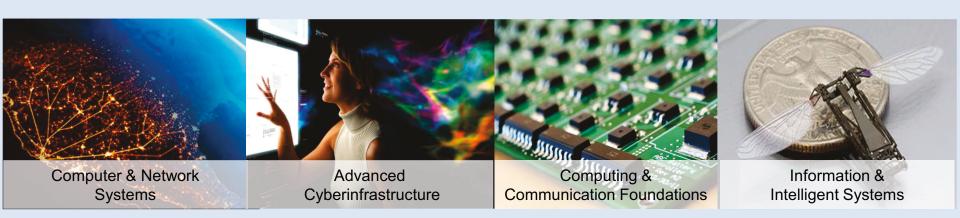


# Harnessing the Data Revolution: A Perspective from the National Science Foundation



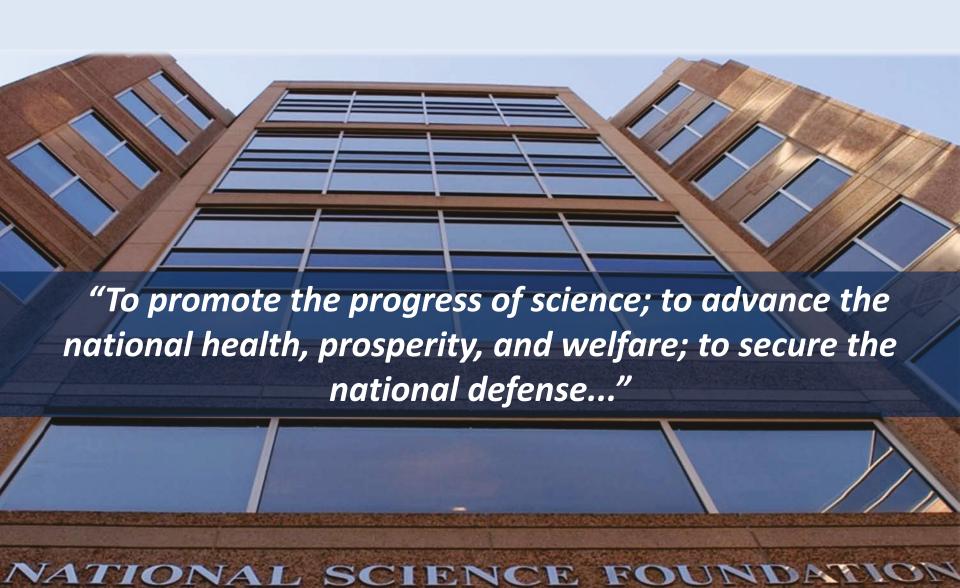
### Chaitan Baru Senior Advisor for Data Science

Computer & Information Science & Engineering
National Science Foundation

NDIC Meeting
June 2016, Denver, CO



#### **National Science Foundation's Mission**





# NSF's Big Data / Data Science Programs

Foundational research to develop new techniques and technologies to derive knowledge from dat

New **cyberinfrastructure** to manage, curate, and serve data to research communities

**Policy** 

New approaches for education and workforce development

New types of interdisciplinary collaboration, community building





#### Big Data / Data Science Research

#### Foundational research

 BIGDATA, QuBBD, CDS&E, BDD, FutureCloud

New **cyberinfrastructure** to manage, curate, and serve data to research communities

#### **Policy**

New approaches for **education** and **workforce development** 

New types of inter-disciplinary collaboration, community building

- BIGDATA (cross-Directorate)
  - Focus on Foundational Approaches and Innovative Applications
- QuBBD (MPS/DMS and NIH)
  - Quantitative Approaches in Biomedical Big Data

- CDS&E (cross-Directorate)
  - Computational and Data Science and Engineering
- BDD (CISE/CCF, IIS)
  - Big Data and Disaster Research
- FutureCloud (CISE/CNS)





### Big Data / Data Science Infrastructure

Foundational research to develop new techniques and technologies to derive knowledge from data

New approaches for **education** and **workforce development** 

#### Cyberinfrastructure

 CC\*, DIBBS, National Computing Resources

Policy

New types of inter-disciplinary collaboration, community building

- CC\*DNI (CISE/ACI)
  - Campus Cyberinfrastructure Data,
     Networking, and Innovation Program
- DIBBS (CISE/ACI, with other Directorates)
  - Data Infrastructure Building Blocks
  - EarthCube (with GEO)

