



## Supporting Online Material for **Computational Social Science**

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Published 6 February 2009, *Science* **323**, 721 (2009)  
DOI: 10.1126/science.1167742

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- Complete list of author affiliations
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## Supplementary Online Materials

“Computational Social Science” *Science* **323**: 721-723 (6 February 2009)

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**Acknowledgments**

This paper is an outgrowth of a December 7, 2007 conference by the same title. Thanks go to the Institute for Quantitative Social Science and the Program on Networked Governance at Harvard University (the latter supported by National Science Foundation grant # 0131923), and the MIT Legatum Center for sponsorship of that conference. Video of this conference is available at [http://www.hks.harvard.edu/netgov/html/computational\\_social\\_science.html](http://www.hks.harvard.edu/netgov/html/computational_social_science.html).

S. Aral acknowledges generous funding support from the Marketing Sciences Institute and the Institute for Innovation and Information Productivity. A.-L.B. is supported by James S. McDonnell Foundation 21st Century Initiative in Studying Complex Systems, the National Science Foundation within the DDDAS (CNS-0540348), ITR (DMR-0426737) and IIS-0513650 programs, the US Office of Naval Research Award N00014-07-C, The Office of Naval Research (ONR), Grant: N00014-07-C-0227 and by the Defense Threat Reduction Agency.

The viewpoints expressed in this article are the authors' alone.

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