

Plug and Play Macroscopes: Empowering Anyone To Convert Data Into Insights

Katy Börner

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Rockledge Two, 6701 Rockledge Drive, Bethesda, MD

February 11, 2016

Olivier H. Beauchesne, 2011. *Map of Scientific Collaborations from 2005-2009.*

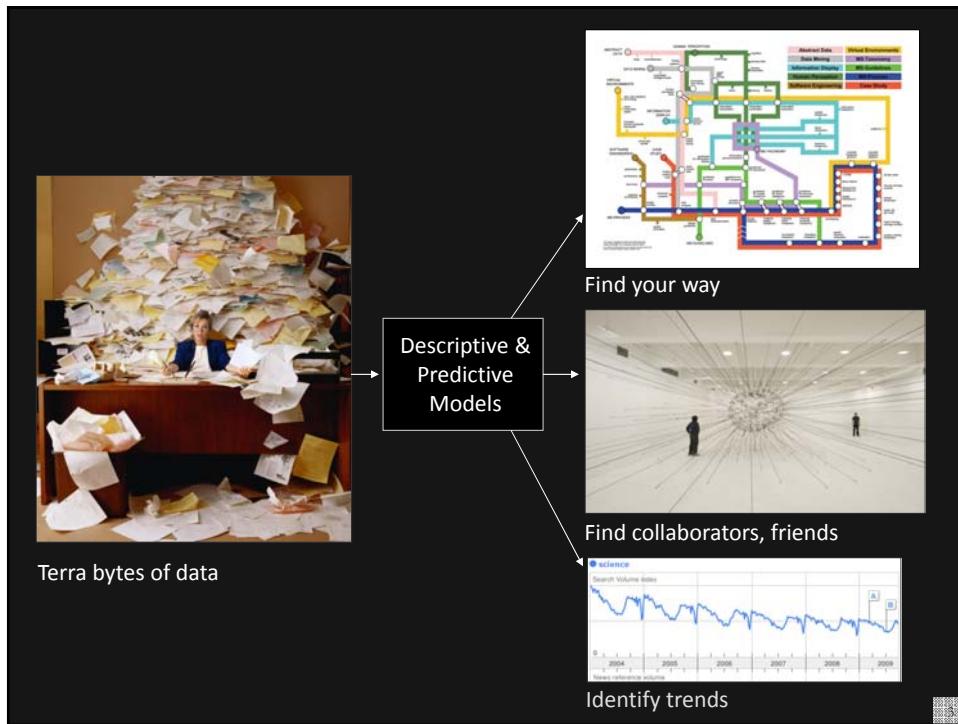
Computed Using Data from Elsevier's Scopus

Map of Scientific Collaborations from 2005-2009



Olivier H. Beauchesne, 2011. *Map of Scientific Collaborations from 2005-2009.*

Computed Using Data from Elsevier's Scopus



Type of Analysis vs. Level of Analysis

	<i>Micro/Individual (1-100 records)</i>	<i>Meso/Local (101–100,000 records)</i>	<i>Macro/Global (100,000 < records)</i>
Statistical Analysis/Profiling	Individual person and their expertise profiles	Larger labs, centers, universities, research domains, or states	All of NSF, all of USA, all of science.
Temporal Analysis (When?)	Funding portfolio of one individual	Mapping topic bursts in 20-years of PNAS	113 Years of Physics Research
Geospatial Analysis (Where?)	Career trajectory of one individual	Mapping a states intellectual landscape	PNAS publications
Topical Analysis (What?)	Base knowledge from which one grant draws.	Knowledge flows in Chemistry research	VxOrd/Topic maps of NIH funding
Network Analysis (With Whom?)	NSF Co-PI network of one individual	Co-author network	NIH's core competency

Type of Analysis vs. Level of Analysis

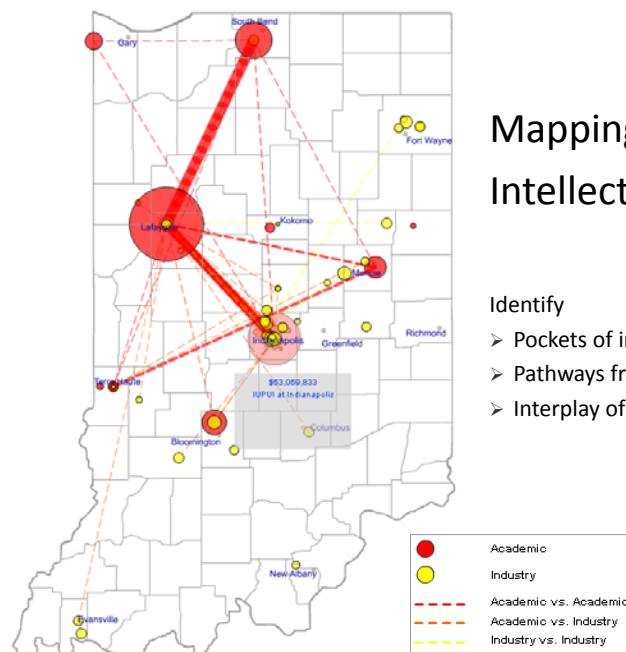
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Mapping Indiana's Intellectual Space

Identify

- Pockets of innovation
- Pathways from ideas to products
- Interplay of industry and academia



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VIVO Researcher Networking System

<http://vivo-netsci.cns.iu.edu/vivo12/vis/map-of-science/Person74>

Borner, Katy | Faculty Member

Positions

- Victor H. Yngve Professor of Information Science, [LIBRARY & INFORMATION SCIENCE](#) 2007 -
- Graduate Faculty Member w/Endorsement, [GRADUATE SCHOOL, EXECUTIVE MANAGEMENT/Academic SUPPORT](#) 2007 -
- Adjunct Professor, [INFORMATICS](#) 2009 -
- Professor Tenured/Tenure-Track, [LIBRARY & INFORMATION SCIENCE](#) 2009 -
- Adjunct Professor, [STATISTICS, Arts & Sciences](#) 2009 - 2012