- RIDIR (SBE)
  - Resource Implementations for Data Intensive Research in the Social Behavioral and Economic Sciences
- BCC (EHR)
  - Building Community and Capacity in Data Intensive Research in Education



## Big Data / Data Science Infrastructure

Foundational research to develop new techniques and technologies to derive knowledge from data New **cyberinfrastructure** to manage, curate, and serve data to research communities

#### **Policy**

### Education and workforce development

 NSF Research Traineeship (NRT) New types of inter-disciplinary collaboration, community building

- Data Science Education workshop, Aug 5-7, 2015, UW (CISE, EHR)
  - Brought together ~100 graduate students across different disciplines, engaged in data science research





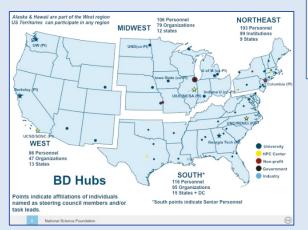
### Big Data / Data Science Infrastructure

**Foundational research** to develop new techniques and technologies to derive knowledge from data

New **cyberinfrastructure** to manage, curate, and serve data to research communities

#### **Policy**

New approaches for **education** and **workforce development** 



#### **Community building**

 Big Data Regional Innovation Hubs and Spokes (BD Hubs/Spokes)

Also, Research Data Alliance, RDA (rd-alliance.org)



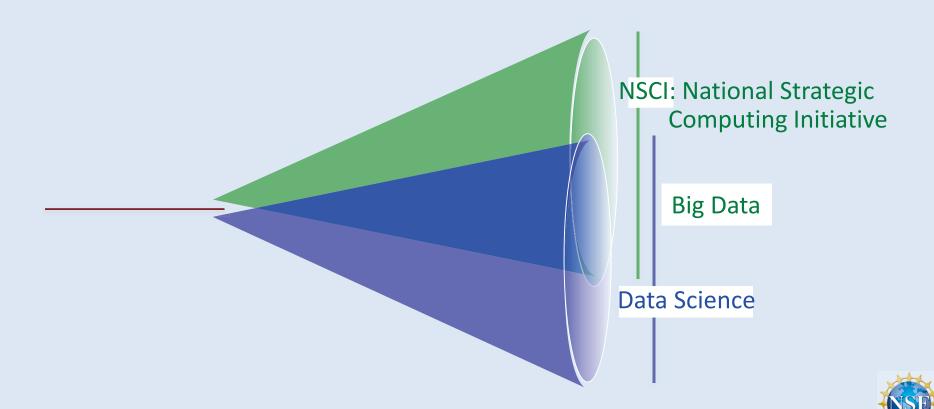
#### 2017: Looking Ahead – New Initiatives

- Smart and Connected Communities (S&CC)
  - Improving quality of life, health, well-being, and learning in communities
- Smart and Autonomous Systems (S&AS)
  - Making possible intelligent physical systems that sense, perceive, and operate in dynamic, uncertain, and unanticipated environments
- Secure and Trustworthy Cyberspace (SaTC)
  - Securing our Nation's cyberspace
- Understanding the Brain (UtB)
  - Improving understanding of the brain
- National Strategic Computing Initiative (NSCI)
  - Maximizing benefits of HPC for scientific discovery and economic competitiveness
- Data for Scientific Discovery & Action (D4SDA)
  - Enabling 21<sup>st</sup> century science, engineering, and education to move toward effective use of digital data to advance discovery



# NSCI and Data Science: Two related national imperatives

 High Performance Computing and Data Science in support of science and engineering discovery and competitiveness

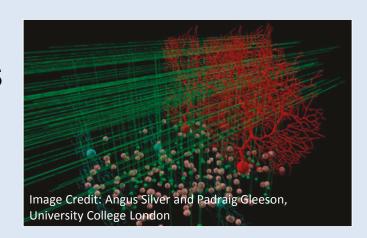


#### **National Strategic Computing Initiative (NSCI)**

Maximizing benefits of HPC for scientific discovery and economic competitiveness

#### **CISE Investment: \$19.70 M (2017)**

- Partnership among CISE (co-lead), MPS (co-lead), ENG, and GEO
- Aligns with Executive Order 13702,
   Creating a National Strategic Computing Initiative
- NSF with CISE leading plays a central role in:
  - Scientific discovery advances
  - Broader HPC ecosystem for scientific discovery
  - Workforce development









