 219 |
| <i>A. Feelders, W. Verkooijen</i>   |     |
| Classifying new words for robust parsing .....  | 226 |
| <i>A. Franz</i>   |     |
| Learning possibilistic networks from data .....   | 233 |
| <i>J. Gebhardt, R. Kruse</i>  |     |
| Abductive reasoning in Bayesian belief networks using a genetic algorithm .....                               | 245 |
| <i>E. S. Gelsema</i>  |     |
| Omega-Stat: An environment for implementing intelligent modeling strategies .....                             | 252 |
| <i>E. J. Harner, H. C. Galfalvy</i>   |     |
| A decision-based view of causality .....  | 259 |
| <i>D. Heckerman, R. Shachter</i>  |     |
| Finding dependencies in event streams using local search .....  | 271 |
| <i>A. E. Howe</i>   |     |
| Solving influence diagrams using Gibbs sampling .....   | 278 |
| <i>A. Jenzarli</i>  |     |
| Robust linear discriminant trees .....  | 285 |
| <i>G. H. John</i>   |     |

|  |     |
|--|-----|
| Viewpoint-based measurement of semantic similarity between words .....   | 292 |
| <i>K. Kasahara, K. Matsuzawa, T. Ishikawa, T. Kawaoka</i>  |     |
| Hierarchical clustering of composite objects with a variable number of components .....                          | 303 |
| <i>A. Ketterlin, P. Gançarski, J. J. Korczak</i>   |     |
| Structure learning of Bayesian networks by hybrid genetic algorithms .....                                       | 310 |
| <i>P. Larrañaga, R. H. Murga, M. Poza, C. M. H. Kuijpers</i>   |     |
| On graphical models for dynamic systems .....  | 317 |
| <i>A. Lekuona, B. Lacruz, P. Lasala</i>  |     |
| Propagation of Gaussian belief functions .....   | 324 |
| <i>L. Liu</i>  |     |
| Tree structured interpretable regression .....   | 331 |
| <i>D. Lubinsky</i>   |     |
| On test selection strategies for belief networks .....   | 342 |
| <i>D. Madigan, R. G. Almond</i>  |     |
| Derivation DAGs for inferring interaction models .....   | 354 |
| <i>F. M. Malvestuto</i>  |     |
| MENTOR: A Bayesian model for prediction and intervention in mental retardation .....                             | 366 |
| <i>S. Mani, M. Valtorta, S. McDermott</i>  |     |
| Evaluating and comparing classifiers: Complexity measures .....  | 372 |
| <i>J. K. Martin</i>  |     |
| An exact probability metric for decision tree splitting and stopping .....                                       | 379 |
| <i>J. K. Martin</i>  |     |
| Dynamic learning bias selection .....  | 386 |
| <i>C. J. Merz</i>  |     |
| Modeling life time data by neural networks .....   | 396 |
| <i>Y. B. Moon, H-J. Kim</i>  |     |
| Statistical preprocessing for decision tree induction .....  | 403 |
| <i>S. K. Murthy</i>  |     |
| Part-of-speech tagging from small data sets .....  | 410 |
| <i>E. Neufeld, G. Adams, H. Choy, R. Orthner, T. Philip, A. Tawfik</i>   |     |
| Detecting complex dependencies in categorical data .....   | 417 |
| <i>T. Oates, D. Gregory, P. R. Cohen</i>   |     |
| Searching for attribute dependencies in Bayesian classifiers .....   | 424 |
| <i>M. Pazzani</i>  |     |
| A causal calculus for statistical research, with applications to observational and<br>experimental studies ..... | 430 |
| <i>J. Pearl</i>  |     |
| Learning Bayesian networks using feature selection .....   | 450 |
| <i>G. M. Provan, M. Singh</i>  |     |

