THOMAS RICHARDSON

e-mail: thomasr@u.washington.edu

EDUCATION CARNEGIE MELLON UNIVERSITY Pittsburgh, USA

Ph.D. Logic, Computation & Methodology August, 1996

M.Sc. Logic & Computation August, 1995

MERTON COLLEGE Oxford, UK

B.A.(Hons), Mathematics & Philosophy

August, 1992

THESES Ph.D. Thesis: Feedback Models:

Interpretation and Discovery

M.Sc. Thesis: *Properties of Cyclic*

Graphical Models

EMPLOYMENT UNIVERSITY OF WASHINGTON Seattle, USA

Department of Statistics

Associate Professor

Chair *July 2014-June 2019*

Full Professor Fall 2007-

Assistant Professor Fall 1996-Fall 2000

Fall 2000-Fall 2007

Center for Statistics and the Social Sciences

Director *June 2009-2014*

Acting Director June 2006-Aug 2007

Department of Electrical Engineering Fall 2013-

Adjunct Professor

Department of Economics Winter 2007-

Adjunct Professor

UNIVERSITY OF WARWICK Coventry, UK

Lecturer Fall 1999-Fall 2000

RESEARCH GRANTS	PI: ONR (\$739K) High-Dimensional Causal Model Search.	July 2019-June 2022
	PI: ONR (\$343K) Statistical Methods for High-Dimensional Causal Inference.	July 2015-June 2019
	Co-Investigator PCORI (\$1,031K) Learning Within Health Care Delivery Systems (Heagerty, PI)	Aug 2016-Mar 2020
	Co-PI: NIH: (\$5,325K) Analytic methods for HIV treatment and co-factor effects Harvard School of Public Health (J.Robins, PI) (UW Subcontract \$502K)	June 2005-Mar 2015
	Co-PI: NSF (\$1,030K) Software Infrastructure for Temporal Modeling (PI: J.Bilmes, Univ. of Washington)	July 2008-Dec 2013
	Co-PI: NSF (\$343K) Aging Related Degradation in Bone Mechano-transduction (PI: S. Srinivasan, Univ. of Washington)	July 2008-June 2013
	Co-PI: NIH (\$352K) Predicting bone formation induced by mechanical loading using agent based models (PI: S. Srinivasan, Univ. of Washington)	Dec 2006-Nov 2008
	Co-PI: CSSS Seed grant (\$20K) Improved Confidence Intervals for Subvectors in IV Regression with Weak Identification (PI: Eric Zivot, UW Economics)	Dec 2006-Dec 2007

RESEARCH GRANTS (CONTD.)	PI: NSF-DMS (\$120K) Graphical and Algebraic Models for Multivariate Categorical Data (Collaborative grant with M. Drton, at University of Chicago)	July 2006-July 2009
	PI: RRF Grant: (\$24K) Likelihood inference in regression systems in the presence of multimodality	Sept 2003-Sept 2004
	PI: CSSS Seed Grant: (\$15K) Intonation in Unangas (Western Aleut), an endangered Alaskan language, (J. Wegelin and A. Taff).	Sept 2001-July 2002
	Co-PI: DARPA-CFI: (\$2.3K) Graphical Models: Mixing Knowledge and Data- Driven Techniques. (Jeff Bilmes, PI).	Summer 2001
	PI: NSF-DMS Grant (\$155K) Graphical Markov Models with Interpretable Structure	Nov 1999-Aug 2003
	PI: EPA-NRCSE Grant (\$153K) Graphical Models for statistical and causal inferences about mortality from airborne particles (PM)	1999-2002
	Co-PI: NSF-DMS Grant (\$313K) Graphical Markov Models, Structural Equation Models, and Related Models of Multivariate Dependence PI: Michael Perlman	June 1997-June 2000
	PI: RRF Grant (\$19k) Bayesian software tools for causal model search	June 1997-June 1999

