

# A 20-YEAR COMMUNITY ROADMAP FOR ARTIFICIAL INTELLIGENCE RESEARCH IN THE US

CRA Computing Community Consortium  
Association for the Advancement of Artificial Intelligence  
and the computing research community

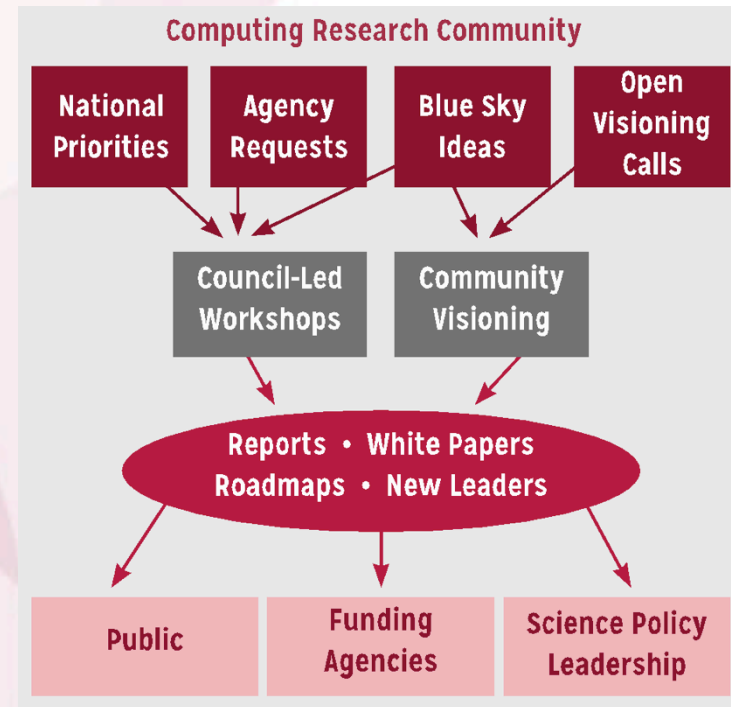
Leads: Yolanda Gil and Bart Selman

ITIF AI Policy Network  
22 October 2019

Presenting: Liz Bradley, with help from Ann Drobni and Peter Harsha

# COMPUTING COMMUNITY CONSORTIUM

The mission of the Computing Research Association's Computing Community Consortium (CCC) is to **catalyze** the computing research community and **enable** the pursuit of innovative, high-impact research.



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Association



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# ASSOCIATION FOR THE ADVANCEMENT OF ARTIFICIAL INTELLIGENCE

The Association for the Advancement of Artificial Intelligence (AAAI) is an international scientific society devoted to promote research in, and responsible use of, artificial intelligence.

AAAI also aims to increase public understanding of AI, improve the teaching and training of AI practitioners, and provide guidance for research planners and funders concerning the importance and potential of current AI developments and future directions.



# ROADMAP: PROCESS

- Summer 2018: CCC discusses potential Roadmap leaders with academia, government, & industrial stakeholders; selects AAAI president (Gil) & president-elect (Selman)
- Fall 2018: Co-leaders, together with AI community, design three workshops
- Nov 2018-Jan 2019: Workshops take place
- Jan 2019: Town hall at AAAI; meetings with key stakeholders
- Mar-Apr 2019: DC briefings at OSTP, NSF, DARPA, NITRD AI-IWG, DIB, and Hill with CRA
- Apr 2019: CCC and community feedback
- August 2019: final release of Roadmap



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# ROADMAP: FINDINGS

- AI will be transformative: rapid, worldwide impact
- At the same time, there are many concerns about the security and vulnerability of systems with these capabilities, as well as about the future of work in an AI-enabled world
- Accelerating industry successes in AI: built on academic foundations and facilitated by massive data sets, compute power, and human resources



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# ROADMAP: FINDINGS, CONT.