|   |     |
|---|-----|
| Framework for a generic knowledge discovery toolkit .....   | 457 |
| <i>P. Riddle, R. Fresnedo, D. Newman</i>  |     |
| Combining statistics and AI in the optimization of semiconductors for solar cells .....                                       | 469 |
| <i>J. Risius, G. Seidelmann</i>   |     |
| A generalization of the Tetrad representation theorem .....   | 476 |
| <i>G. Shafer, A. Kogan, P. Spirtes</i>  |     |
| Representing and solving asymmetric decision problems using valuation networks .....  | 488 |
| <i>P. Shenoy</i>  |     |
| Data representations in learning .....  | 495 |
| <i>G. Srikantan, S. N. Srihari</i>  |     |
| Preliminary system design for an EDA assistant .....  | 502 |
| <i>R. St Amant, P. R. Cohen</i>   |     |
| A hill-climbing approach to construct near optimal decision trees .....   | 513 |
| <i>X. Sun, Y. Qiu, L. A. Cox, Jr.</i>   |     |
| Likelihood-based causal inference .....   | 520 |
| <i>Q. Yao, D. Tritchler</i>   |     |
| Learning from data by guiding the analyst: On the representation, use, and creation<br>of visual statistical strategies ..... | 531 |
| <i>F. W. Young, D. J. Lubinsky</i>  |     |
| <i>Author Index</i> .....   | 540 |

# PREFACE

Almost 10 years ago, in April 1985, Bill Gale and Daryl Pregibon organized the first *Workshop on Artificial Intelligence and Statistics* at Princeton, New Jersey. In his Preface to the edited volume Bill motivated the Workshop by noting that research in each field could benefit the other. The 15 papers presented at the first Workshop reflected a variety of interdisciplinary themes: task analysis of and expert advisory systems for statistical strategy, reasoning under uncertainty, supervised and unsupervised learning, heuristic search in pattern recognition, statistical tools for knowledge acquisition, and characterizing the behavior of ‘intelligent’ systems through statistical analysis. Papers in subsequent workshops have further developed some of these themes and/or branched into other areas at the interface of AI and statistics.

It is difficult to know the influence of the AI and Statistics Workshops on research in the two communities. Suffice it to say that I have used these Workshops to guide, gauge, and ‘correct’ my own work. I have heard several volunteer it as their favorite forum for discussion and debate, and in any case, it seems generally acknowledged as a workshop of very high quality. Finally, in contrast to 15 papers presented at the first Workshop in 1985, there are 62 papers, selected from a total of 111 submissions, being presented at the *Fifth International Workshop on AI and Statistics* in 1995. Apparently, many concur with Bill’s motivation for the original Workshop.

There are many people that helped bring this Workshop to fruition. Hans Lenz, the Program Chair, was responsible for selecting the program committee, assigning papers, collecting reviews, and deciding the technical program. He also iterated with me in scheduling the presentations. Despite occasional logistical problems in the Nashville–Berlin link, it was a pleasure working with Hans. Hans and I thank those that provided submissions for review – unfortunately, not all quality submissions could be accommodated. We thank the program committee for reviews and advise on paper selection. Daryl Pregibon handled finances, local arrangements, and provided input on scheduling – if there was a General CoChair position, then the title would belong to Daryl. The Tutorial Chair, Prakash Shenoy, put together a wonderful tutorial program. Our tutorial presenters, David Aha, Trevor Hastie, Steffen Lauritzen, and Glenn Shafer deserve special thanks – the time investment necessary for a good tutorial is very high, and we appreciate their efforts. My wife, Pat Fisher, and Jing Lin, Julio Ortega, and Doug Talbert of Vanderbilt University helped put together the proceedings. Robyn Landers of the University of Waterloo has been of great service by maintaining the AI and Statistics electronic mailing list, over which considerable Workshop information has been promulgated.

Finally, I greatly appreciate the sage advice of past organizers, particularly their input on program committee selection, but on a variety of other issues as well. They include Peter Cheeseman, Bill DuMouchel, David Hand, Wayne Oldford, and Daryl Pregibon. I am optimistic that this year’s meeting will follow in the tradition of high quality that they helped hone.

Doug Fisher, General Chair

# ORGANIZATION

**General Chair:** D. Fisher Vanderbilt U., USA  
**Program Chair:** H. Lenz Free U., Berlin, Germany

**Program Committee Members:**

|               |                          |
|---------------|--------------------------|
| W. Buntine    | NASA (Ames), USA         |
| J. Catlett    | AT&T Bell Labs, USA      |
| P. Cheeseman  | NASA (Ames), USA         |
| P. Cohen      | U. of Mass., USA         |
| D. Draper     | U. of Bath, UK           |
| Wm. Dumouchel | Columbia U., USA         |
| A. Gammerman  | U. of London, UK         |
| D. J. Hand    | Open U., UK              |
| P. Hietala    | U. Tampere, Finland      |
| R. Kruse      | TU Braunschweig, Germany |
| S. Lauritzen  | Aalborg U., Denmark      |
| W. Oldford    | U. of Waterloo, Canada   |
| J. Pearl      | UCLA, USA                |
| D. Pregibon   | AT&T Bell Labs, USA      |
| E. Roedel     | Humboldt U., Germany     |
| G. Shafer     | Rutgers U., USA          |
| P. Smyth      | JPL, USA                 |