AWARDS & FELLOWSHIPS	FULBRIGHT FELLOWSHIP	Buenos Aires, Arg. Sept-Dec 2014
i ellowsiii s	VISITING SENIOR RESEARCH FELLOW	Jesus College, Oxford
	, 10.11 (0 0 21 (10) 1 120 21 110 11 1 22 20 (1	Jan-June 2008
	INSTITUTE FOR ADVANCED STUDIES	University of Bologna
	Fellowship	Sept-Dec 2007
	CENTER FOR ADVANCED STUDIES IN THE	Stanford University,
	BEHAVIORAL SCIENCES	Palo Alto, USA
	Fellowship	January-June 2004
	ISAAC NEWTON INSTITUTE	Cambridge, UK
	Rosenbaum Fellow	July - Dec 1997
	25TH CONFERENCE ON UNCERTAINTY IN	Montreal, Canada
	ARTIFICIAL INTELLIGENCE	June 2009
	Best Paper Award	
	20TH CONFERENCE ON UNCERTAINTY IN	Banff, Canada
	ARTIFICIAL INTELLIGENCE	July 2004
	Outstanding Student Paper Award	
	(as co-author)	
	12TH CONFERENCE ON UNCERTAINTY IN	Portland, USA
	ARTIFICIAL INTELLIGENCE	Aug 1996
	Outstanding Student Paper Award	

PHD STUDENTS

I HD STUDENTS		
SUPERVISED		Affiliation
Defended: 2016	Wen Wei Loh	Gent
2016	Linbo Wang (with XH. Zhou, Biostatistics)	Toronto
2015	Roddy Theobald	AIM, Seattle
2012	Anna Klimova	Bielefeld
2011	Robin Evans	Oxford University
2008	Saraswata Chaudhuri	McGill University
	(with E. Zivot; PhD in Economics)	
2006	Erica Moodie (PhD in Biostatistics)	McGill University
2005	Sanjay Chaudhuri (with M. Perlman)	National University of
		Singapore
2004	Mathias Drton (with M. Perlman)	Univ. of Washington
2002	Ayesha Ali	University of Guelph
2001	Jacob Wegelin (with P. Sampson)	Virginia Commonwealth
		University
1999	Greg Ridgeway (with D. Madigan)	Univ. of Pennsylvania
MSC STUDENTS		
1999	Jake Brutlag	Google
SERVICE ON PHD	Accounting; Biostatistics; Computer Science;	Economics: Electrical
COMMITTEES	Engineering; Evans School of Public Policy; I	
	Forestry; Civil & Environmental Engineering;	
	Mechanical Engineering; Political Science; Ps	
	Statistics; Urban Design and Planning.	yenology, boclology,
	Statistics, Orban Design and Framming.	
EXTERNAL PHD	Jyväskylä: Santtu Tikka	July 2018
COMMITTEES	(Advisor: Juha Karvanen)	
	ETH Zurich: Preetam Nandy	September 2016
	(Advisor: Marloes Maathuis)	
	ETH Zurich: Diego Colombo	August 2013
	(Advisor: Marloes Maathuis)	
	Radboud University: Tom Claassen	June 2013
	(Advisor: Tom Heskes)	
	Carnegie-Mellon University: Jiji Zhang	July 2006
	(Advisor: Peter Spirtes)	·
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EDITING Editor for *Statistical Science* 2009-2014

Proceedings of the Twenty-Second July 2006

Conference on Uncertainty in Artificial

Intelligence (with R. Dechter)

Associate Editor for *The Journal of the*Aug 1999-July 2004

Royal Statistical Society Series B.

Proceedings of the Eighth International Jan 2001

Workshop on Artificial Intelligence and

Statistics (with T. Jaakkola)

Guest Editor for Statistics and Computing Aug 1997-Aug 1999

REVIEWING STATISTICS: Annals of Statistics; Bernoulli;

Biometrika; Behaviormetrika; Communications in

Statistics; Games and Economic Behavior;

International Journal of Biostatistics, International

Statistical Review; Journal of Multivariate

Analysis; Journal of the Royal Statistical Society;

Probability Theory and Related Fields;

Scandinavian Journal of Statistics; Statistical Modelling; Statistica Sinica; Statistics and Computing; Learning in Graphical Models.