Contact Info

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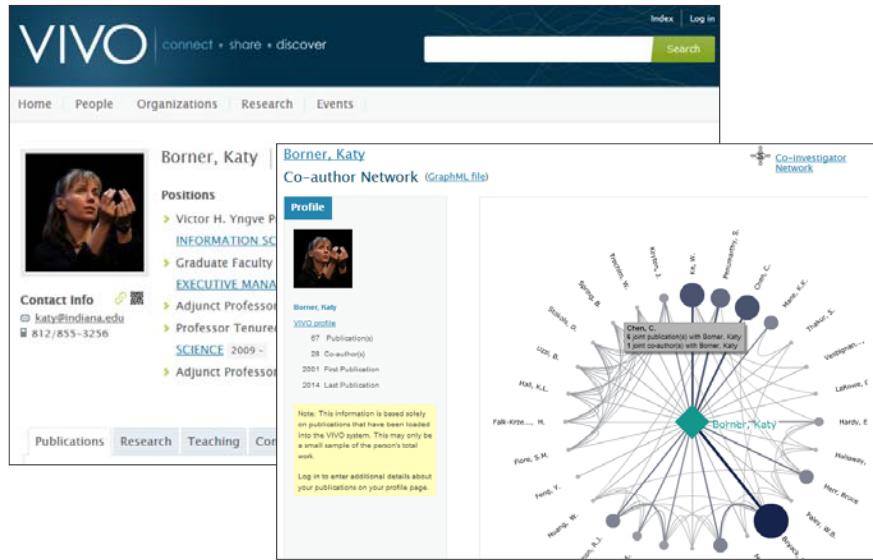
Publications in VIVO

[Co-author Network](#)
[Map of Science](#)
[Co-investigator Network](#)

Publications | Research | Teaching | Contact | View All

VIVO Researcher Networking System

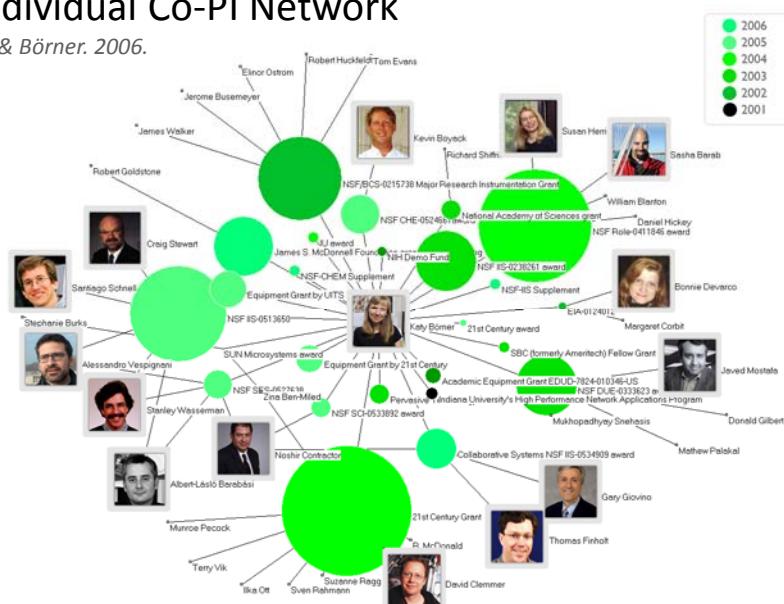
<http://vivo-netsci.cns.iu.edu/vivo12/vis/map-of-science/Person74>



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Individual Co-PI Network

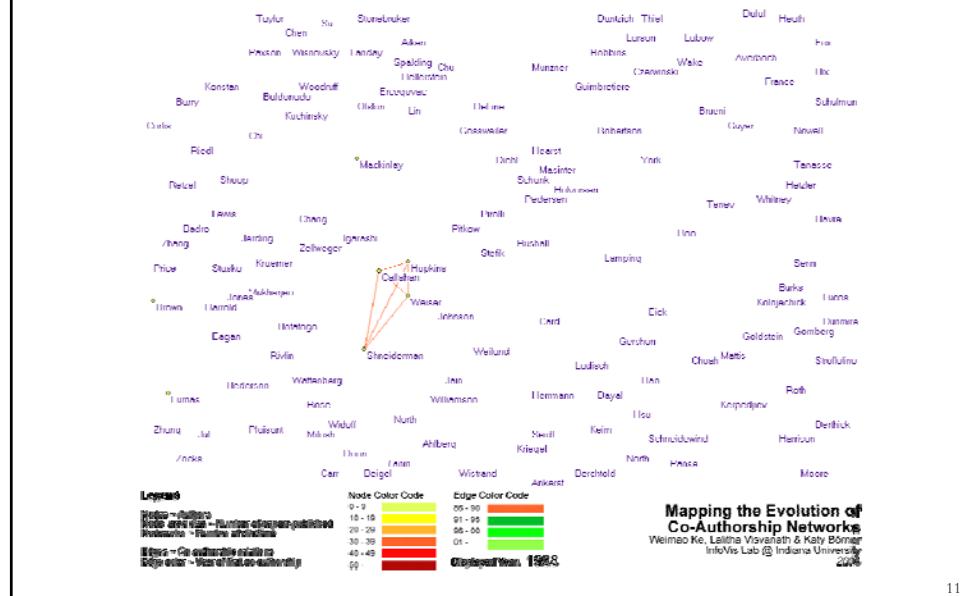
Ke & Börner. 2006.



