Identification and Inference for Econometric Models

This volume contains the papers presented in honor of the lifelong achievements of Thomas J. Rothenberg on the occasion of his retirement. The authors of the chapters include many of the leading econometricians of our day, and the chapters address topics of current research significance in econometric theory. The chapters cover four themes: identification and efficient estimation in econometrics, asymptotic approximations to the distributions of econometric estimators and tests, inference involving potentially nonstationarity in time series, such as processes that might have a unit autoregressive root, and nonparametric and semiparametric inference. Several of the chapters provide overviews and treatments of basic conceptual issues, while others advance our understanding of the properties of existing econometric procedures and/or propose new ones. Specific topics include identification in nonlinear models, inference with weak instruments, test for nonstationarity in time series and panel data, generalized empirical likelihood estimation, and the bootstrap.

Donald W. K. Andrews is the William K. Lanman Jr., Professor of Economics in the Department of Economics at Yale University. The author of more than 70 professional publications, Professor Andrews is a Fellow of the Econometric Society, former coeditor of the journal *Econometric Theory*, and a Fellow of the *Journal of Econometrics*. He did his graduate work at the University of California, Berkeley, where he obtained an M.A. in statistics and a Ph.D. from the Economics Department under the supervision of Peter J. Bickel and Thomas J. Rothenberg.

James H. Stock is Professor of Economics in the Department of Economics at Harvard University. Previously he was the Roy E. Larson Professor of Political Economy at the Kennedy School of Government, Harvard, and Professor of Economics at the University of California, Berkeley. He has authored more than 90 professional publications, including a popular undergraduate econometrics textbook (coauthored by Mark Watson). He is a Fellow of the Economics and Statistics, and a research associate of the National Bureau of Economic Research. Stock did his graduate work at the University of California, Berkeley, where he obtained an M.A. in statistics and a Ph.D. from the Economics Department under the supervision of Thomas J. Rothenberg.

Identification and Inference for Econometric Models

Essays in Honor of Thomas Rothenberg

Edited by

Donald W. K. Andrews Yale University

James H. Stock Harvard University



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List of Contributors

Donald W. K. Andrews Yale University

Jushan Bai New York University and Tsinghua University, Beijing

Ole E. Barndorff-Nielsen University of Aarhus

Peter J. Bickel University of California, Berkeley

David A. Freedman University of California, Berkeley

Arthur S. Goldberger University of Wisconsin, Madison

Brownwyn H. Hall University of California, Berkeley

Andrew C. Harvey University of Cambridge

David F. Hendry University of Oxford

Bo E. Honoré Princeton University Hidehiko Ichimura University College, London

Guido W. Imbens University of California, Berkeley

Michael Jansson University of California, Berkeley

George G. Judge University of California, Berkeley

Oliver Linton London School of Economics

Jacques Mairesse CREST-INSEE and EHESS

Ron C. Mittelhammer Washington State University

Grayham E. Mizon University of Southampton

Whitney K. Newey Massachusetts Institute of Technology

Serena Ng University of Michigan

r of

viii List of Contributors

James L. Powell University of California, Berkeley

Joaquim J. S. Ramalho University of Evora

Ya'acov Ritov The Hebrew University of Jerusalem

Thomas J. Rothenberg University of California, Berkeley

Paul A. Ruud University of California, Berkeley

N. E. Savin University of Iowa

Ron Schoenberg Aptech Systems

Neil Shephard Nuffield College, Oxford

Richard J. Smith University of Warwick Richard H. Spady Northwestern University and Nuffield College, Oxford

Douglas G. Steigerwald University of California, Santa Barbara

James H. Stock Harvard University

Thomas M. Stoker Massachusetts Institute of Technology

Samuel B. Thompson Harvard University

Richard J. Vagnoni University of California, Santa Barbara

Jeffrey M. Wooldridge Michigan State University

Allan H. Würtz University of Aarhus

Motohiro Yogo University of Pennsylvania

Preface Donald W. K. Andrews and James H. Stock

The chapters in this volume are dedicated to Thomas Rothenberg in honor of his retirement from the Economics Department at the University of California, Berkeley. Tom Rothenberg has made fundamental contributions to econometric theory and has been an inspiring teacher, advisor, and colleague. Rothenberg's early work focused on efficient estimation and identification in simultaneous equations models. In a paper (written with C. T. Leenders) published in *Econometrica* while he was still a graduate student, Rothenberg established the asymptotic efficiency of the linearized maximum likelihood estimator for simultaneous equations models and thus the asymptotic efficiency of three-stage least squares. This line of research was summarized in his monograph *Efficient Estimation with A Priori Information*, where he laid out a unified theory of efficient estimation in simultaneous equations models equations systems.