SOCIAL SCIENCE: Erkenntnis; Sociological Methodology; Sociological Methods and

Research; Synthese.

COMPUTER SCIENCE: Conference on AI and

Statistics; International Joint Conference on AI;

Journal of AI Research; Knowledge Discovery

and Data Mining; Machine Learning; Neural and

Information Processing Systems; IEEE

REVIEWING COMPUTER SCIENCE (CONT.) Transactions on (CONT.) Knowledge and Data Engineering; Oxford

University Press; Conference on Uncertainty in Artificial Intelligence; IEEE Transactions on

Signal Processing.

MATHEMATICS: Journal of Combinatorial Theory

GRANT PROPOSAL AGENCIES: NSF; EPSRC (UK);

RRF; NOW (Netherlands)

CONFERENCE Co-organizer, week-long workshop at May 2019

ORGANIZING Mathematisches Forschungsinstitut,

Oberwolfach, Germany

First UAI Workshop on Causal Structure

August 2012

Learning, Catalina Island,

WNAR/IMS MEETING June 2007

IMS Program Chair

23RD CONFERENCE ON UNCERTAINTY IN July 2007

ARTIFICIAL INTELLIGENCE

General Co-Chair

22ND CONFERENCE ON UNCERTAINTY IN July 2006

ARTIFICIAL INTELLIGENCE

Program Co-Chair

IMS/BERNOULLI SOCIETY MEETING Barcelona, Spain

Session organizer July 2004

WNAR/IMS MEETING Los Angeles, USA

Session organizer June 2002

CONFERENCE ORGANIZING (CONT.)	ASSOCIATION FOR AI AND STATISTICS Conference organizer (with T. Jaakkola, MIT)	Fort Lauderdale, USA Jan 2001
(CON1.)	FIELDS INSTITUTE Seminar organizer (with P.Spirtes, CMU) Causal Structure and Conditional Independence	Toronto, Canada Oct 1999
	IMS CONFERENCE ON GRAPHICAL MODELS Webmaster	Seattle, USA June 1997
ADVISORY PANELS	University of Califorina, Los Angeles Departmental Review Panel	January 2018
	CARNEGIE-MELLON UNIVERSITY Presidential Ten Year Review Panel	March 2014
	ASSOCIATION FOR UNCERTAINTY IN AI Council of Chairs	July 2006-
	HARVARD SCHOOL OF PUBLIC HEALTH Causal Epidemiology program	January 2001-
	SOCIETY FOR AI AND STATISTICS	January 2001-
PROGRAM	CONFERENCE ON UNCERTAINTY IN AI	2000-17
COMMITTEES	CONFERENCE ON KNOWLEDGE DISCOVERY AND DATABASES	2000
	INTERNATIONAL WORKSHOP ON AI AND STATISTICS	1999,2005
	INTERNATIONAL JOINT CONFERENCE ON AI	1999, 2002

PROGRAM COMMITTEES (CONT.)	CONFERENCE ON NEURAL AND INFORMATION PROCESSING SYSTEMS	1998-2000, 2002, 2005-6, 2013-19
UW SERVICE	Member of Moore/Sloan Foundation Data Science Proposal	March 2013
	Department of Biostatistics Review	February 2013
	Faculty Field Tour	June 1998
	Faculty Fellows Program	September 1996
DEPT SERVICE	Chair	July 2015-June 2019
	Chair, Computing Committee	2010-
	Chair, MS Applied Exam	2009
	Chair, Pedagogy Committee	2002-2003
	Computing Committee	1998-1999, 2000
	Graduate Admissions Committee	1998,2005,2006
	Ph.D. Applied Prelim Committee	2002-2004, 2006
	M.Sc. Applied Exam Committee	2005
	Stochastic Modelling Prelim Committee	1997, 1998, 2012
	Computing Prelim Committee	1997, 1999, 2013
	Applied Prelim Committee	1998, 2003
	Executive Committee, Center for Statistics and the Social Sciences	September 2003-
	Search Committees, Center for Statistics and	2005-6 (Chair)
	the Social Sciences	2001-2003
	Web-developer for UIF Proposal: Center for Statistics and the Social Sciences	April-June 1999
PRESENTATIONS	Office of Naval Research Causal Meeting, MIT	June 2019
	Peking University, First International Workshop on Causal Inference,	May 2019
	CSSS Seminar	January 2019

