1st Annual Commonwealth Computational Summit

Harnessing the Data Revolution

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National Science Foundation



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1

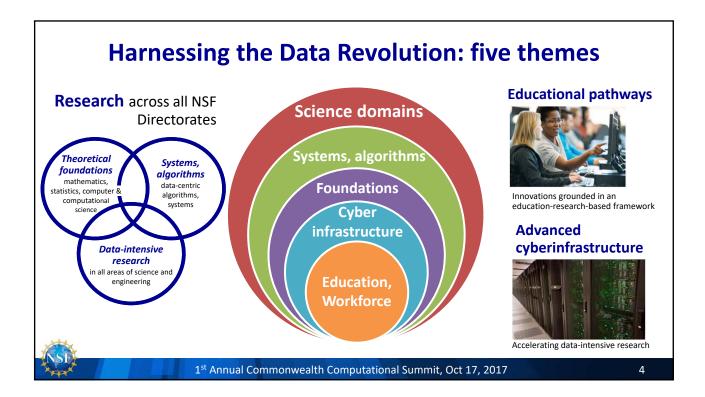


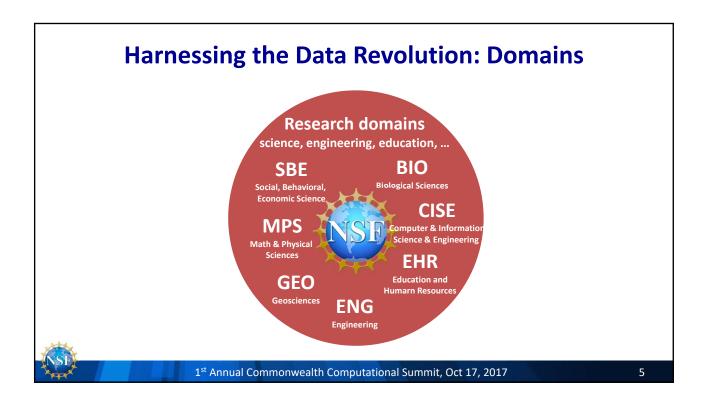


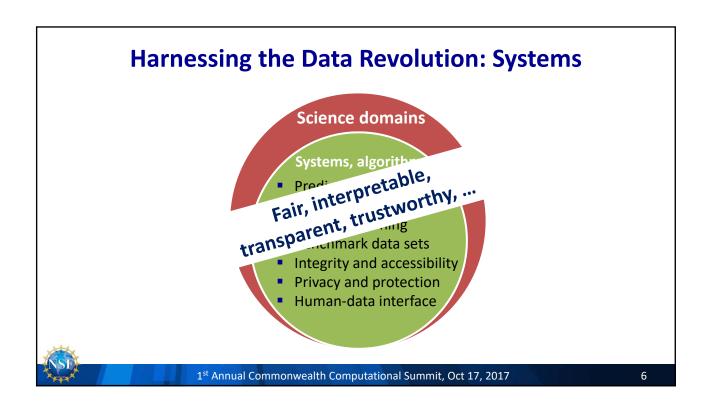
"Engage NSF's research community in the pursuit of **fundamental research in data science and engineering**, the development of a cohesive, federated, national-scale approach to **research data infrastructure**, and the development of **a 21st-century data-capable workforce**."

NSF

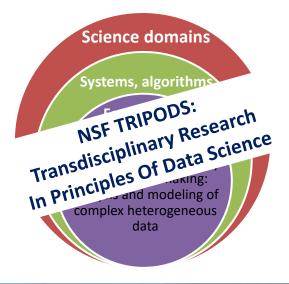
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Harnessing the Data Revolution: Foundations



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7

Data Science Foundations: TRIPODS

- TRIPODS: Transdisciplinary Research In Principles Of Data Science
 - Required close collaboration among CS, Math, Stats
 - Phase I: 3 years, 12 "Proto centers"
 - Possible Phase II: ~3 Large, national centers (subject to availability of funding).
 - · Important: Connection with applications domains, industry