Because exact optimality results for estimators and tests in simultaneous equations models are generally unavailable, the notion of efficiency in Rothenberg's initial work typically is first-order asymptotic efficiency. Often, however, there are a number of estimators that are asymptotically equivalent to first order; k-class estimators in a single equation with multiple endogenous regressors is a leading example. In finite samples, these estimators have different behavior, but their finite-sample distributions can be either unavailable or so complicated that they fail to provide useful comparisons between the estimators. Thus, Rothenberg undertook to examine the differences between first-order equivalent estimators and tests by studying their higher-order properties using Edgeworth expansions. Much of this work is summarized in his masterful chapter in the 1984 Handbook of Econometrics, which remains a key reference for researchers interested in the deviations of the distributions of instrumental variables estimators from their first-order asymptotic distributions. More recently, Rothenberg's interest in efficient inference led him to consider efficient testing in time series with a possible unit root.

Both of the editors of this Festschrift had the privilege of being students of Tom Rothenberg. Like his other students, we benefited from traits that are hallmarks of his research: an insistence on working on problems that are important to econometrics, bringing common sense to both the economics and

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the econometric theory at hand, an appreciation for the statistical foundations of econometric theory, and a realization that careful analysis of simple models can yield deeper insights about econometric procedures applied in the more complicated settings found in practice.

Most of the papers in this volume fall into one of the three main areas of Rothenberg's research: identification and efficient estimation; analysis of asymptotic approximations, for example, via higher-order asymptotic analysis; and inference involving potentially nonstationary time series. In addition, several papers are in the area of nonparametric and semiparametric inference.

The majority of the papers in this volume were presented at a National Science Foundation conference in honor of Tom Rothenberg held in Berkeley, California, in August 2001. This conference was organized by James Powell and Paul Ruud.

Identification and Efficient Estimation (Part I)

At the request of the editors, this Festschrift starts with a classic unpublished paper in which Rothenberg explores the subtle role of modeling assumptions for causal inferences. By illustrating how seemingly innocuous assumptions can lead to incredible inferential conclusions, the chapter emphasizes the importance of thoughtful consideration of the assumptions underlying a statistical analysis and of focusing on results that are robust to untestable modeling assumptions.

The chapter by Arthur Goldberger continues this theme. Goldberger considers studies of twins in behavioral genetics. He illustrates how modeling assumptions that seem plausible on their face can lead to implausibly strong conclusions that are not robust to questionable assumptions on unobservables – specifically, assumptions about correlations between genetic characteristics and the environment.

Jeffrey Wooldridge's chapter addresses the identification and estimation of causal effects in nonlinear models and examines how certain estimands are more robust than others to violation of assumptions on unmodeled heterogeneity. In particular, he shows that, under certain conditional independence assumptions, it is possible to estimate average partial effects in nonlinear models consistently, even with unobserved heterogeneity and even though this heterogeneity can lead to inconsistency of estimated parameters (such as probit slope coefficients) of standard nonlinear models.

David Freedman's chapter also considers what assumptions are needed to provide a causal interpretation to regression coefficients estimated using non-experimental data and emphasizes the importance of having prior information about causal mechanisms – that is, a model in which one believes – if one is to draw causal inferences. Freedman makes these arguments using graphical causal models, a framework more commonly encountered outside rather than inside the field of econometrics. His conclusions reinforce those in the chapters by Rothenberg and Goldberger about the key role played in identification by subsidiary modeling assumptions.

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James Stock and Motohiro Yogo consider a different aspect of identification in econometrics: instrumental variables regression when the coefficient of interest is identified but, for the sample size at hand, the marginal explanatory power of the instruments is small, that is, the instruments are weak. As Rothenberg and others have shown, in this case the distributions of IV estimators are poorly approximated by their first-order asymptotic distributions, and Stock and Yogo propose tests of the hypothesis that the instruments are weak against the alternative that they are strong. In a companion chapter, they also derive alternative asymptotic distributions for k-class IV estimators when there are many weak instruments.

The chapter by Douglas Steigerwald and Richard Vagnoni examines the role of modeling assumptions in achieving identification in the context of a dynamic financial model of stock and stock option prices. The model captures salient stylized empirical facts, including serial correlation in stock trades, serial correlation in stock price changes, and more persistent serial correlation in stock trades than in squared stock price changes. Steigerwald and Vagnoni use this model to illustrate how subsidiary modeling assumptions (in this case, assumptions about the process of trader arrival) play an important role in the identification of the model parameters.

Asymptotic Approximations (Part II)

Rothenberg's teaching and research have emphasized the virtues of using alternative asymptotic frameworks, beyond conventional \sqrt{n} -normal asymptotics, to understand and compare the performance of estimators and test statistics. For example, Rothenberg's work on higher-order expansions is well known. The chapters by Hidehiko Ichimura and Oliver Linton, by Donald Andrews, by Guido Imbens and Richard Spady, and by Whitney Newey, Joaquim Ramalho, and Richard Smith all follow this approach and employ higher-order expansions to analyze and improve methods based on first-order asymptotics.