- Few of AI's big challenges can be solved by piecing together academic research projects
- Many of the associated issues and problems are outside of industry scope, priorities, and timelines

## ARTIFICIAL INTELLIGENCE (AI) LANDSCAPE



- Data-driven AI methods are highly effective but have important flaws
- Industry focuses largely on practical, near-term solutions using massive proprietary resources
- Academia asks many of the fundamental long-term questions that lay the foundations for AI

- The next generation of AI challenges will require bringing academia, industry, and government together



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# ROADMAP: RECOMMENDATIONS

- I. National AI Infrastructure
  - National AI Research Centers
  - Mission-Driven AI Labs
  - Open AI platforms and resources
  - Sustained community-driven AI challenges
- II. Training an AI Workforce
- III. Core AI Programs



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# NATIONAL AI RESEARCH CENTERS

- Multi-university centers with affiliated institutions, focused on pivotal areas of long-term AI research (e.g., integrated intelligence, trust and responsibility)
- Decade-scale funding to support on the order of 100 faculty, 200 AI engineers, 500 students, and necessary computing infrastructure
- Visiting fellows from academia, industry, and government will enable cross-cutting research and tech transfer

Some possible models:



# National Artificial Intelligence (AI) Research Institutes: Accelerating Research, Transforming Society, and Growing the American Workforce

## PROGRAM SOLICITATION NSF 20-503



### National Science Foundation

Directorate for Computer and Information Science and Engineering

Directorate for Biological Sciences

Directorate for Education and Human Resources

Directorate for Engineering

Directorate for Geosciences

Directorate for Mathematical and Physical Sciences

Directorate for Social, Behavioral and Economic Sciences

Office of Integrative Activities

**Anticipated Type of Award:** Standard Grant or Cooperative Agreement

**Estimated Number of Awards:** 9 to 14

NSF plans to make 1-6 Institute Awards and approximately 8 Planning Grants.

**Anticipated Funding Amount:** \$24,000,000 to \$124,000,000



National Institute of Food and Agriculture



Department of Homeland Security, Science & Technology Directorate



U.S. Department of Transportation, Federal Highway Administration



U.S. Department of Veterans Affairs



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# National Artificial Intelligence (AI) Research Institutes: Accelerating Research, Transforming Society, and Growing the American Workforce

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The 2019 update to the [National Artificial Intelligence Research and Development Strategic Plan](#), informed by [visioning activities in the scientific community](#) as well as [interaction with the public](#), identifies as its first strategic objective the need to make long-term investments in AI research in areas with the potential for long-term payoffs in AI. This funding opportunity seeks to enable such research through a set of new AI Research Institutes.



National Institute of Food and Agriculture



Department of Homeland Security, Science & Technology Directorate



U.S. Department of Transportation, Federal Highway Administration



U.S. Department of Veterans Affairs



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# MISSION-DRIVEN AI LABORATORIES

- Living laboratories for AI development in targeted problem domains with great societal impact (AI-ready homes, hospitals, schools, ...)
- Designed to allow AI researchers access to unique data and collaborations
- Decade-scale funding to support on the order of 50 permanent AI researchers, 50 visitors from AI Research Centers, 100-200 AI engineers and technicians, and 100 domain experts and staff



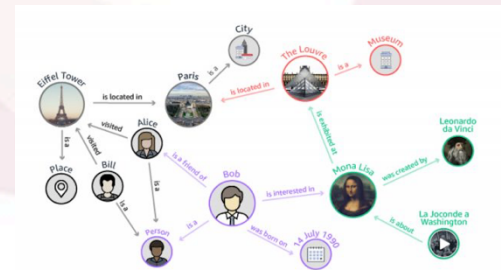
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# OPEN AI PLATFORMS AND RESOURCES

Open, shared R&D resources:

- AI platforms, facilities, testbeds
- Data, knowledge bases
- Toolsets, software, hardware, storage
- ...



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# AI CHALLENGES

- Sustained community-driven AI challenges
  - To move AI to the next step, we need to capitalize on the energies and synergies that are fostered by healthy competition, while promoting concerted progress on hard AI problems.



