Atlas of Science

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All School Day University of North Texas, Denton ,TX October 1, 2011

Foreword

The explorers whose work is represented in the pages of this rich and fascinating volume face challenges far more daunting. First, the world they strive to represent is an abstract and intellectual one, not a physical reality that can be imaged from space, surveyed on the ground, and depicted in miniature on a map. The interrelationships among the landmarks of this <u>abstract world</u> are real, but they are not easily represented in the simple, straightforward ways that one can convey the distances between, say, three cities.

Second, there is no equivalent in the cartography of science to the <u>standards and conventions</u> upon which we mappers of the physical world comfortably depend. There's no agreed-upon notion of north-asup, of systems of latitude and longitude, of symbols, scale, and projection. Mapping the world of science requires the invention of a brand-new geography. Not only that, but the new geography then needs to be represented visually using colors, lines, and symbols for which no conventions exist. Third, the world that is being mapped in this book is changing at a dizzying rate. It's a fact of twenty-first-century science that whole realms of inquiry bloom into existence almost overnight, creating new places and spaces in ways that are alien to "normal" cartography. It is as if entire continents and archipelagoes were to constantly erupt on the roiling surface of a map even as that map was being drawn for the first time.

•••

Allen Caroll Chief Cartographer National Geographic Society Early Maps of the World

Early Maps of Science

VERSUS



3D Physically-based Accuracy is measurable Trade-offs have more to do with granularity 2-D projections are very accurate at local levels Centuries of experience **Geo-maps can be a template for other data**

Kevin W. Boyack, UCGIS Summer Meeting, June, 2009



n-D Abstract space Accuracy is difficult Trade-offs indirectly affect accuracy 2-D projections neglect a great deal of data Decades of experience Science maps can be a template for other data



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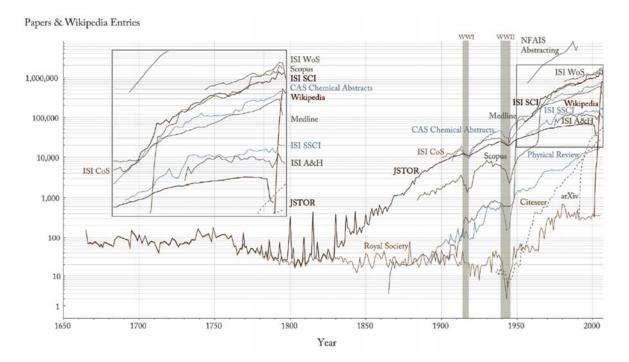
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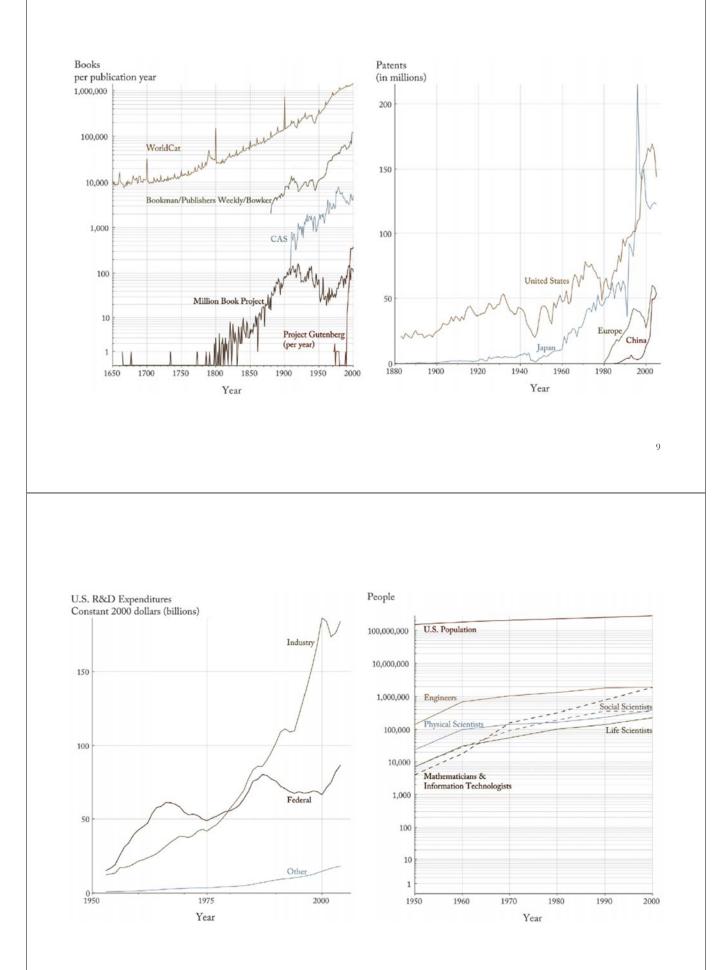
Part 1: Introduction