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Mapping the Evolution of Co-Authorship Networks

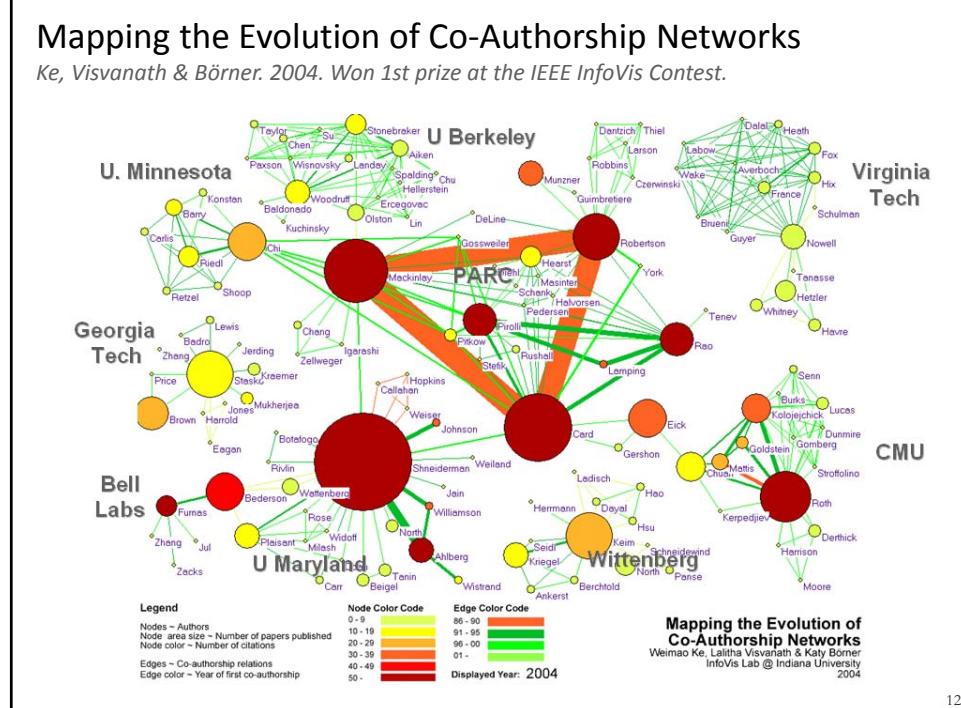
Ke, Visvanath & Börner. 2004. Won 1st prize at the IEEE InfoVis Contest.



11

Mapping the Evolution of Co-Authorship Networks

Ke, Visvanath & Börner. 2004. Won 1st prize at the IEEE InfoVis Contest.



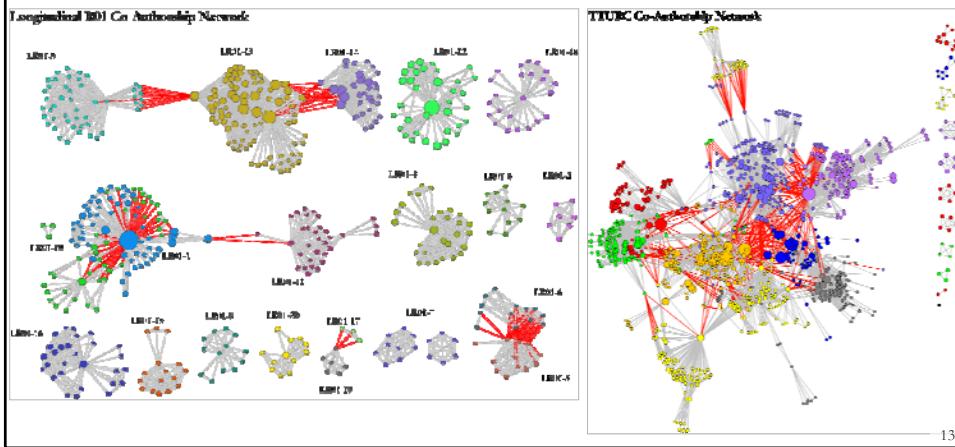
12

Mapping Transdisciplinary Tobacco Use Research Centers Publications

Compare R01 investigator-based funding with TTURC Center awards in terms of number of publications and evolving co-author networks.

Stipelman, Hall, Zoss, Okamoto, Stokols, Börner, 2014.

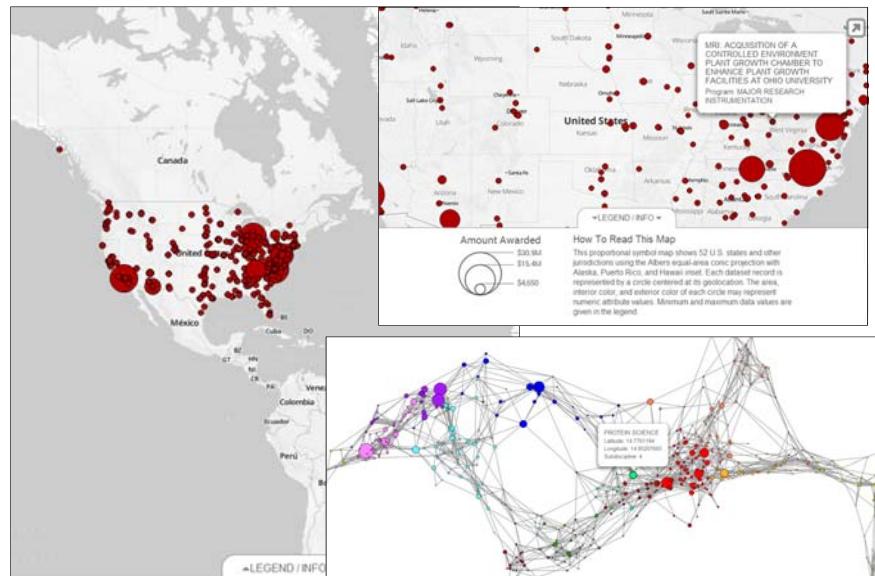
Supported by NIH/NCI Contract HHSN261200800812