PRESENTATIONS (CONT.)	Centre de Recherches Mathématiques, Montréal, Québec, Canada (two talks)	June 2018
	Causal Working Group, University of Washington Biostatistics	April 2018
	ONR Program Review, Duke University	October, 2017
	Columbia University, Causality Workshop	September, 2017
	Center for Causal Discovery, University of Pittsburgh / CMU	April 2017
	Mathematisches Forschungsinstitut, Oberwolfach, Germany	March 2017
	Joint Statistics Meetings, Chicago	August 2016
	Workshop on Causal Inference and Information Theory, Technical University of Munich	May 2016
	ISAT/DARPA What If: Machine Learning for Causal Inference Workshop	February 2016
	Causal Working Group, University of Washington, Department of Biostatistics,	December 2015
	ONR Meeting, Duke, NC	October 2015
	European Meeting of Statisticians (one invited; one submitted), Amsterdam	July 2015
	Causal Working Group, University of Washington Biostatistics	March 2015

PRESENTATIONS (CONT.)	Sackler Colloquium, National Academy of Sciences	March 2015
	CONICET, Mathematics Institute, Santa Fe, Argentina	November 2014
	CLAPEM, Cartagena, Colombia	September 2014
	Joint Statistics Meeting, Boston Yale University, Department of Government	August 2014 April 2014
	UNC, Chapel Hill, Dept of Biostatistics	April 2014
	University of California, Berkeley Data, Society and Inference Seminar	March 2014
	CMU, Department of Statistics Institute for Health Metrics and Evaluation, Seattle	March 2014 January 2014
	University of Oxford, Dept of Statistics	November 2013
	Lunteren Stochastics Workshop	November 2013
	Biostatistics Causal Reading Group	November 2013
	Causality: Perspectives from different disciplines, Vals Switzerland	August 2013
	Radboud University Mini-Symposium	June 2013
	Atlantic Causal Inference Conference	May 2013
	Microsoft Research Summit on Machine Learning, Paris, France	April 2013

PRESENTATIONS (CONT.)	University of Washington Biostatistics Department Seminar	April 2013
	CSSS Seminar	October 2012
	SuSTaIn workshop, University of Bristol, UK	September 2012
	Conference on Uncertainty in Artificial Intelligence, Catalina Island	August 2012
	Joint Statistics Meetings, San Diego	August 2012
	Eastern North American Region of the International Biometric Society	April 2012
	Mediation Workshop, Department of Government, Harvard University (Keynote)	March 2012
	Department Seminar, University of Minnesota, Minneapolis, Minnesota	February 2012
	Winter Workshop, University of Florida, Gainesville, Florida	January 2012
	IMA Conference on Applications of Algebraic Geometry, Raleigh, NC	October 2011
	Joint Statistics Meetings, Miami, Florida	August 2011
	Centre de Recherches Mathématiques, Montréal, Québec, Canada	May 2011
	American Institute for Mathematics, Palo Alto	October 2010

PRESENTATIONS (CONT.)	Department of Statistics, Eidgenössische Technische Hochschule (ETH), Zürich	July 2010
	Valencia IX; International Meeting on Bayesian Statistics, Benidorm, Spain	June 2010
	25 th Conference on Uncertainty in Artificial Intelligence	June 2009
	Banff International Research Station Workshop on Causal Inference	May 2009
	University of Chicago Department of Health Studies	April 2009
	University of Warwick Graphical Models and Genetic Applications	April 2009
	University of Washington Department of Biostatistics	April 2009
	University of Cambridge MolPAGE workshop	March 2009
	Harvard University Department of Government	February 2009
	SAMSI Workshop on Algebraic Statistics	January 2009
	University of Washington CSSS Seminar	January 2009
	University of Washington Department of Statistics	December 2008