Because of the explosive power of exponential growth, the 21st century will be equivalent to 20,000 years of progress at today's rate of progress. The whole 20th century is equivalent to 20 years of progress at today's rate of progress. Organizations have to be able to redefine themselves at a faster and faster pace.

Ray Kurzweil

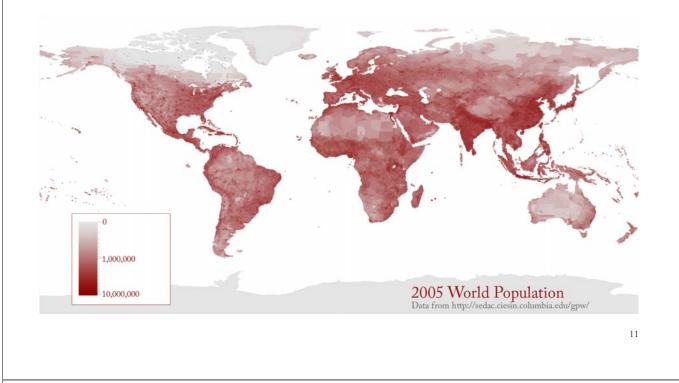
The Rise of Science and Technology





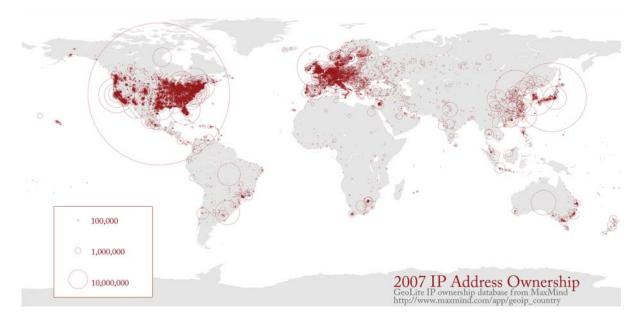
2005 World Population

The population map uses a quarter degree box resolution. Boxes with zero people are given in white. Darker shades of red indicate higher population counts per box using a logarithmic interpolation. The highest density boxes appear in Mumbai, with 11,687,850 people in the quarter degree block, Calcutta (10,816,010), and Shanghai (8,628,088).



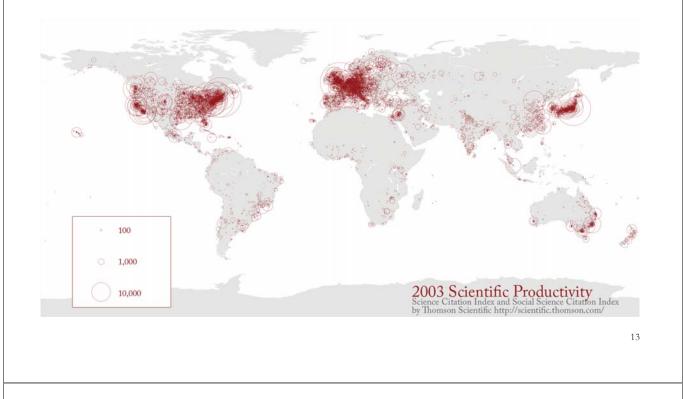
2007 IP Address Ownership

This map shows IP address ownership by location. Each owner is represented by a circle and the area size of the circle corresponds to the number of IP addresses owned. The larges circle denotes MIT's holdings of an entire class A subnet, which equates to 16,581,375 IP addresses. The countries that own the most IP addresses are US (560 million), Japan (130 million), Great Britain (47 million).



