Varieties of Democracy

Varieties of Democracy is the essential user’s guide to the Varieties of Democracy project (V-Dem), one of the most ambitious data collection efforts in comparative politics. This global research collaboration sparked a dramatic change in how we study the nature, causes, and consequences of democracy.

This book is great in scope and ambition. More than a reference guide, it raises standards for causal inferences in democratization research and introduces new, measurable concepts of democracy and many political institutions.

Varieties of Democracy enables anyone interested in democracy – teachers, students, journalists, activists, researchers, and others – to analyze V-Dem data in new and exciting ways. This book creates opportunities for V-Dem data to be used in education, research, news analysis, advocacy, policy work, and elsewhere. V-Dem is rapidly becoming the preferred source for democracy data.

Michael Coppedge is Professor of Political Science at the University of Notre Dame and co-Principal Investigator of Varieties of Democracy (V-Dem). He is the author of Democratization and Research Methods, published by Cambridge University Press.

John Gerring is Professor of Government at the University of Texas at Austin and co-Principal Investigator of Varieties of Democracy (V-Dem). His work extends across comparative politics, political history, and methodology.

Adam N. Glynn is Associate Professor of Political Science and Quantitative Theory and Methods at Emory University and Project Manager for Methodology of Varieties of Democracy (V-Dem). His research examines causal inference and sampling/survey designs for political science applications.

Carl Henrik Knutsen is Professor of Political Science at the University of Oslo and co-Principal Investigator of Varieties of Democracy (V-Dem). His research examines the economic effects of political institutions and regimes, policy making in autocracies, and processes of regime change.

Staffan I. Lindberg is Director of the V-Dem Institute and Professor of Political Science at University of Gothenburg and co-Principal
Investigator of Varieties of Democracy (V-Dem). His research examines topics ranging from elections, democratization, and civil society to women’s representation and voting behavior.

Daniel Pemstein is Associate Professor of Political Science at North Dakota State University and Project Manager for Measurement Methods of the Varieties of Democracy (V-Dem). He specializes in measurement and builds statistical tools to study political institutions, parties, and careers.

Brigitte Seim is Assistant Professor of Public Policy at the University of North Carolina, Chapel Hill, and Project Manager for Experiments of Varieties of Democracy (V-Dem). Her research examines the relationship between citizens and political officials.

Svend-Erik Skaaning is Professor of Political Science at Aarhus University and Project Manager for Varieties of Democracy (V-Dem). His research examines the conceptualization, measurement, and explanation of democracy and other governance-related phenomena.

Jan Teorell is Professor of Political Science at Lund University and co-Principal Investigator for Varieties of Democracy (V-Dem). His research interests include political methodology, comparative politics and democratization, corruption, and state-making.
Varieties of Democracy

Measuring Two Centuries of Political Change

MICHAEL COPPEDGE
University of Notre Dame

JOHN GERRING
University of Texas at Austin

ADAM N. GLYNN
Emory University

CARL HENRIK KNUTSEN
University of Oslo

STAFFAN I. LINDBERG
University of Gothenburg

DANIEL PEMSTEIN
North Dakota State University

BRIGITTE SEIM
University of North Carolina at Chapel Hill

SVEND-ERIK SKAANING
Aarhus University

JAN TEORELL
Lund University
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7.1 A sample application of the method of composition

7.2 Percentages of experts for column survey who were also experts for the row surveys
Contributors

Altman, David
Bernhard, Michael
Bizzarro, Fernando
Coppedge, Michael
Gerring, John
Glynn, Adam N.
Knutsen, Carl Henrik
Krusell, Joshua
Lindberg, Staffan I.
Maguire, Matthew
Marquardt, Kyle
McMann, Kelly
Mechkova, Valeriya
Miri, Farhad
Pemstein, Daniel
Pernes, Josefine
Seim, Brigitte
Skaaning, Svend-Erik
Staton, Jeffrey
Stepanova, Natalia
Teorell, Jan
Tzelgov, Eitan
Wang, Yi-ting
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