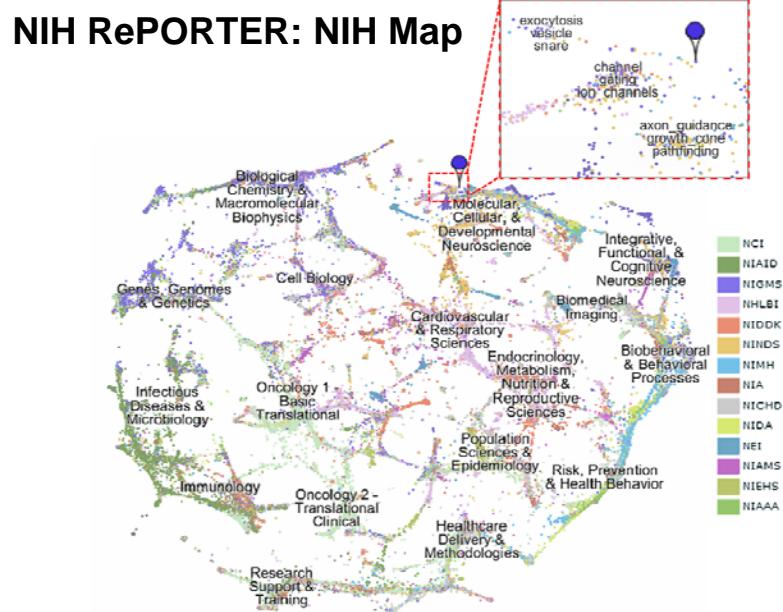
NIH RePORTER: Existing Interface



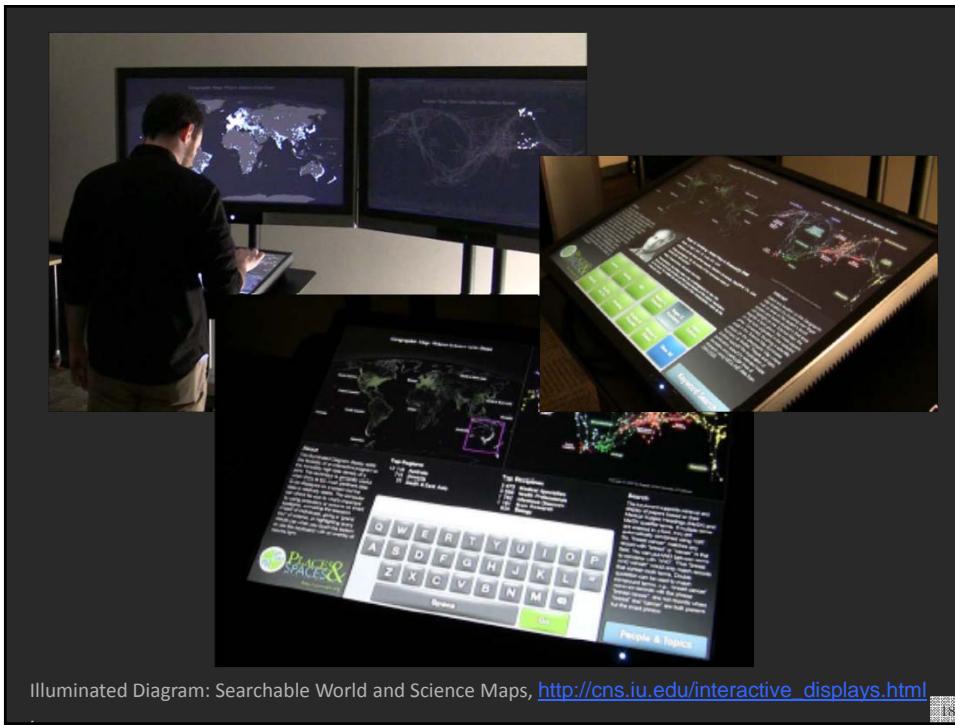
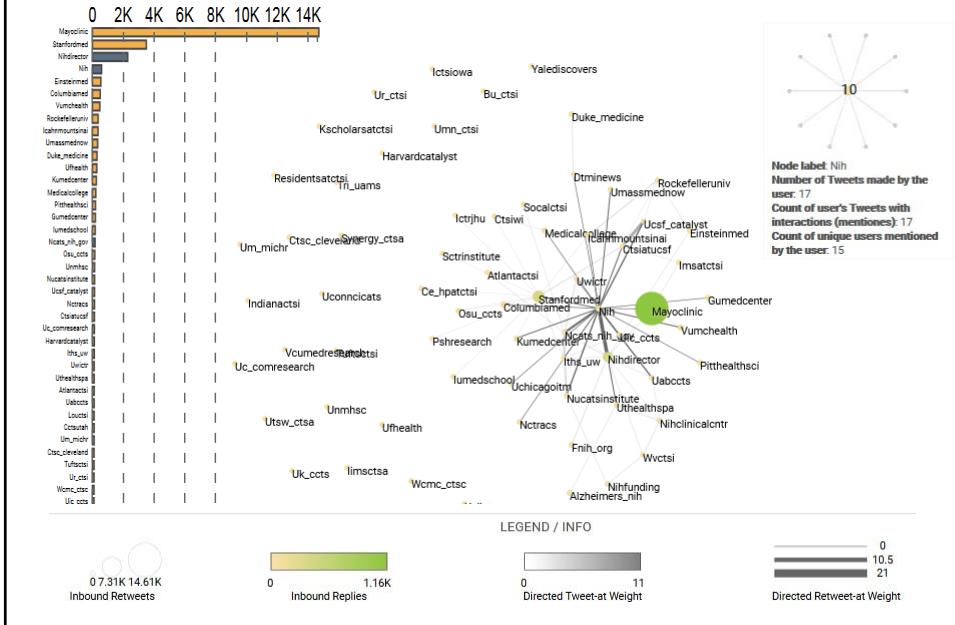
CISShell/Sci2 World and Science Visualizations of NIH RePORTER Data



NIH RePORTER: NIH Map



NIH Twitter Network





Science Maps in “Expedition Zukunft” science train visited 62 cities in 7 months.
Opening on April 23rd, 2009 by German Chancellor Merkel

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Places & Spaces at Northwestern University
May 14 - September 23, 2015

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Places & Spaces Exhibit at the David J. Sencer CDC Museum, Atlanta, GA
January 25-June 17, 2016