2003 Scientific Productivity

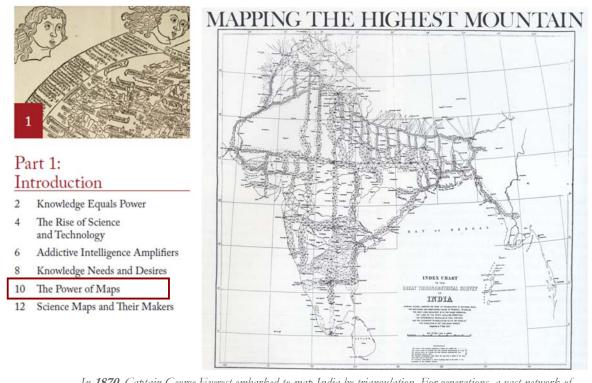
Shown is where science is performed today. Each circle indicates a geographic location at which scholarly papers are published. The larger the circle the more papers are produced. Boston, MA, London, England, and New York, NY are the top three paper production areas. Note the strong resemblance with the Night on Earth and the IP Ownership maps and the striking differences to the world population map.



2000 Night on Earth

This image shows city lights at night. It was composed from hundreds of pictures made by orbiting satellites. The seaboards of Europe, the eastern United States, and Japan are particularly well lit. Many cities exist near rivers or oceans so that goods can be exchanged cheaply by boat. The central parts of South America, Africa, Asia, and Australia are rather dark despite their high population density, see map to the left.





In 1870, Captain George Everest embarked to map India by triangulation. For generations, a vast network of repeating sightline triangles was meticulously measured and recorded (see map below). What resembles a pattern of eyelashes on the northern border represents the sightlines to stations built above treetops. While analyzing the triangles in the calculating offices of Calcutta, the mapmakers discovered the highest peak in the world: Mount Everest

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Part 2: The History of Science Maps

Noise becomes data when it has a cognitive pattern. Data becomes information when assembled into a coherent whole, which can be related to other information. Information becomes knowledge when integrated with other information in a form useful for making decisions and determining actions. Knowledge becomes understanding when related to other knowledge in a manner useful in anticipating, judging and acting. Understanding becomes wisdom when informed by purpose, ethics, principles, memory and projection.

George Santayana



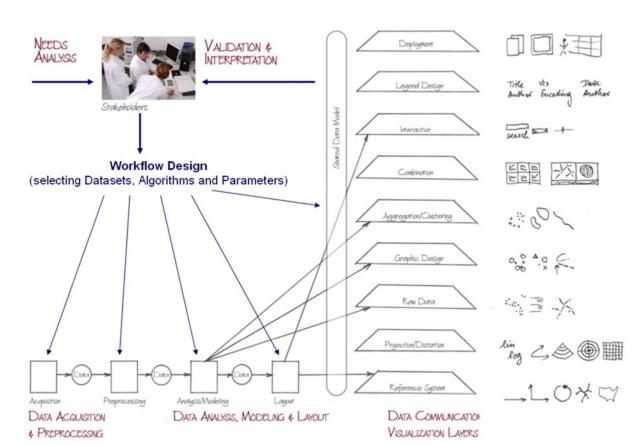
Part 3: Toward a Science of Science

Those who cannot remember the past are condemned to repeat it. George Santayana



Part 3: Toward a Science of Science

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Temporal Analysis

A comportal Aratalysis Science overway over time. Autibate values of schol-arly entities and their diverse aggregations increase and decrease at different nates years of request with dif-ferent latesty-rates to internal and external events. Temporal analysis sime to identify the mature of mora represented by a sequence of observa-such as patterns, trends, seasonality, outliers, phon tions such as patterns, tre and bursts of activity.

Data

A time series is a sequence of events or observations that are ordered in time. Time-series data can be continuous (there is an observation at every instan of time; see figure to the right) or discrete (obser-vations exist for regularly or irregularly spaced intervale). Temporal aggregations—over journal volumes, years, or decades—are common.

Algorithms

Frequently, some form of filtering is apprediate noise and make patterns more se ns of filturing is applied to Smoothing (sversging using a smoothing window of a certain width) and curve approximation might be applied. The number of scholarly records is often

Topical Analysis

The topic coverage and topical similarity of basic and aggregate units of science (authors or institu-tions) can be derived from the units associated with them (papers, patents, or grants).

