Economic Analysis of the Digital Economy
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8. Unless otherwise determined by the Board or exempted by the terms of paragraphs 6 and 7, a copy of this resolution shall be printed in each NBER publication as described in paragraph 2 above.
## Contents

Acknowledgments  xi

**Introduction**  1
Avi Goldfarb, Shane M. Greenstein, and Catherine E. Tucker

### I. Internet Supply and Demand

1. **Modularity and the Evolution of the Internet**  21
   Timothy Simcoe
   *Comment: Timothy F. Bresnahan*

2. **What Are We Not Doing When We Are Online?**  55
   Scott Wallsten
   *Comment: Chris Forman*

### II. Digitization, Economic Frictions, and New Markets

3. **The Future of Prediction: How Google Searches Foreshadow Housing Prices and Sales**  89
   Lynn Wu and Erik Brynjolfsson

4. **Bayesian Variable Selection for Nowcasting Economic Time Series**  119
   Steven L. Scott and Hal R. Varian
5. Searching for Physical and Digital Media:  
The Evolution of Platforms for Finding Books  
Michael R. Baye, Babur De los Santos,  
and Matthijs R. Wildenbeest  
*Comment:* Marc Rysman

6. Ideology and Online News
Matthew Gentzkow and Jesse M. Shapiro

7. Measuring the Effects of Advertising:  
The Digital Frontier  
Randall Lewis, Justin M. Rao,  
and David H. Reiley  
*Comment:* Christopher Stanton

8. Digitization and the Contract Labor Market:  
A Research Agenda  
Ajay Agrawal, John Horton, Nicola Lacetera,  
and Elizabeth Lyons  
*Comment:* Christopher Stanton

9. Some Economics of Private Digital Currency  
Joshua S. Gans and Hanna Halaburda

III. Government Policy and Digitization

10. Estimation of Treatment Effects from  
Combined Data: Identification versus  
Data Security  
Tatiana Komarova, Denis Nekipelov,  
and Evgeny Yakovlev

11. Information Lost: Will the “Paradise” That  
Information Promises, to Both Consumer  
and Firm, Be “Lost” on Account of Data  
Breaches? The Epic is Playing Out  
Catherine L. Mann  
*Comment:* Amalia R. Miller

12. Copyright and the Profitability of Authorship:  
Evidence from Payments to Writers in the  
Romantic Period  
Megan MacGarvie and Petra Moser  
*Comment:* Koleman Strumpf

13. Understanding Media Markets in the  
Digital Age: Economics and Methodology  
Brett Danaher, Samita Dhanasobhon,  
Michael D. Smith, and Rahul Telang
14. Digitization and the Quality of New Media Products: The Case of Music  
   Joel Waldfogel  
   407

15. The Nature and Incidence of Software Piracy: Evidence from Windows  
   Susan Athey and Scott Stern  
   Comment: Ashish Arora  
   443

Contributors  
   481
Author Index  
   485
Subject Index  
   491
It almost goes without saying, but it is worth saying nonetheless: we are grateful to our authors and discussants for working with us on this project. This was a collective effort of many contributors, and we thank all of the participants. We also thank the Sloan Foundation for their support and encouragement. In addition to funding, Danny Goroff, Josh Greenberg, and Paul Joskow each provided the advice, criticism, and praise necessary to create a successful project. Josh Lerner, Scott Stern, Nick Bloom, and Jim Poterba enabled the creation of a digitization initiative at the NBER. The NBER provided the intellectual home to the project, and we are grateful for the infrastructure and environment conducive to creative economic thinking about the impact of digitization. The staff at the University of Chicago Press and Rob Shannon and Helena Fitz-Patrick at the NBER provided essential support without which this book would have been impossible to complete. We thank the Kellogg School of Management for hosting our preconference in Chicago and Ranna Rozenfeld for hosting our dinner. Finally, we thank Rachel, Ranna, and Alex, as well as all of our children, for their patience with us as this project developed.