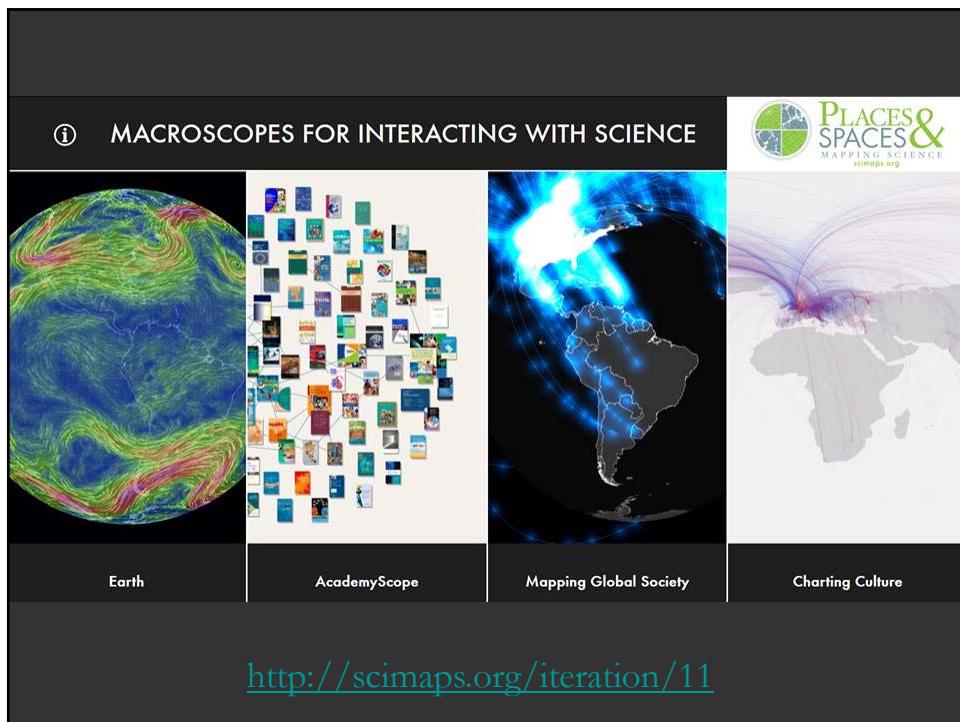
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**Seeing for
Action - Using
Maps and
Graphs
to Protect the
Public's Health.**

A photograph showing the interior of the CDC museum. On the left, two women are standing in front of a display board for the "Places & Spaces" exhibit, which features a map of the United States. Above them, a large wall is covered in multiple screens displaying various images related to public health. In the background, there are more exhibits and a glass-enclosed area.

**CDC Opening Event: Maps of Health
Tutorial and Symposium**
February 4-5, 2016

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PLACES & SPACES MAPPING SCIENCE

Curated by the Cyberinfrastructure for Network Science Center

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Hidalgo, César A., Bailey Klinger, Albert-László Barabási, and Ricardo Hausmann. 2007. See also [The Product: Space map from Phase I of Places & Spaces](#).

Call for Macroscope Tools for the Places & Spaces: Mapping Science Exhibit (2016) <http://scimaps.org/call>

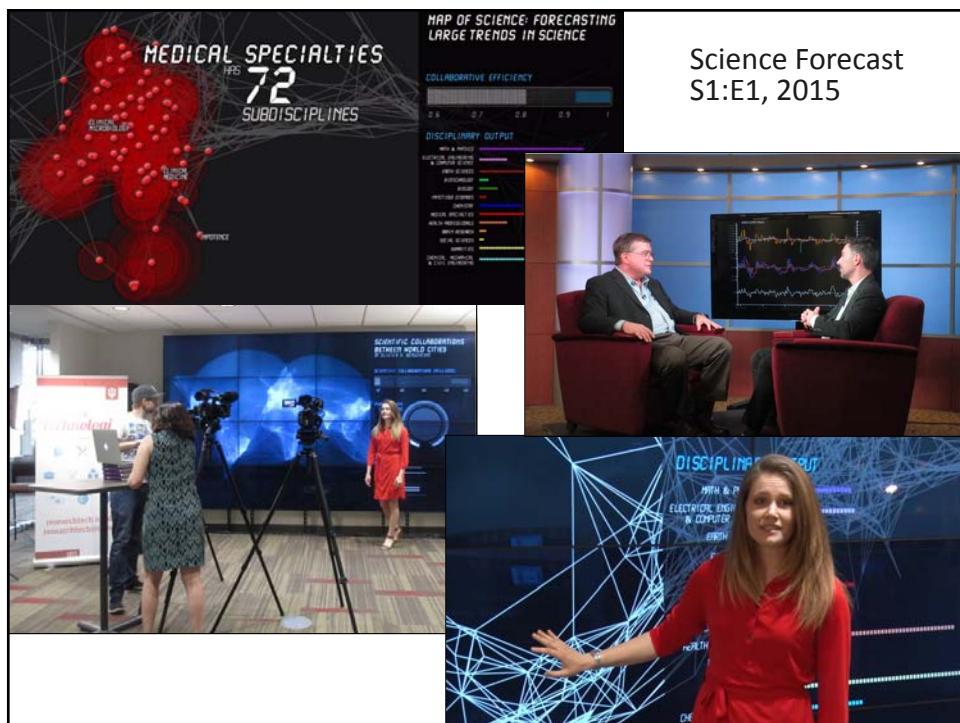
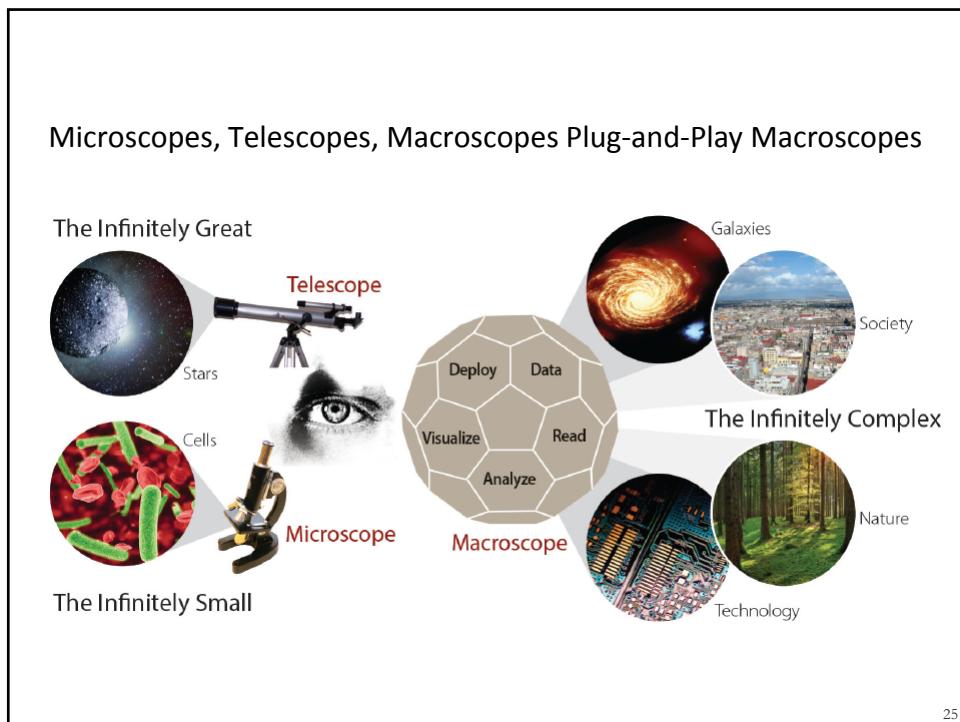
Background and Goals