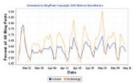
Data

erage of a unit of sci The topic or a can be derived from the text associated with it. Topical aggregations (for example, over journal volumes, scientific disciplines, or institutions)

Algorithms

Topic analysis extracts the set of unique words Topic studyes extracts on ne on unique even or word profiles and their frequency from a text entrues. Stop words, such as "the" and "of," are removed. Summing can be applied. Coword analysis identifies the number of times two words are and in the title, keyword set, abstract, or full text of a paper. The space of en-occurring words can be mapped, providing a unique view of the topic rage of a data set (see page 66, Exemplification) Similarly, units of science can be grouped according to the number of words they have in common. Salum's term frequency inverse document

plotted to get a first idea of the temporal distribuparties argue a new same at the temporal substru-tion of a data and it. It might he shows in total values or as a percentage of those. One may find out how long a scholarly entity was active; how old it was at a cortain point, what growth, hencey to peak, or decay rate it has, what correlations with other time series exist; or what trends are observable. Data models such as the least squares reeded (available in most statistical software packages) are applied to best fit a selected function to a data set and to determine if the trend is significant. Kleinburg's burst detaction algorithm is commonly applied to identify words that have experienced a sudden change in fromency of occurrence. ncy of ocu



sense (TFIDF) is a statistical measure used to evaluate the importance of a word in a corpus. The importance increases proportionally to the number

of times a word appears in the paper bat is offinit by the frequency of the word in the corpus. Dimensionality reduction techniques (see table on opposite page) are commonly used to project high-dimens nal information spaces (for example

the matrix of all unique papers multiplied by their unique terms) into a low, typically two-dimenthe matrix of all unique papers matrixite by their unique terms) into a low, typically two-dimen-sional space. The SOM map below shows the topic landscape

of geography shoractic see page 102. In Terms of Geography. -



Geographic Analysis

Geographic analysis aims to answer the question o where something happens and what impact it has on neighboring areas

Data

Geographic analysis requires spatial attribute val uss or geolocations for authors and their papers, extracted from affiliation data or spatial positions of nodes, generated from layout algorithms Geographic data can be continuous (each record has a specific position) or discrete (a position or area axists for sets of records, like the number of papers per country). Spatial aggregations (for example, merging data via postal codes, countries, states, countries, and continue 66, Exemplification). tinents) are common (see page

Algorithms

Cartographic generalization refers to the process of abstraction. This includes (1) graphic generaliza-tion: the emplification, enlargenere, displacement merging, or selection of entities without enhanceat or effort to their symbology and (2) concept symbolization: the merging, selection, and aal symboli

Network Analysis

The study of networks aims to increase our und tanding of natural and manmade networks. It statung or natura and manufait network, it builds on social network analysis, physics, infor-matrics, webomstrics, scientumetrics, infor-matrics, webomstrics, communication theory, soci-ology of science, and several other disciplines.

Data Authors, institutions, and countries, as well as words, papers, journals, patents, and funding, are represented as nodes and their complex interre-

ations as edges (see Part 3: Toward a Science of Science/Conceptualizing Science: Basic Anatom of Science). Nodes and telges can have timetamped attributes.

Algorithms

Diverse algorithms exist to calculate specific node, udge, and network properties (see "Network Science" review). Node properties include degree canitality, betweenness canitality, or hab and authority stores. Edge properties include darabil-ity, reciprocity, intensity (weak or strong), density (how many potential edges in a network actually exist), reachability (how many steps it takes to go

nbolization of entities, including enh (such as representing high-density areas with a city symbol).

Geometric generalization aims to solve the conflict between the number of viscalized feat the size of symbols, and the size of the display surface. Cartographers dealt with this conflict intuitively in part until researchers like Friedrich Töpfer attempted to solve them with quantifiable.

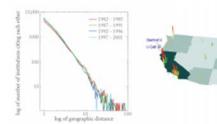
Flow maps use line thickness and direction to show the number of tangible or intangible entities that diffuse over a geographic location or ecimes space (see CAS coasthor network, below, and page 158, 113 Years of Physical Review).



en one "end" of a network to another), ity (whether a network has a "conter" point), qual-ity (reliability or certainty), and strength. Network properties refer to the number of nodes and edges, network density, average path length, clustering coefficient, and distributions from which general properties such as "small-world," "scale-free," or rarchical" can be derived. Identifying major "intractions" can be derived, teaching major communities via community detection algorithms and calculating the "backbone" of a network via pathfinder network scaling or maximum flow algorithms helps to communicate and make sense of large-scale networks. See the coauthor network of information visualization meanwhere holow.