**Tutorial Chair:** P. Shenoy U. Kansas, USA  
**Local Arrangements:** D. Pregibon AT&T Bell Labs, USA

**Sponsors:** Society for Artificial Intelligence and Statistics  
International Association for Statistical Computing

# TUTORIALS

Wednesday, January 4

Machine Learning ..... 9:00 AM to 12:15 PM  
*Dr. David Aha, Naval Research Lab*

Statistical Methods for Inducing Models from Data ..... 9:00 AM to 12:15 PM  
*Prof. Steffen Lauritzen, Aalborg University*

Probabilistic Models of Causality ..... 2:00 PM to 5:15 PM  
*Prof. Glenn Shafer, Rutgers University*

Statistical Models for Function Estimation and Classification .... 2:00 PM to 5:15 PM  
*Prof. Trevor Hastie, Stanford University*



# SCHEDULE

## Thursday, January 5

|       |   |
|-------|---|
| 8:45  | Opening Comments  |
| 9:00  | A causal calculus for statistical research, with applications to observational and experimental studies – <i>J. Pearl</i> ..... 430 |
| 9:30  | Causal discovery from data in the presence of selection bias – <i>G. F. Cooper</i> ... 140  |
| 10:00 | Likelihood-based causal inference – <i>Q. Yao, D. Trichler</i> ..... 520  |
| 10:30 | Break   |
| 11:00 | Missing data models as meta-data – <i>R. G. Almond, J. Schimert</i> ..... 23  |
| 11:30 | Learning in hybrid noise environments using statistical queries – <i>S. E. Decatur</i> 175  |
| 12:00 | Lunch   |
| 1:30  | Heuristic search for model structure – <i>J. F. Elder</i> ..... 199   |
| 2:00  | Tree structured interpretable regression – <i>D. Lubinsky</i> ..... 331   |
| 2:30  | Break   |
| 3:00  | Poster Summaries  |
| 5:00  | Break   |
| 6:00  | Dinner  |
| 6:30  | Poster Session 1 (ends at 8:10)   |
| 8:20  | Poster Session 2 (ends at 10:00)  |

## Friday, January 6

|       |  |
|-------|--|
| 8:30  | Learning Bayesian networks: Search methods and experimental results<br>– <i>D. M. Chickering, D. Geiger, D. Heckerman</i> ..... 112            |
| 9:00  | Derivation DAGs for inferring interaction models – <i>F. M. Malvestuto</i> ..... 354   |
| 9:30  | Learning possibilistic networks from data – <i>J. Gebhardt, R. Kruse</i> ..... 233   |
| 10:00 | Break  |
| 10:30 | Software for data analysis with graphical models – <i>W. L. Buntine, H. S. Roy</i> .. 76   |
| 11:00 | Preliminary system design for an EDA assistant – <i>R. St Amant, P. R. Cohen</i> . 502   |
| 11:30 | Framework for a generic knowledge discovery toolkit – <i>P. Riddle, R. Fresnedo, D. Newman</i> ..... 457                                       |
| 12:00 | Lunch  |
| 1:30  | A generalization of the Tetrad representation theorem – <i>G. Shafer, A. Kogan, P. Spirtes</i> ..... 476                                       |
| 2:00  | Two algorithms for inducing structural equation models from data<br>– <i>P. R. Cohen, D. E. Gregory, L. Ballesteros, R. St Amant</i> ..... 129 |
| 2:30  | Break  |
| 3:00  | Panel/Debate (topic TBA)   |
| 8:00  | Informal Discussions (on topics TBA)   |

## Saturday, January 7

|       |   |
|-------|---|
| 9:00  | On test selection strategies for belief networks – <i>D. Madigan, R. G. Almond</i> 342  |
| 9:30  | Using causal knowledge to learn more useful decision rules from data<br>– <i>L. A. Cox, Jr.</i> ..... 151                                 |
| 10:00 | Dynamic learning bias selection – <i>C. J. Merz</i> ..... 386   |
| 10:30 | Break   |
| 11:00 | Viewpoint-based measurement of semantic similarity between words<br>– <i>K. Kasahara, K. Matsuzawa, T. Ishikawa, T. Kawaoka</i> ..... 292 |
| 11:30 | Discovering morphemic suffixes: A case study in MDL induction<br>– <i>M. R. Brent, S. K. Murthy, A. Lundberg</i> ..... 64                 |
| 12:00 | Closing Comments  |
| 12:15 | Break   |
| 12:45 | Business Meeting  |