The *Places & Spaces: Mapping Science* exhibit was created to in communicate human activity and scientific progress on a global scale that enable the close inspection of large-scale maps in public conferences; (2) novel, interactive macroscope tools that let

Themes for the upcoming iterations/years are:

- 11th Iteration (2015): Macroscopes for Interacting With Science
- 12th Iteration (2016): Macroscopes for Making Sense of Science
- 13th Iteration (2017): Macroscopes for Forecasting Science
- 14th Iteration (2018): Macroscopes for Economic Decision Makers
- 15th Iteration (2019): Macroscopes for Science Policy Makers

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Information Visualization Framework & IVMOOC

Tasks

TYPES

Statistical Analysis
page 44



WHEN:
Temporal Analysis
page 48



WHERE:
Geospatial Analysis
page 52



WHAT:
Topical Analysis
page 56



WITH WHOM:
Network Analysis
page 60



Atlas of Knowledge
Aesthetic Geo Map
by Rizzo

LEVELS

MICRO: Individual Level
about 1–1,000 records
page 6



MESO: Local Level
about 1,001–100,000 records
page 8



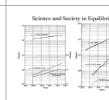
MACRO: Global Level
more than 100,000 records
page 10



Knowledge Cartography
page 135



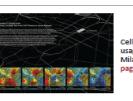
Productivity
of Russian life sciences
research teams
page 105



Science and Society in Equilibrium
Number of scientists
versus population
and R&D efforts
page 103



Increased travel and
communication speeds
page 13



Cell phone users in
Milan, Italy
page 109



Victorian poetry in
Europe
page 137



Ecological footprint of
countries
page 99



Evolving
patent
filings of Apple
Computer,
and Jerome
Lemonson
page 99



Evolving journal
networks in
nanotechnology
page 139



Product space
showing
import patterns
of countries
page 93

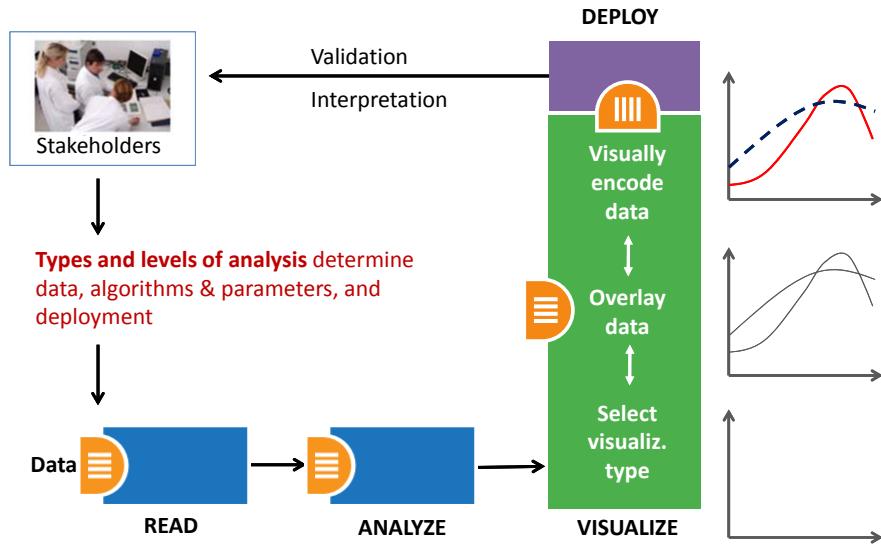


World-wide
scholarly
collaboration
networks
page 137

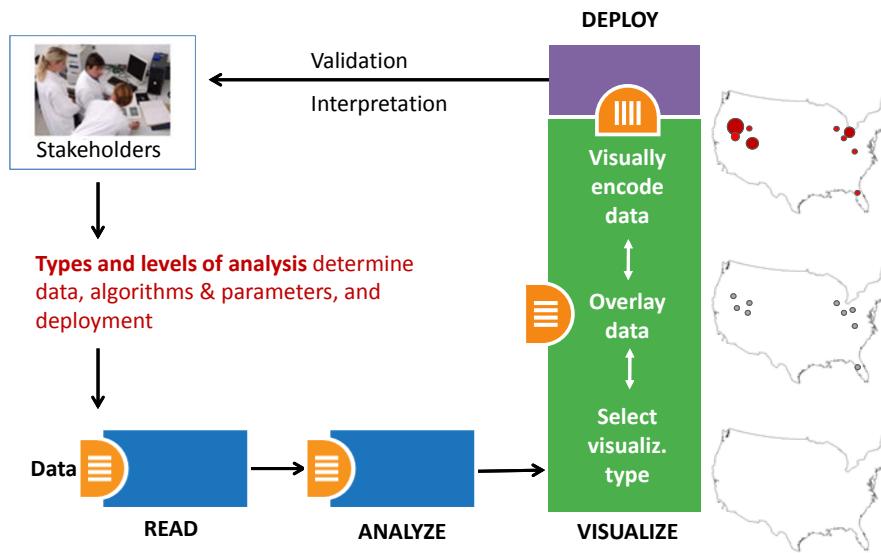
See page 5

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Needs-Driven Workflow Design