PRESENTATIONS (CONT.)	University of Cambridge Statistics Laboratory	June 2008
	University of Warwick Department of Statistics	May 2008
	Gregynog Conference, Wales	April 2008
	ETH Zürich, Switzerland Statistics Seminar Applied Seminar	April 2008
	Max Planck Institute, Leipzig, Germany	March 2008
	Jesus College, Oxford, UK	March 2008
	University College London, UK	February 2008
	University of Oxford, UK	February 2008
	University of Pavia, Italy	December 2007
	University of Perugia, Italy	November 2007
	University of Bologna, Italy University of Bologna, Italy Institute for Advanced Studies	November 2007 November 2007
	University of Padua, Italy University of Florence, Italy	November 2007 October 2007
	WNAR/IMS Meeting UC Irvine, USA	June 2007
	Cornell University Statistics Department Seminar	March 2007

PRESENTATIONS (CONT.)	Institute for Mathematics and its Applications, Minneapolis Invited Talk	March 2007
	SAMSI Workshop on Random Matrices Invited Talk	November 2006
	Harvard School of Public Health Biostatistics Department Seminar	October 2006
	AMS Meeting, San Antonio Texas Invited Talk	January 2006
	Penn State Statistics Department	November 2005
	Graphical Models Workshop in Smögen Invited Talk	September 2005
	Joint Statistics Meeting Invited Talk	August 2005
	UW Statistics Department Seminar	February 2005
	Duke/SAMSI Latent Variable in the Social Sciences Meeting	September 2004
	Joint Statistics Meeting Invited Discussant	Toronto, Canada August 2004
	Stanford University, Statistics Department Department Seminar	Palo Alto, California May 2004
	UC Berkeley, Mathematics Department Algebraic Statistics Workshop	Berkeley, California May 2004

PRESENTATIONS (CONT.)	Center for Advanced Studies in the Behavioral Sciences	Palo Alto, California Feb 2004
	Social Epidemiology, Health Disparities Symposium	May 2003
	UW, CSSS seminar	March, 2003
	UW, Electrical Engineering Graphical Models Seminar	March 2003
	UW, Statistics Data Mining Seminar Banff IMS Conference (for M. Drton)	Fall 2002 August 2002
	Univ. of Washington, CSSS Seminar Royal Statistical Society, Read paper.	April 2002 London,
		December 2001
	Institute of Information Theory and Automation, (UTIA),	Prague, Czech Rep. November 2001
	School of Economics (VSE),	Prague, Czech Rep. November 2001
	Causal Inference Conference	Snowbird, Utah August 2001
	Center for Language and Speech Processing (CLSP), EE Dept., Johns Hopkins	Baltimore, Maryland August 2001
	European Science Foundation (ESF), Highly Structured Stochastic Systems (HSSS), Closing Workshop	Luminy, France, November 2000
	Department of Statistics, University of Washington	Seattle, Washington November 2000

PRESENTATIONS (CONT.)	Center for Statistics and the Social Sciences, University of Washington	Seattle, Washington November 2000
	Bernoulli-RIKEN Meeting on Neural Networks and Learning, RIKEN (Institute of Physical and Chemical Research)	Tokyo, Japan October 2000
	Bernoulli/IMS Joint Meeting Invited speaker	Guanajuato, Mexico May 2000
	University of Lancaster, UK, Department of Mathematics,	Lancaster, UK May 2000
	Danish Agricultural Sciences Institute	Foulum, Denmark April 2000
	University of Aalborg, Department of Mathematical Sciences,	Aalborg, Denmark April 2000
	University of Warwick, UK, Department of Statistics,	March 2000
	Imperial College, University of London, Department of Statistics,	March 2000
	ESF HSSS Conference on Graphical Models Invited speaker	Munich, Germany March 2000
	Dept. of Statistics, University of Toronto Departmental seminar	Toronto, Canada November 1999
	International Statistical Institute Conference Invited speaker	Helsinki, Finland August 1999
	IMS-WNAR Meeting Invited discussant	Seattle, USA June 1999