## Poster Session 1 Thursday, January 5

A comparative evaluation of sequential feature selection algorithms – *D. W. Aha, R. L. Bankert*

Hypergraph grammars for knowledge-based model construction – *R. G. Almond*

Tools for empirically analyzing AI programs – *S. D. Anderson, D. M. Hart, D. L. Westbrook, P. R. Cohen, A. Carlson*

Decision-theoretic case-based reasoning – *J. S. Breese, D. Heckerman*

Tailoring rulesets to misclassification costs – *J. Catlett*

Analysis and Application of the Generalized Mean-Shift Process – *Y. Cheng*

A further study of pruning methods in decision tree induction – *F. Esposito, D. Malerba, G. Semeraro*

\* Classifying new words for robust parsing – *A. Franz*

Omega-Stat: An environment for implementing intelligent modeling strategies – *E. J. Harner, H. C. Galfalvy*

A decision-based view of causality – *D. Heckerman, R. Shachter*

Solving influence diagrams using Gibbs sampling – *A. Jenzarli*

Hierarchical clustering of composite objects with a variable number of components  
– *A. Ketterlin, P. Gañçarski, J. J. Korczak*

Structure learning of Bayesian networks by hybrid genetic algorithms – *P. Larrañaga, R. H. Murga, M. Poza, C. M. H. Kuijpers*

An exact probability metric for decision tree splitting and stopping – *J. K. Martin*

Modeling life time data by neural networks – *Y. B. Moon, H-J. Kim*

Statistical preprocessing for decision tree induction – *S. K. Murthy*

Detecting complex dependencies in categorical data – *T. Oates, D. Gregory, P. R. Cohen*

Learning Bayesian networks using feature selection – *G. M. Provan, M. Singh*

Combining statistics and AI in the optimization of semiconductors for solar cells – *J. Risius, G. Seidelmann*

Data representations in learning – *G. Srikantan, S. N. Srihari*

Learning from data by guiding the analyst: On the representation, use, and creation of visual statistical strategies – *F. W. Young, D. J. Lubinsky*

## Poster Session 2

### Thursday, January 5

Learning multiple relational rule-based models – *K. Ali, C. Brunk, M. Pazzani*

Picking the best expert from a sequence – *R. Bergman, R. L. Rivest*

Ploxoma: Testbed for uncertain inference – *H. Blau*

Comparing the prediction accuracy of statistical models and artificial neural networks in breast cancer – *H. B. Burke, D. B. Rosen, P. H. Goodman*

Predicting stock returns with genetic programming: Do the short-term nonlinear regularities exist? – *S-H. Chen, C-H. Yeh*

Truncated Gaussians as tolerance sets – *F. Cozman, E. Krotkov*

Textual data mining – *S. J. Cunningham*

Non-Linear dimensionality reduction: A comparative performance analysis – *O. de Vel, S. Li, D. Coomans*

Two applications of statistical modelling to natural language processing – *W. DuMouchel, C. Friedman, G. Hripcsak, S. B. Johnson, P. D. Clayton*

Which method learns most from the data? Methodological issues in the analysis of comparative studies – *A. Feelders, W. Verkooijen*

Abductive reasoning in Bayesian belief networks using a genetic algorithm – *E. S. Gelsema*

Finding dependencies in event streams using local search – *A. E. Howe*

Robust linear discriminant trees – *G. H. John*

★ On graphical models for dynamic systems – *A. Lekuona, B. Lacruz, P. Lasala*

Propagation of Gaussian belief functions – *L. Liu*

MENTOR: A Bayesian model for prediction and intervention in mental retardation – *S. Mani, M. Valtorta, S. McDermott*

Evaluating and comparing classifiers: Complexity measures – *J. K. Martin*

Part-of-speech tagging from small data sets – *E. Neufeld, G. Adams, H. Choy, R. Orthner, T. Philip, A. Tawfik*

Searching for attribute dependencies in Bayesian classifiers – *M. Pazzani*

Representing and solving asymmetric decision problems using valuation networks – *P. Shenoy*

A hill-climbing approach to construct near optimal decision trees – *X. Sun, Y. Qiu, L. A. Cox, Jr.*

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