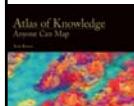


Needs-Driven Workflow Design



Visualization Framework

Insight Need Types page 26	Data Scale Types page 28	Visualization Types page 30	Graphic Symbol Types page 32	Graphic Variable Types page 34	Interaction Types page 26
<ul style="list-style-type: none"> categorize/cluster order/rank/sort distributions (also outliers, gaps) comparisons trends (process and time) geospatial compositions (also of text) correlations/relationships 	<ul style="list-style-type: none"> nominal ordinal interval ratio 	<ul style="list-style-type: none"> table chart graph map network layout 	<ul style="list-style-type: none"> geometric symbols point line area surface volume linguistic symbols text numerals punctuation marks pictorial symbols images icons statistical glyphs 	<ul style="list-style-type: none"> spatial position retinal form color optics motion 	<ul style="list-style-type: none"> overview zoom search and locate filter details-on-demand history extract link and brush projection distortion



See page 24

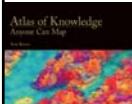
Visualization Framework

Basic Task Types								
Bertin, 1967	Wehrend & Lewis, 1996	Few, 2004	Yau, 2011	Rendgen & Wiedemann, 2012	Frankel, 2012	Tool: Many Eyes	Tool: Chart Chooser	Börner, 2014
selection	categorize			category				categorize/cluster
order	rank	ranking				table		order/rank/sort
	distribution	distribution				distribution		distributions (also outliers, gaps)
	compare	nominal comparison & deviation	differences	compare and contrast	compare data values	comparison		comparisons
		time series	patterns over time	time	process and time	track rises and falls over time	trend	trends (process and time)
		geospatial	spatial relations	location		generate maps		geospatial
quantity	part-to-whole		proportions	form and structure	see parts of whole, analyze text	composition		compositions (also of text)
association	correlate	correlation	relationships	hierarchy	relations between data points	relationship		correlations/relationships

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Visualization Framework

Insight Need Types page 26	Data Scale Types page 28	Visualization Types page 30	Graphic Symbol Types page 32	Graphic Variable Types page 34	Interaction Types page 26
<ul style="list-style-type: none">• categorize/cluster• order/rank/sort• distributions (also outliers, gaps)• comparisons• trends (process and time)• geospatial• compositions (also of text)• correlations/relationships	<ul style="list-style-type: none">• nominal• ordinal• interval• ratio	<ul style="list-style-type: none">• table• chart• graph• map• network layout	<ul style="list-style-type: none">• geometric symbolspointlineareasurfacevolume• linguistic symbolstextnumeralspunctuation marks• pictorial symbolsimagesiconsstatistical glyphs	<ul style="list-style-type: none">• spatialposition• retinalformcoloropticsmotion	<ul style="list-style-type: none">• overview• zoom• search and locate• filter• details-on-demand• history• extract• link and brush• projection• distortion



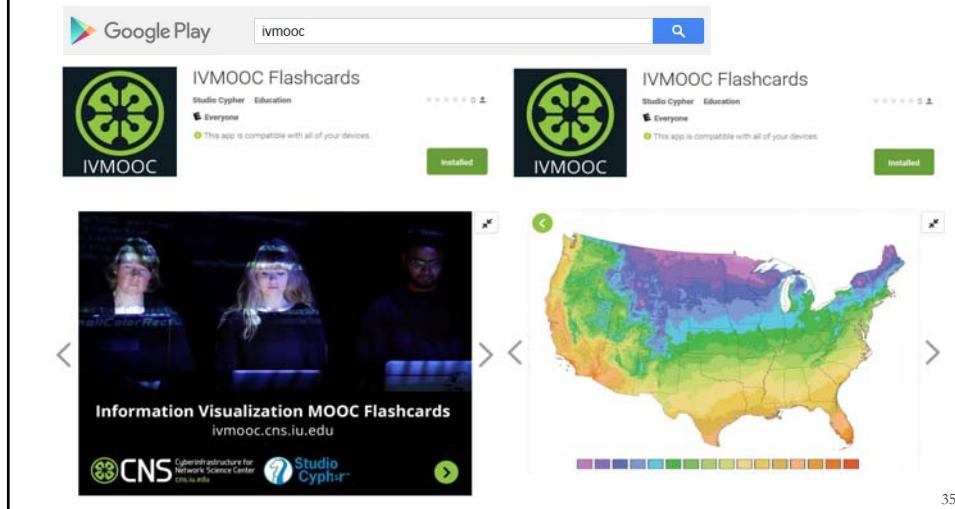
See page 24

Visualization Types (Reference Systems)

1. **Charts:** No reference system—e.g., Wordle.com, pie charts
2. **Tables:** Categorical axes that can be selected, reordered; cells can be color coded and might contain proportional symbols. Special kind of graph.
3. **Graphs:** Quantitative or qualitative (categorical) axes. Timelines, bar graphs, scatter plots.
4. **Geospatial maps:** Use latitude and longitude reference system. World or city maps.
5. **Network graphs:** Node position might depends on node attributes or node similarity. **Tree graphs:** hierarchies, taxonomies, genealogies. **Networks:** social networks, migration flows.

IVMOOC App – More than 60 visualizations

The “IVMOOC Flashcards” app can be downloaded from Google Play and Apple iOS stores.



Visualization Framework

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See page 24

Graphic Variable Types Versus Graphic Symbol Types

		Geometric Symbols		
		Point	Line	Area
Spatial	x	quantitative		
	y	quantitative		
	z	quantitative		
Retinal	Size	quantitative	NA (Not Applicable)	
	Shape	qualitative	NA	
	Rotation	quantitative	NA	
	Curvature	quantitative	NA	
	Angle	quantitative	NA	
	Closure	quantitative	NA	
	Value	quantitative		
	Hue	qualitative		
Color	Saturation	quantitative		

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Graphic Variable Types Versus Graphic Symbol Types

		Geometric Symbols			Unlabelled Symbols		Potential Symbols	
		Point	Line	Area	surface	volume	Text	Image, Icons, Statistical Objects
Spatial	x	quantitative						
	y	quantitative						
	z	quantitative						
Retinal	size	quantitative	NA (Not Applicable)					
	shape	qualitative	NA					
	rotation	quantitative	NA					
	curvature	quantitative	NA					
	angle	quantitative	NA					
	closure	quantitative	NA					
	value	quantitative						
	hue	qualitative						
Color	saturation	quantitative						

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The image shows the homepage of the IVMOOC 2016 website. At the top left is the CNS logo, followed by "IVMOOC 2016". On the right is a "MENU" button. The main content area features a video player showing three individuals (two women and one man) sitting at laptops in a dark room. A large red play button is overlaid on the video frame. Below the video, the text "Information Visualization MOOC" is on the left and "ivmooc.cns.iu.edu" is on the right, accompanied by YouTube and other social media icons.