PRESENTATIONS (CONT.)	CALD Seminar, Robotics Dept, CMU Invited talk	Pittsburgh, USA February 1999
	Conference on AI & Statistics Speaker, plenary session	Fort Lauderdale, USA January 1999
	ESF HSSS Workshop on Structural Learning in Graphical Models	Tirano, Italy September 1998
	Joint Statistical Meetings, ASA/IMS Invited speaker	Dallas, USA August 1998
	Conference on Automated Learning and Discovery (ConALD)	Pittsburgh, USA June 1998
	Valencia Meeting on Bayesian Statistics Invited discussant	Valencia, Spain May 1998
	Dept. of Statistics, University of Washington	Seattle, USA March 1998
	Working Group on Model Based Clustering, Dept. of statistics, University of Washington	Seattle, USA February 1998
	Newton Institute Conference on Bayesian Methods	Cambridge, UK December 1997
	Dept. of Statistics, University of Oxford Departmental seminar	Oxford, UK November 1997
	Dept. of Statistics, University of Warwick Departmental seminar	Coventry, UK November 1997
	ESF HSSS Workshop on Multivariate Research with Latent Variables	Wiesbaden, Germany November 1997

PRESENTATIONS (CONT.)	Human Communications Research Center, University of Edinburgh	Edinburgh, UK November 1997
	Dept. of Statistics, University College London Departmental seminar	London, UK November 1997
	StatsLab, University of Cambridge Departmental seminar	Cambridge, UK November 1997
	Conference on Stochastic Model Building, Duke University	Durham, USA October 1997
	Newton Institute Conference on Graphical Models	Cambridge, UK August 1997
	Santa Fe Institute	Santa Fe, USA July 1997
	UW/Microsoft Research Workshop on Data Mining	Seattle, USA July 1997
	IMS Conference on Graphical Models Invited talk	Seattle, USA June 1997
	Law School, University of Washington	Seattle, USA May 1997
	University of Tampere	Hämeenlinna, Finland April 1997
	Conference on Artificial Intelligence and Statistics	Fort Lauderdale, USA January 1997

PRESENTATIONS (CONT.)	International Association for Statistical Computing (IASC)	Pasadena, USA February 1997
	Working Group on Model Based Clustering, Dept. of Statistics, University of Washington. Invited talk	Seattle, USA February 1997
	12th Conference on Uncertainty in Artificial Intelligence	Portland, USA August 1996
	ESF HSSS Workshop on Association Models with Latent Variables	Wiesbaden, Germany July 1996
	Dept. of Statistics, University of Washington	Seattle, USA April 1996
	11th Symposium on Computational Statistics (COMPSTAT) Speaker, section on Model Fitting	Vienna, Austria August 1994
SHORT COURSES	Short course at Eidgenössische Technische Hochschule (ETH) Zürich on Causal Modeling.	Zürich, Switzerland June 2012
	Summer Institute in Statistics and Modeling in Infectious Diseases (SISMID) Co-taught a course on causal inference with Michael Hudgens (UNC Chapel Hill)	Seattle <i>June</i> 2009-2016
	Taught a 3 day course on causal models, counterfactuals and collapsibility	Bologna December 2007
	Together with N.Wermuth, taught the University of Umeå, Winter Conference Course (4 days).	Bjorgafjall March 2006

SHORT	Taught a five day course on Bayesian	Helsinki, Finland
Courses	Networks, Complex Systems Group,	April 1997
(CONT.)	Computer Science Dept., Univ. of Helsinki	

BIBLIOGRAPHY

PAPERS IN REFEREED JOURNALS

R. J. Evans and T. S. Richardson (2019). Smooth, identifiable supermodels of discrete DAG models with latent variables. Bernoulli, **25**, 848-876