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# ROADMAP: RECOMMENDATIONS

- I. National AI Infrastructure
- II. Training a 21<sup>st</sup> Century AI Workforce
  - Curriculum development, at all levels, incorporating AI ethics and policy
  - Education and training beyond the traditional BA/BS (e.g., community college programs, certificate programs, online post-baccalaureate programs, ...)
  - Recruitment and retention programs (students *and* faculty, under-represented groups, ...)
  - Incentivizing interdisciplinary AI studies (incl. policy, law, societal impact, ...)
- III. Core AI Programs



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# ROADMAP: RECOMMENDATIONS

- I. National AI Infrastructure
- II. Training an AI Workforce
- **III. Core AI Programs**
  - Maintain and extend funding for these critical and fertile programs



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# National AI Research Infrastructure

## National AI Research Centers

- Focused on cross-cutting research themes
- Examples: Center on AI Trust and Responsibility, Center on Integrated Intelligence, etc.
- Resources in each Center would include at least:
  - 100 full-time faculty (in AI and other relevant disciplines)
  - 50 visiting faculty fellows and industry fellows
  - 200 AI engineers
  - 500 full-time students (graduate and undergraduate)
  - Computing and infrastructure support
- Multi-university centers with affiliates
- Multi-decade funding
- Train students at all levels
- Small-scale example models: Allen Institute for AI, CMU's SEI, USC's ICT

## Mission-Driven AI Laboratories

- Focused on societal drivers
- Examples: AI-ready hospitals, AI-ready homes, AI-ready schools, VR/robotics labs, etc.
- Living laboratories for hands-on research and collection of unique data
- Operations as well as workforce training
- Directors must have substantial AI credentials
- Resources in each laboratory would include at least:
  - 50 permanent AI researchers
  - 50 visitors from AI Research Centers
  - 100-200 AI engineers
  - 100 domain experts and staff (e.g., health experts collaborating in AI research)
- Multi-decade funding
- Analogous to Google's DeepMind (larger scale, approx. 400 AI scientists + 600 software developers), SLAC, NCAR, etc.



**Community Driven AI Challenges**

**Open AI Platforms and Resources**



**All-Encompassing Workforce Training**

# CHALLENGES TO US LEADERSHIP IN AI

SCIENCE \ US & WORLD \ TECH \

## China is about to overtake America in AI research

*China will publish more of the most-cited 50 percent of papers than America for the first time this year*

By [James Vincent](#) | Mar 14, 2019, 7:03am EDT

The Verge

## China Is Starting To Edge Out The US In AI Investment

February 12, 2019

[Artificial Intelligence](#)



[China](#)



[United States](#)



CBINSIGHTS

Intelligent Machines

## China may overtake the US with the best AI research in just two years

The number of influential AI research papers coming from China is increasing rapidly, a data analysis shows.

by Will Knight | March 13, 2019

MIT  
TECHNOLOGY  
REVIEW

BRAINPOWER

## Europe—not the US or China—publishes the most AI research papers

By [Dave Gershgorn](#) · December 12, 2018

Quartz

3,992 views | Sep 7, 2018, 12:03pm

## Is South Korea Poised To Be A Leader In AI?



**Kathleen Walch** Contributor  
COGNITIVE WORLD Contributor Group @  
[AI & Big Data](#)

Forbes

16,236 views | Nov 9, 2018, 12:10pm

## Artificial Intelligence, China And The U.S. – How The U.S. Is Losing The Technology War



**Steve Andriole** Contributor @  
[Enterprise & Cloud](#)

Forbes

# ROADMAP: RESEARCH PRIORITIES

## Research Priorities



### Integrated Intelligence

- Science of integrated intelligence
  - Contextualized AI
- Open knowledge repositories
- Understanding human intelligence



### Meaningful Interaction

- Collaboration
- Trust and responsibility
- Diversity of interaction channels
- Improving online interaction



### Self-Aware Learning

- Robust and trustworthy learning
- Deeper learning for challenging tasks
- Integrating symbolic and numeric representations
- Learning in integrated AI/robotic systems



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# ROADMAP: SOCIETAL DRIVERS

- ❖ Boost health and quality of life
- ❖ Provide lifelong education and training
- ❖ Reinvent business innovation and competitiveness
- ❖ Accelerate scientific discovery and technical innovation
- ❖ Expand evidence-driven social opportunity and policy
- ❖ Transform national defense and security