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NSF TRIPODS Projects

TRIPODS Kickoff PI Meeting, Oct 12-13, Alexandria, VA

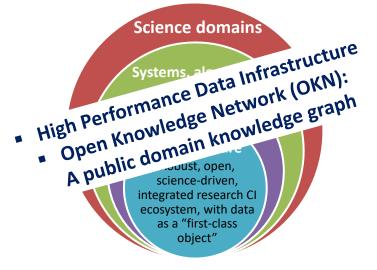
- 1. <u>UA-TRIPODS: Building Theoretical Foundations for Data Sciences</u>: Hao Zhang, University of Arizona
- 2. Foundations of Model Driven Discovery from Massive Data: Jeffery Brock, Brown University (Convergence and EPSCoR co-funding)
- 3. Berkeley Institute on the Foundations of Data Analysis: Michael Mahoney, University of California, Berkeley
- TRIPODS: Towards a Unified Theory of Structure, Incompleteness and Uncertainty in Heterogeneous Graphs: Lise Getoor, University of California, Santa Cruz
- 5. From Foundations to Practice of Data Science and Back: John Wright, Columbia University
- 6. TRIPODS: Data Science for Improved Decision-Making: Learning in the Context of Uncertainty, Causality, Privacy, and Network Structures: Kilian Weinberger, Cornell University (Convergence co-funding)
- Transdisciplinary Research Institute for Advancing Data Science (TRIAD): Xiaoming Huo, Georgia Institute of Technology
- 8. Collaborative Research: TRIPODS Institute for Optimization and Learning: Katya Scheinberg, Lehigh University; Han Liu, Northwestern University; Francesco Orabona, State University of New York at Stony Brook
- 9. <u>Institute for Foundations of Data Science (IFDS)</u>: Piotr Indyk, Massachusetts Institute of Technology
- Topology, Geometry, and Data Analysis (TGDA@OSU): Discovering Structure, Shape, and Dynamics in Data: Tamal Dey, The Ohio State University
- 11. Algorithms for Data Science: Complexity, Scalability, and Robustness: Sham Kakade, University of Washington
- 12. <u>Institute for Foundations of Data Science</u>: Stephen Wright, University of Wisconsin-Madison (Convergence cofunding)



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9

Harnessing the Data Revolution: Cyberinfrastructure



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Open knowledge network

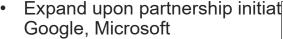
- An open web-scale knowledge network
 - Suggested by the community: Andrew Moore, CMU; Ramnathan Guha; et al.
- Semantically-linked concepts, data
 - To foster research on an entire class of new applications leveraging data, context, and inferences from data
- Question/answer interfaces, dialog-based interactions, explanatory/story-telling interfaces
- Joint academia, industry, government workshops
 - July 2016, Washington, DC
 - Feb 2017, Sunnyvale, CA
 - Oct 4,5, 2017, National Library of Medicine, Bethesda, Maryland
 - System architecture/software; data representation/curation; research related to representation and use of massive knowledge graphs
 - Domains discussed: Biomedical, Finance, Geoscience, Manufacturing



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11

CISE DCL on Cloud Computing



 Capitalize on the cloud provided of-the-art, on-demand, cloud cq



Community workshop on Cloud Computing and CS Research and Education

- Benefits of partnership
 - Access by CISE research and education community to a range of useful resources and services —scalable storage; real-time analytics; streaming data services; state-of-the-art compute nodes;
 - Ability to experiment with real datasets where scale and performance are key considerations. Exploit resources offered by the cloud providers

Harnessing the Data Revolution: Education

Science domains

- Envisioning the Data Science Discipline: The

 Undergraduate Perspective, National Academy of Sciences, study/workshops
 - https://www.nap.edu/catalog/24886/ (Interim Report)
- Keeping Data Science Broad: Negotiating the Digital and Data Divide, Oct.31-Nov.1, 2017, Atlanta, GA (Renata Rawlings-Goss, GaTech)
- Convergence/HDR Workshop: Social Science Insights for 21st Century Data Science Education (SSI) (PI: Cathryn Carson, co-Pis: David Culler, Saul Perlmutter, Berkeley)



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12

Putting it all Together: Translational Data Science

Application of data science techniques, tools in science and other applications domains

- 1st Workshop on Translational Data Science, June 26-27, 2017, U.Chicago (Robert Grossman, Chicago; Raghu Machiraju, OSU
- 2nd Workshop on TDS, November 13-14, UC Berkeley (David Culler, Berkeley)
- 3rd Workshop on TDS, planned for March 2018 (Kathy McKeown, Columbia; Juliana Freire, NYU; Deborah Estrin, Cornell Tech)



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Data Science Corps

Getting your hands dirty with data!

VISION

 Provide <u>practical experiences</u>, teach new skills, and offer teaching opportunities in data science to U.S. data scientists and data science students, in the service of science and society

MISSION:

- Enable U.S. data scientists and data science students to obtain practical experience with data-intensive applications;
- Promote a better understanding of the power of data, and the role that data can play in addressing issues at the local, regional, national, and international levels;
- Teach data literacy and provide basic training in data science to the existing workforce in communities, organizations, and institutions at the local, state, national, and international levels

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14

1st Data Science Corps Workshop, Dec 7-8, 2017, McCourt School of Public Policy, Georgetown University **Data Science Corps** Data Science Corps Volunteers / Volunteer Organizations Data Science Corps Projects / Project Organizations **Professionals** Students from Industry, NGOs from Academic Institutions Data Science for Social Good Universities Edu Industry rstitutio Government Undergrad / Grad Universities; 4-year Colleges; Transportation, Community Colleges; Smart & Energy, Basic Criminal Online Programs; Connected Health iustice Research Communities 1st Annual Commonwealth Computational Summit, Oct 17, 2017

Thank You!

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