- S. A. Swanson, M. A. Hernán, M. Miller, J. M. Robins and T. S. Richardson (2018). *Partial Identification of the Average Treatment Effect Using Instrumental Variables: Review of Methods for Binary Instruments, Treatments, and Outcomes*. Journal of the American Statistical Association, **113**: 933-947.
- L. Wang, X.-H. Zhou and T.S. Richardson (2017). *Identification and Estimation of Causal Effects with Outcomes Truncated by Death*. Biometrika, **104**: 597-612.
- L. Wang, T. S. Richardson, X.-H. Zhou (2017). *Causal analysis in multi-arm trials with truncation by death*. Journal of the Royal Statistical Society: Series B, **79**, 719–735.
- L. Wang, T.S. Richardson and J. M. Robins (2017). *On falsification of the binary instrumental variable model*. Biometrika, **104**, 229-236.
- T.S. Richardson, J.M. Robins and L. Wang (2017). *On Modeling and Estimation for the Relative Risk and Risk Difference*. Journal of the American Statistical Association, **519**, 1121-1130.
- L. Wang and T.S. Richardson (2017). On the Concordant Survivorship Assumption. Statistics in Medicine, **36** pp. 717-720
- P. Nandy, M. Maathuis, T. S. Richardson. (2017) Estimating the effect of joint interventions from observational data in sparse high-dimensional settings. Annals of Statistics, **45**, pp. 647-674.

PAPERS IN REFEREED JOURNALS (CONT.)

- J.Y. Huang, A.R. Gavin, T.S. Richardson, A. Rowhani-Rahbar, D.S. Siscovick, D.A. Enquobahrie. (2015) *Are Early-Life Socioeconomic Conditions Directly Related to Birth Outcomes? Grandmaternal Education, Grandchild Birth Weight, and Associated Bias Analyses* (with discussion). American Journal of Epidemiology. 2015 Oct 1;182(7):568-78.
- D. Heckerman, C. Meek, T.S. Richardson (2014) *Variations on undirected graphical models and their relationships*. Kybernetika vol. 50, No. 3, 363-377.
- T. Richardson and A. Rotnitzky (2014) Causal etiology of the research of James M. Robins. Statistical Science vol. 29, No. 4, 459-484.
- R.J. Evans and T.S. Richardson (2014). *Markovian acyclic directed mixed graphs for discrete data*. Annals of Statistics vol. 42, No. 4, 1452-1482.
- I. Shpitser, R.J. Evans, T.S. Richardson and J.M. Robins (2014). *Introduction to nested Markov models*. Behaviormetrika vol. 41, No.1, 2014, 3–39.
- R.J. Evans and T.S. Richardson (2013) *Marginal log-linear parameters for graphical Markov models*. Journal of the Royal Statistical Society Ser. B, vol. 75, Issue 4, pp. 743–768.
- M. Banerjee and T.S. Richardson (2013) *Exchangeable Bernoulli Random Variables and Bayes' Postulate*. Electronic Journal of Statistics, vol. 7, pp. 2193-2208.
- C. Chelba, P. Xu, F. Pereira, T.S. Richardson. (2013) *Large Scale Distributed Acoustic Modeling with Back-off N-grams*, IEEE Transactions on Audio, Speech and Language Processing, vol. 21, pp. 1158-1169.

PAPERS IN REFEREED JOURNALS (CONT.) T.J. vanderWeele, T.S. Richardson (2012). *General theory for interactions in sufficient cause models with dichotomous exposures*. Annals of Statistics, 40: pp. 2128-2161.

- D. Colombo, M.H. Maathuis, M. Kalisch and T.S. Richardson (2012). *Learning high-dimensional directed acyclic graphs with latent and selection variables*. Annals of Statistics, 40: pp. 294-321.
- X. de Luna, T.S. Richardson and I. Waernbaum (2011). *Identification of covariates for the non-parametric estimation of an average treatment effect*. Biometrika, 98(4): pp. 861-875
- T.S. Richardson, R. J. Evans and J.M. Robins (2011) *Transparent Parametrizations of Potential Outcome Models* (with discussion). In Bayesian Statistics 9, J.M. Bernardo, M.J. Bayarri, J. O. Berger, A. P. Dawid, D. Heckerman, A. F. M. Smith and M. West (Eds.), pp. 569–610.
- S. Srinivasan, T. Gross, S. Bain, B. Ausk, J. Prasad, and T.S. Richardson (2010). *Rescuing Loading Induced Bone Formation at Senescence*. PLoS Comp Bio. doi:10.1371/journal.pcbi.1000924
- S. Chaudhuri, T.S. Richardson, J. Robins, and E. Zivot (2010). *Split-Sample Score Tests in Linear Instrumental Variables Regression*. Econometric Theory. 26: pp 1820-1837.
- A.Glynn, T.S. Richardson and M. Handcock (2010) *Resolving Contested Elections: The Limited Power of Post-Vote Vote Choice Data*. Journal of the American Statistical Association. 105(489): 84-91.
- E.E. Moodie, T.S. Richardson (2010). *Bias Correction in Non-Differentiable Estimating Equations for Optimal Dynamic Regimes*. Scandinavian Journal of Statistics. 37: 126-146.
- M. Drton, M. Eichler, T.S. Richardson (2009). *Computing Maximum Likelihood Estimates in Recursive Linear Models with Correlated Errors*. Journal of Machine Learning Research. 10, 1989-2008.