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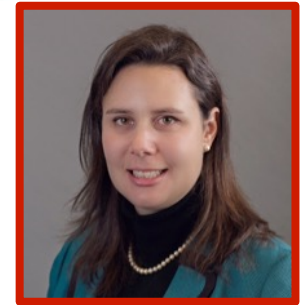
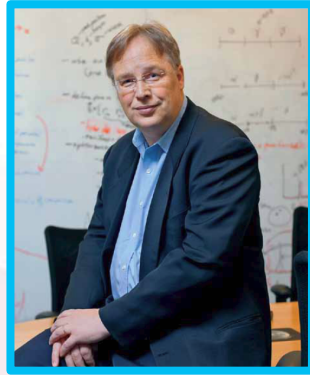


**AAAI**

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of Artificial Intelligence



# Thank you



# WORKSHOP LEADS



## **Integrated Intelligence**

- Science of integrated intelligence
- Contextualized AI
- Open knowledge repositories
- Understanding human intelligence

Marie des Jardins  
Simmons

Ken Forbus  
Northwestern



## **Meaningful Interaction**

- Collaboration
- Trust and responsibility
- Diversity of interaction channels
- Improving online interaction

Kathy McKeown  
Columbia

Dan Weld  
University of Washington



## **Self-Aware Learning**

- Robust and trustworthy learning
- Deeper learning for challenging tasks
- Integrating symbolic and numeric representations
- Learning in integrated AI/robotic systems

Tom Diettrich  
Oregon State University

Fei-Fei Li  
Stanford



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# BACKUP SLIDES



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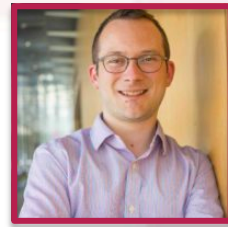
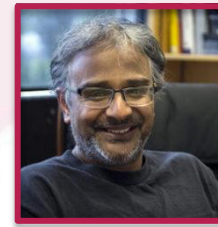
# THE CCC COUNCIL

Chair: Mark Hill

Vice Chair: Liz Bradley

## Terms ending June 2022

- Sujata Banerjee, VMware
- Elisa Bertino, Purdue University
- Tom Conte, Georgia Tech
- Maria Gini, University of Minnesota
- Chad Jenkins, University of Michigan
- Melanie Mitchell, Portland State University
- Katie Siek, Indiana University



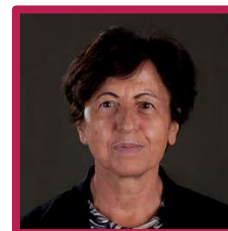
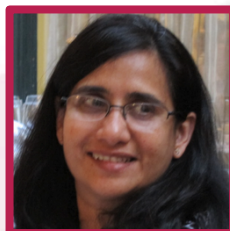
## Terms ending June 2021

- Ian Foster, University of Chicago
- Ronitt Rubinfeld, MIT
- Suresh Venkatasubramanian, Utah
- Daniel P. Lopresti, Lehigh University
- David C. Parkes, Harvard
- Shwetak Patel, Univ. Washington



## Terms ending June 2020

- Nadya Bliss, Arizona State
- Juliana Freire, NYU
- Keith Marzullo, Maryland
- Greg Morrisett, Cornell
- Jennifer Rexford, Princeton
- Ben Zorn, Microsoft Research



# ARTIFICIAL INTELLIGENCE



“Artificial Intelligence is the study of ideas that enable computers to be intelligent. Intelligence includes: ability to reason, ability to acquire and apply knowledge, ability to perceive and manipulate things in the physical world, and others.” (PHW 1984)



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- *Symbolic AI*
- logic systems
- planners, theorem provers
- rule-based systems
- qualitative reasoning
- ...
- *Statistical AI*
- machine learning
- neural nets
- support vector machines
- Bayesian techniques
- ...



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- Symbolic AI:
  - reasons generally and can report on its reasoning
  - but someone has to feed it the operative knowledge
  - and “knowledge engineering” is hard.
- Statistical AI:
  - works really well, but requires lots of information to learn from (training sets, priors, ...)
  - output = statistics, not explanations



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