#### Data for Scientific Discovery & Action (D4SDA)

Enabling 21<sup>st</sup> century science, engineering, and education to move toward effective use of digital data to advance discovery

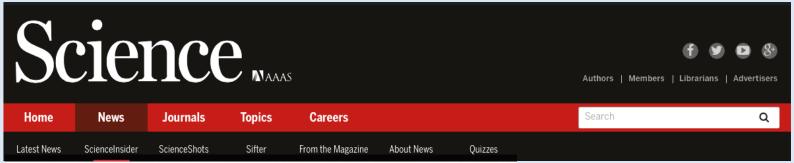
#### **CISE Investment: \$19.60 M (2017)**

- Aims to:
  - Promote foundational research in critical techniques, technologies
  - Provide innovative, reusable data and knowledge infrastructure to support data-intensive science
  - Enable/incent science community to address data governance, lifecycle issues
  - Educate data-savvy workforce of scientists, engineers, educators





#### **NSF** "Big Ideas"









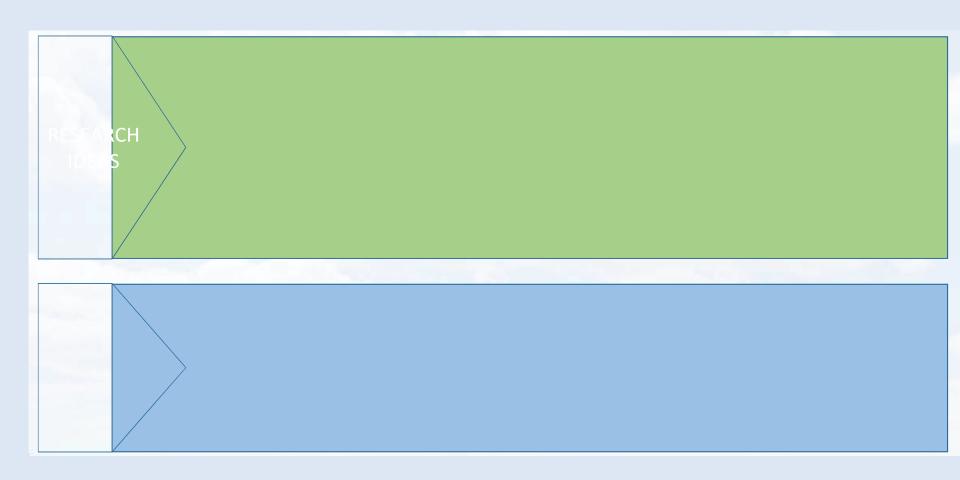
#### **NSF** "Big Ideas"

- Catalyze interest, investment in fundamental research
- Generate broad public appeal and attract partnerships with industry, private foundations, and academia
- Cutting-edge research agenda, appropriate for NSF
- Process: directorate discussions, white papers,
   AD retreat, subsequent collaborative refinement





### **NSF** "Big Ideas"

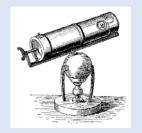


CISE will play a key role in many of these Big Ideas

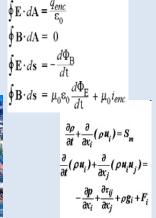


#### **Harnessing the Data Revolution**

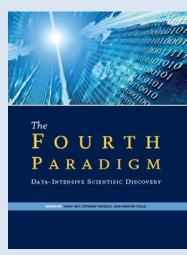
AD Retreat: CISE white paper











**Experimental** 

Theoretical

Computational

**Data** 

**Vision:** move beyond isolated, standalone approaches for data science, services and infrastructure towards a cohesive, federated, national-scale approach that will **harness** the data revolution and **transform** U.S. science, engineering, and education over the next decade and beyond

#### Data: critical across all of science



#### **BIGDATA**





Today's Data, Tomorrow's Discoveries

Increasing Access to the Results of Research Funded by the National Science Foundation