PAPERS IN REFEREED JOURNALS

A. Ali, T.S. Richardson and P. Spirtes (2009) *Markov Equivalence for Ancestral Graphs*. Annals of Statistics. 37, 2808-2837.

(CONT.)

- M. Drton, T.S. Richardson (2008). *Binary Models for Marginal Independence*. Journal of the Royal Statistical Society Ser. B. 70(2), pp. 287-309
- M. Drton, T.S. Richardson (2008). *Graphical Methods for Efficient Likelihood Inference in Gaussian Covariance Models*. Journal of Machine Learning Research 9, pp. 581-602.
- A. Glynn, J. Wakefield, M. Handcock, T. S. Richardson (2008) *Alleviating Linear Ecological Bias and Optimal Design with Subsample Data*. Journal of the Royal Statistical Society Ser.A. 171(1) pp.179-202.
- S. Chaudhuri, M. Drton, T. S. Richardson (2007). *Estimation of a Covariance Matrix with Zeros*. Biometrika 94(1), pp. 199-216.
- E.E. Moodie, T.S Richardson, D. Stephens (2007). *Demystifying Optimal Dynamic Treatment Regimes*. Biometrics 63(2), pp. 447-455.
- S. Srinivasan, B. J. Ausk, S. L. Poliachik, S. E. Warner, T. S. Richardson, T. S. Gross (2007) *Rest-Inserted Loading Rapidly Amplifies the Response of Bone to Small Increases in Strain and Load Cycles*. Journal of Applied Physiology 102: 1945-1952
- J. A. Wegelin, A. Packer, and T. S. Richardson (2006). *Latent models for cross-covariance*. Journal of Multivariate Analysis, 97(1): 79-102.
- M. Drton and T. S. Richardson (2004). *Multimodality of the likelihood in the bivariate seemingly unrelated regression model*. Biometrika **91**(2): 383-392.
- T.S. Richardson (2003). *Markov Properties for Acyclic Directed Mixed Graphs*. The Scandinavian Journal of Statistics, March 2003, vol. 30, no. 1, pp. 145-157(13).

PAPERS IN REFEREED JOURNALS (CONT.)

- M. Banerjee and T.S. Richardson (2003). *On dualization of graphical Gaussian models; a correction*. The Scandinavian Journal of Statistics. March 2003, vol. 30, 817-820.
- S. Lauritzen and T.S. Richardson (2002). *Chain graph models and their causal interpretations (with discussion)*. Journal of the Royal Statistical Society Series B. 64(3), 321-363.
- T.S. Richardson and P.Spirtes (2002). *Ancestral graph Markov models*. Annals of Statistics. 30, 962-1030
- M. Townsend and T.S. Richardson (2002). *Probability and Statistics in the Legal Curriculum: A Case Study in Disciplinary Aspects of Interdisciplinarity*. Duquesne Law Review 40(3), pp.447-488.
- T. R. Hammond, G. L. Swartzman, T. S. Richardson (2001). *Bayesian estimation of fish school cluster composition applied to a Bering Sea acoustic survey*. ICES Journal of Marine Science, Vol. 58, No. 6, Nov 2001, pp. 1133-1149
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