Ichimura and Linton calculate higher-order expansions for semiparametric estimators of treatment effects. They use these expansions to define a method for bandwidth selection and to specify a degrees of freedom–like bias correction.

Andrews uses Edgeworth expansions to compare competing bootstrap methods for parametric time series models. In particular, he shows that a parametric bootstrap based on the maximum likelihood estimator achieves greater improvements in coverage probabilities than the nonparametric block bootstrap. Moreover, he shows that these improvements can be achieved using a linearized k-step version of the estimator, resulting in substantial computational savings.

Imbens and Spady calculate higher-order biases and mean-squared errors of generalized method of moments (GMM) and generalized empirical likelihood (GEL) estimators in a simple model with a sequence of moment conditions. Their analysis suggests that GEL estimators outperform feasible GMM estimators. In addition, they find that the relative performances of different GEL estimators depend on the magnitudes of third moments of the moment conditions.

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Newey, Ramalho, and Smith establish stochastic expansions for GMM and GEL estimators that may depend on preliminary nuisance parameters. Examples considered include estimators of models with sample selection corrections and estimators of covariance structures. Their results also cover two-step GMM estimators with sample splitting employed to estimate the weight matrix. The stochastic expansions are used to analytically bias-correct the GMM and GEL estimators. Simulation experiments are used to show that this method works well in the case of covariance structure models.

The chapter by Ron Mittelhammer, George Judge, and Ron Schoenberg uses Monte Carlo simulation methods to analyze the finite-sample properties of GEL, GMM, and two-stage least-squares estimators in a linear structural model. They also provide an algorithm for computation of GEL estimators.

The chapter by Ole Barndorff-Nielsen and Neil Shephard considers asymptotic approximations in time series models. The authors numerically compare different first-order equivalent approximations to the distribution of the local sum of squared financial returns (the so-called realized variance).

The chapter by Gene Savin and Allan Würtz considers tests concerning the transformation parameter in Box–Cox regression models with unknown error distributions. Using Monte Carlo simulations, they find that Wald tests based on first-order asymptotics have poor size properties. In contrast, they find that GMM residual-based bootstrap tests have only small discrepancies between nominal and true null rejection probabilities.

Inference Involving Potentially Nonstationary Time Series (Part III)

The chapters by Michael Jansson, by Samuel Thompson, and by Andrew Harvey consider inference about the degree of persistence in time series. Jansson considers tests of the null hypothesis that a vector time series is cointegrated. Specifically, he applies the theory of point optimal tests for a unit moving average root to the residual from a cointegrating regression to develop a new family of tests of the null hypothesis of cointegration. Thompson focuses on the problem of constructing confidence intervals for autoregressive coefficients when the true value is nearly one. Thompson shows that intervals based on inverting robust tests can result in substantial improvements over procedures using only second moments when the errors are heavy-tailed. In his chapter, Harvey proposes a unified framework for testing for stationarity and unit roots in both univariate and multivariate time series. The unifying concept is that the tests have generalized Cramér–von Mises distributions, and Harvey shows how to derive such tests via the Lagrange multiplier principle.

The chapters by Jushan Bai and Serena Ng and by Brownwyn Hall and Jacques Mairesse examine inference in potentially persistent panel data. Bai and Ng consider a common components model and study tests for the stationarity of the common components against the alternative that one or more common components have a unit root. In their chapter, Hall and Mairesse use Monte Carlo simulations to compare the performance of various unit root tests that have been proposed for panel data, focusing on the common case in which

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there are few time series observations on a large number of individuals or firms. They find that many existing tests have substantial size distortions, especially when there is firm-level heteroskedasticity.

David Hendry and Grayham Mizon consider forecasting in the presence of a different sort of nonstationarity: structural breaks and policy regime shifts. They develop a framework in which structural shifts in causal structural models lead those causal models to produce poor forecasts, whereas nonstructural models can produce reliable forecasts; one of their conclusions is that forecast failure of an econometric model need not rule out its usefulness for forecasting.

Nonparametric and Semiparametric Inference (Part IV)

The chapter by Peter Bickel, Ya'acov Ritov, and Tom Stoker examines the fundamental question of the choice of regressors in a regression model. In contrast to much of the literature on this problem, they analyze a nonparametric regression model rather than a linear model. They develop tests for exclusion restrictions in the nonparametric regression context.

Bo Honoré and James Powell exploit the pairwise differencing approach commonly used to eliminate a fixed effect in a linear panel data model to estimate various semiparametric nonlinear models, including the partially linear logit model. They establish \sqrt{n} -consistency and asymptotic normality of estimators that are minimizers of kernel-weighted U-statistics.

The chapter by Whitney Newey and Paul Ruud considers semiparametric estimation of single-index models. The authors establish \sqrt{n} -consistency and asymptotic normality of the inverse-density-weighted quasi-maximum likelihood estimator introduced by Ruud in 1986. This estimator has an advantage over alternative estimators in that it allows for discontinuities in the unknown transformation function.