Register for free: <http://ivmooc.cns.iu.edu>. Class restarts Jan 12, 2016.

Course Schedule

Part 1: Theory and Hands-On

- **Session 1** – Workflow Design and Visualization Framework
- **Session 2** – “When:” Temporal Data
- **Session 3** – “Where:” Geospatial Data
- **Session 4** – “What:” Topical Data

Mid-Term

- **Session 5** – “With Whom:” Trees
- **Session 6** – “With Whom:” Networks
- **Session 7** – Dynamic Visualizations and Deployment

Final Exam

Part 2: Students work in teams on client projects.

Final grade is based on Class Participation (10%), Midterm (30%), Final Exam (30%), and Client Project(30%).

A framed "LETTER OF ACCOMPLISHMENT" certificate from CNS is shown next to a green "IVMOOC Top Student 2015" badge.

Load One File and Run **Many** Analyses and Visualizations

Times Cited	Publication Year	City of Publisher	Country	Journal Title (Full)	Title	Subject Category	Authors
12	2011	NEW YORK	USA	COMMUNICATI ONS OF THE ACM	Plug-and-Play Macroscopes	Computer Science	Borner, K
18	2010	MALDEN	USA	CTS-CLINICAL AND TRANSLATIONA L SCIENCE	Advancing the Science of Team Science	Research & Experimental Medicine	Falk-Krzesinski, HJ Borner, K Contractor, N Fiore, SM Hall, KL Keaton, J Spring, B Stokols, D Trochim, W Uzzi, B
13	2010	WASHINGTON	USA	SCIENCE TRANSLATIONA L MEDICINE	A Multi-Level Systems Perspective for the Science of Team Science	Cell Biology Research & Experimental Medicine	Borner, K Contractor, N Falk-Krzesinski, HJ Fiore, SM Hall, KL Keaton, J Spring, B Stokols, D Trochim, W Uzzi, B

Statistical Analysis–p. 44

Temporal Burst Analysis–p. 48

Geospatial Analysis–p. 52

Geospatial Analysis–p. 52

<i>Location</i>	<i>Count</i>	<i># Citations</i>
Netherlands	13	292
United States	9	318
Germany	11	36
United Kingdom	1	2



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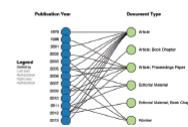
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Topical Analysis—p. 56

Paper Citation Network—p. 60

Bi-Modal Network–p. 60



Co-author and
many other
bi-modal networks.

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The screenshot shows the homepage of the conference website. At the top, there is a navigation bar with links to Home, Agenda, Confirmed Speakers, Organizers & Advisors, Venue, Register, and Contact. To the left of the navigation is a green circular logo with a stylized four-petaled flower or leaf design. The main title "Modeling Science, Technology & Innovation Conference" is prominently displayed in large white font over a background image of a classical building at night. Below the title, the text "WASHINGTON D.C. | MAY 17-18, 2016" is visible. A green button labeled "View Agenda" is centered below the date. In the bottom right corner of the main content area, there is a small text "43".

This conference is co-funded by the NSF Science of Science and Innovation Policy (SciSIP) program. It brings together international experts and practitioners that develop and apply mathematical, statistical, and computational models to increase our understanding of the structure and dynamics of science, technology and innovation, see details at <http://modsti.cns.iu.edu>.

References

Börner, Katy, Chen, Chaomei, and Boyack, Kevin. (2003). **Visualizing Knowledge Domains**. In Blaise Cronin (Ed.), ARIST, Medford, NJ: Information Today, Volume 37, Chapter 5, pp. 179-255. <http://ivl.slis.indiana.edu/km/pub/2003-borner-arist.pdf>

Shiffrin, Richard M. and Börner, Katy (Eds.) (2004). **Mapping Knowledge Domains**. Proceedings of the National Academy of Sciences of the United States of America, 101(Suppl_1). http://www.pnas.org/content/vol101/suppl_1/

Börner, Katy (2010) **Atlas of Science: Visualizing What We Know**. The MIT Press. <http://scimaps.org/atlas>

Scharnhorst, Andrea, Börner, Katy, van den Besselaar, Peter (2012) **Models of Science Dynamics**. Springer Verlag.

Katy Börner, Michael Conlon, Jon Corson-Rikert, Cornell, Ying Ding (2012) **VIVO: A Semantic Approach to Scholarly Networking and Discovery**. Morgan & Claypool.

Katy Börner and David E Polley (2014) **Visual Insights: A Practical Guide to Making Sense of Data**. The MIT Press.

Börner, Katy (2015) **Atlas of Knowledge: Anyone Can Map**. The MIT Press. <http://scimaps.org/atlas2>

The screenshot shows the CNS website homepage. At the top, there's a navigation bar with links for About Us, Research, Development, Teaching, Outreach, Videos, News & Events, and Connect With Us. A search bar and social media icons (Facebook, Twitter, LinkedIn) are also present. The main content area features a large image of five people in a meeting. To the right of the image is a green sidebar with the text: "We work closely with clients to provide custom-made data, visualization, and software solutions". Below the image, there are several sections: "Research" (Open Data and Open Code for Big Science Studies), "Development" (Behind the scenes of the design and development of AcademyScope), "Videos" (Watch Katy Börner's full presentation from TEDxBloomington), "Latest News" (Put your money where your options are - proposal for a new funding system (website accessed 9/05/13)), "Outreach" (See some of the most fascinating data visualizations in the world.), "Teaching" (Successful iNMOOC will be offered again in January of 2014), and "Upcoming Events" (List of events for October 1, 13, 15, and 22). A "Our Products" section at the bottom right contains a green icon and the same descriptive text as the sidebar.

All papers, maps, tools, talks, press are linked from <http://cns.iu.edu>
These slides will soon be at <http://cns.iu.edu/docs/presentations>

CNS Facebook: <http://www.facebook.com/cnscenter>
Mapping Science Exhibit Facebook: <http://www.facebook.com/mappingscience>

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