National Science Foundation

March 18, 2015











National Science Foundation Research Traineeship (NRT) **Program** 











RESEARCH DATA ALLIANCE

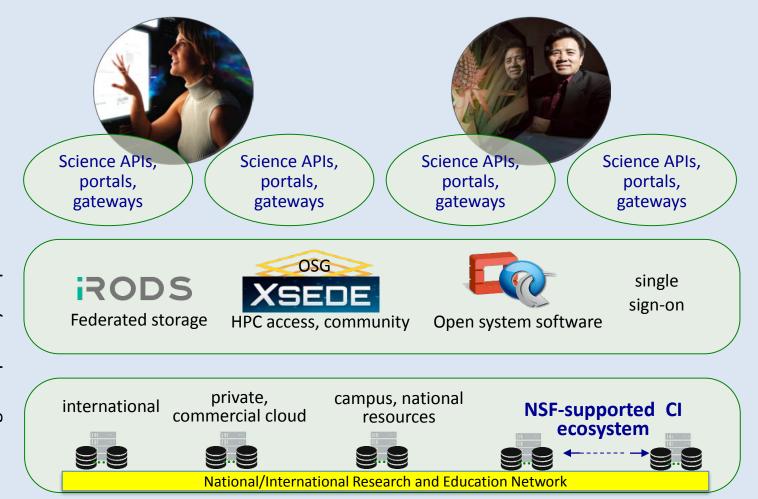
#### **Harnessing the Data Revolution\***

- fundamental research in mathematics, statistics, computer and computational science: data-driven discovery, decision-making
- fundamental research on data topics: data discovery and integration, predictive analytics, data mining, machine learning; data semantics, open data-centric architectures and systems, reproducibility, privacy and protection, human-data interface
- engagement of the research domains supported across NSF: use advances in data science and CI to further research
- embodiment of these innovations in a robust, comprehensive, open, science-driven, CI ecosystem: accelerating a broad spectrum of data-intensive research, including large-scale, MREFC facilities
- development and evaluation of innovative learning opportunities and educational pathways, grounded in an education-researchbased understanding of needs

# Increasing interdisciplinary sharing Increasing disciplinary emphasis

#### A vision for research cyberinfrastructure

An open national research CI architecture





Governance, policy, sustainability

#### A vision for research cyberinfrastructure

Architecting an open national data infrastructure



Science APIs, portals, gateways Science APIs, portals, gateways Science APIs, portals, gateways

### New Data Services: Access, Discovery, Deep Analytics, Semantics

**Existing Ci services** 

international private, campus, national resources

NSF-supported Cl ecosystem

National/International Research and Education Network

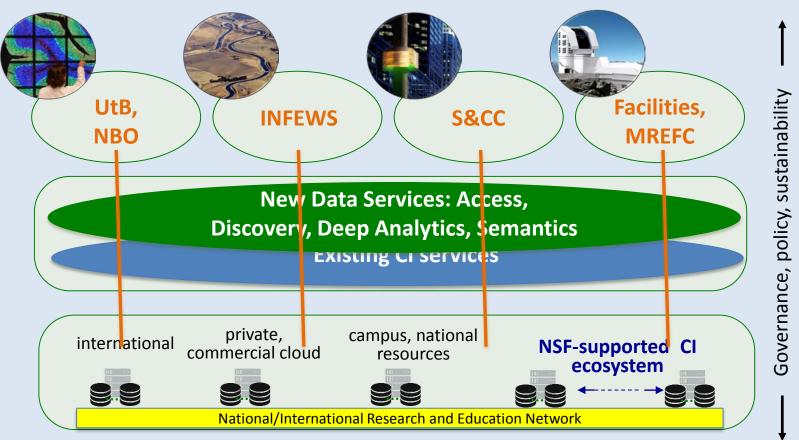
Governance, policy, sustainability



#### A vision for research cyberinfrastructure

Architecting an open national data infrastructure

Enabling and accelerating science drivers, including NSF initiatives & facilities





#### We are ready!

- NSF has help set the foundation:
  - CIF21 initiative
  - BIGDATA, ML investments
  - EarthCube
  - Research Data Alliance (RDA)
  - Data Hubs (and Spokes) investments
  - Resource Implementations for Data Intensive Research in the SBE (RIDIR)
  - DataONE
  - iDigBio
  - Public Access Plan
- Federal government partners
- Industry, state/local partners (e.g., Data Hubs)



#### **Urgency: A national imperative**

#### Research

Just as computational science transformed scientific research in the 20<sup>th</sup> century, so too can data science fundamentally transform scientific research in this century.

