# Enriching Data Science R&D Projects through Strategic Engagements

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### Opportunities for International Engagements

- Translational Data Science
  - Ethics and Policy
  - "Blue Collar" data science
- The Open Knowledge Network
  - Data and knowledge as infrastructure
- Data Science Education and Training
- Data Science Corps



#### Putting it all Together: Translational Data Science

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

#### Foundations

Cyber

- 1<sup>st</sup> 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)
- 3<sup>rd</sup> Workshop on TDS, planned for ~March 2018 (Juliana Freire, NYU)

algorithms

Workforce



## Translational Data Science challenges: From Workshop 1

- Responsible data science
- Data quality
- Best practices around data triage and cost planning with respect to scale, quality, freshness, and heterogeneity
- Data and model commons



## TDS Challenges: From Workshop 2

- Recognizing the data science researcher and professional
- Telling the data science story
  - Explaining what analysis/analyses were performed, and why
- Telling the "application story" with the data
  - What the data could possibly do for you
- "Blue collar" data science
  - Not Google, Amazon, Facebook, Twitter problems
  - E.g Honda in the US Midwest



### Big Data and Data Policies

- Ethics and policies reflect local norms and regulations
  - Divergence of issues
- Examples
  - EU has passed the GDPR (General Data Protection Regulation)
  - US has Federal Information Security Modernization Act (FISMA) and Health Insurance Portability and Accountability Act (HIPAA)
  - India: Supreme Court passed the citizens "Right to Privacy"
    - Implications for the country's biometric identification program (Aadhaar)
  - Japan, China, etc ...
  - Data Policy: A ripe area for international research



## Data and Knowledge as Infrastructure: The Open Knowledge network

- An open, community-driven web-scale knowledge network
  - Initiated by the community: Andrew Moore, CMU; Ramanathan Guha, Google, et al
- Semantically-linked concepts, data
  - Foster research on a new class of applications leveraging data, context, and inferences from data
- Rich interfaces to data/knowledge
  - Question/answer; Dialog-based; Explanatory and Story-telling interfaces



## The Open Knowledge Network

- 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



### Data Science Education and Training

Envisioning the Data Science Discipline: The
 Undergraduate Perspective, National Academy of
 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)
- Fostering community groups for:
  - Defining Data Science curriculum (undergraduate and graduate levels)
  - Developing program evaluation and assessment methods



#### **Data Science Corps**

#### Getting your hands dirty with data!

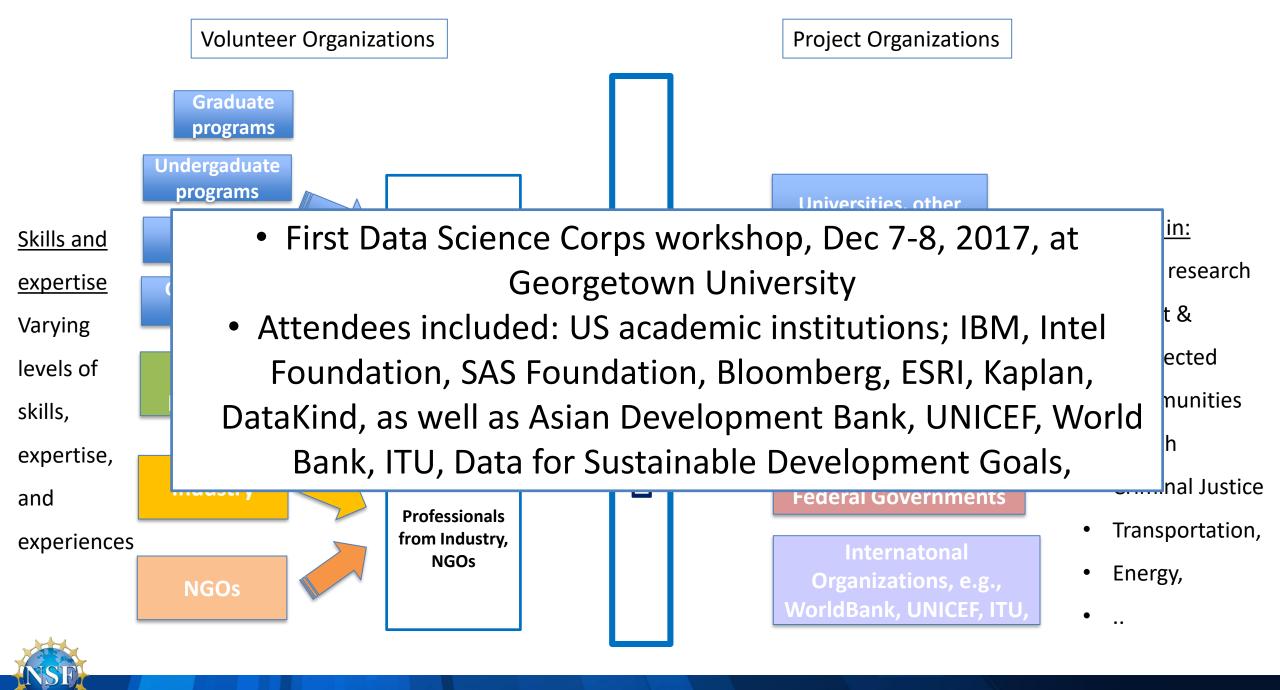
#### VISION

 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





#### Thank You!

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