#### Research Infrastructure

Just as HPC and NSFNET enabled and accelerated new science and engineering research in the 20<sup>th</sup> century, so too can national data infrastructure enable and accelerate new science and engineering in this century.

If not us, who? If not now, when?



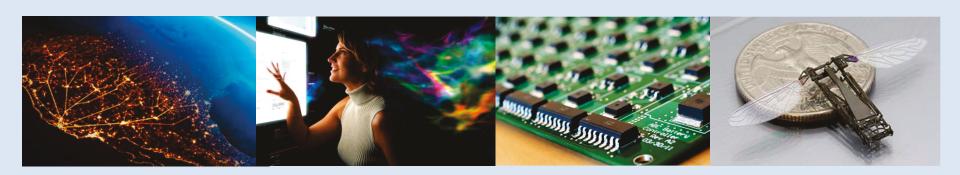
#### Some Related Events / Activities

- Recent meetings
  - US-UK Health Data Science Workshop, March 1-2, 2016, NIH Campus, Bethesda, MD. Hosted by Stanford University, in conjunction with the Research Councils of the United Kingdom (RCUK), NIH, NSF
  - NSF BIGDATA PI Meeting, April 20-21, Arlington, VA
  - NSF Workshop on TFODS: Theoretical Foundations of Data Science, April 28-30, 2016
- Upcoming events
  - CATS Workshop on Causal Inference from Big Data, Washington DC, June 2016
  - NAS Workshops on Envisioning the Data Science Discipline:
     The Undergraduate Perspective, Washington DC, 2016
  - NITRD Workshop on Metrics for Assessing the Value of Digital Data Repositories, Washington DC, 2016
  - BD Hubs Annual Meeting, Washington DC, 2016





#### An amazing time to be in CISE!



- Ubiquity: computing seems to be everywhere: science and engineering, workforce, societal
- Engagement: with many communities
- Urgency: rapidly expanding and evolving field opportunity(!) in a time of fiscal uncertainty



#### Thanks!

Chaitan Baru, <a href="mailto:cbaru@nsf.gov">cbaru@nsf.gov</a>, (703) 292-4541





#### **Smart & Connected Communities (S&CC)**

Improving quality of life, health, well-being, and learning in communities

#### **CISE Investment: \$16.50 M**

- Partnership among CISE, EHR, ENG, GEO, and SBE
- Network of regional research hubs to advance fundamental research
  - Advanced networking; physical sensors/devices; large-scale data management, analysis, and decision making, security, privacy
- Builds on previous investments in Urban Science and US Ignite





#### Smart & Autonomous Systems (S&AS)

Making possible intelligent physical systems that sense, perceive, and operate in dynamic, uncertain, and unanticipated environments

- Advances interstices of NRI and CPS
  - National Robotics Initiative (NRI): "corobots" – robots that work alongside, or cooperatively with, people
  - Cyber-Physical Systems (CPS): deeply integrating computation, communication, control into physical systems, typically with provably correct behavior
- Exceeding today's capabilities in adaptability, autonomy, functionality, efficiency, reliability, safety, usability, recoverability, recyclability







#### Secure and Trustworthy Cyberspace (SaTC)

Securing our Nation's cyberspace

#### **CISE Investment: \$70.50 M**

- Partnership among CISE, EHR, ENG, MPS, and SBE
- Aligns with 2016 Federal
   Cybersecurity Research and
   Development Strategic Plan
- CISE emphases:
  - Secure and Trustworthy Cyberspace program
  - NSF/Intel Partnership on Cyber-Physical Systems Security and Privacy (CPS-Security)
- Emerging areas:
  - Experimental testbeds
  - Science of privacy
  - Network and cloud security









#### **Understanding the Brain (UtB)**

Improving understanding of the brain

**CISE Investment: \$23.58 M** 

- Partnership among all NSF directorates
- Includes the BRAIN Initiative
- National Brain Observatory
  - Partnership among CISE, BIO, EHR, ENG, MPS, and SBE
  - Facilitate coordination of largescale data collection efforts nationally and internationally to advance understanding of brain function