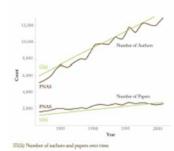
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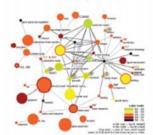
nt observing the variation of the number of institutions th 1 over geographic distance between them for each of the 1(h) Log-log plot she



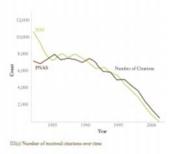
11(b) Fracht man-Rengold tarenat of word co-or



ographic locations of the top 500 institutions w wal citations indicated by height and color of b



11(c) Final layerst with star- and color-coding, labels, and legend



Interpretation

Study I: Mapping Knowledge Diffusion and the Importance of Space

This study airead to determine whether the Internet leads to more This study associate a distribution without the interface statistic more global citation patterns (that is, more citation links between papers pro-duced at geographically distant research institution). A novel approach to analyzing the dual role of institutions as information producers and conserver and to studying and visualizing the diffusion of informa-tion among them was developed. Surprisingly, the widespread adop-tion of the Internet does not seen to have affected the distance over which information diffuses as manifolded by cluster links. The citation Inkages between institutions fall off with the distance between them, and there is a strong linear relationship between the log of the cita-tion counts and the log of the distance that does not change over time. Reasons for local collaborations might include "winner takes all fand-ing elements the damards of complex, large-scale instrumentations and the sead to gain coperiness, train mean-there, and posser provides. The social component of citation seams to become more important as meanchers are flooded with information, and spatial proximity cases the overtion and continuation of close personal relationships. the creation and contin ation of close pe

Study II: Identifying Research Topics and Trends

Scientific research is highly atomics. New sease of existence are con-tinually evolving some may shift in importance, others merge or split. Because of the standy increase in the samther of scientific publications, it is challenging to keep stream of the streamer and dynamic devi-opment of ene's own field, he alone all acientific domains. However, oprovide a state of the state o tions. This study simed to increase understanding of the topic coverage and activity horsts of words in highly one IPNAS paper. Interesting, the barst of words at in highly one IPNAS paper. Interestingly, the barst of words some to precede their wide spread usage. "Protein" and "model" were assuming the highly "barsety" terms between 1998 and 2001, and they have become important reasons to topics since then.

Study III: Modeling the Coevolution of Author-Paper Networks

Models of acientific strue te and eacher n can help us up Models of accounting of actions: (see page 35, Conceptualizing Science: Science Dynamics). The TARL model (topics, aging, and recorder linking) describes the convolution of coauthor and paper-citation net works, Using an agent-based approach, TAR I. implementation to dea (authors or papers), their edges (andirected ensuther, directed consumed, and directed paper-citation), and their attributes (time and topics). Topics or papers), their e directed paper-ciclaster papers and authors topically. Aging is an antagenistic force to teres prefermina in trachment. Even highly connected nodes receive a decreas-ing number of links over times. Aging chatters papers and authors ten-penally. Recursive linking refers to the tendency of authors to cits paper informed in material they are currently reading, which provides a restruction in material toy are currency reasing, which provide a grounded mechanism for the "rich get riches" phenomenon as a cure gent property of the elementary activity of authors. According to this model, the number of topics is linearly related to the clustering coefficient of the simulated paper citation network.

Part 4: Science Maps in Action

If we ever get to the point of charting a whole city or a whole nation, we would have ... a picture of a vast solar system of intangible structures, powerfully influencing conduct, as gravitation does in space. Such an invisible structure underlies society and has its influence in determining the conduct of society as a whole.

Jacob L. Moreno

First Iteration of Exhibit (2005): The Power of Maps

Four Early Maps of Our World

Versus Six Early Maps of Science

The first exhibit iteration on *The Power of Maps* demonstrates how maps help

us to understand, navigate, and manage both physical places and abstract knowledge spaces.

Early maps of our planet were certainly neither complete nor perfect, yet they proved invaluable for explorers. As keys to navigation, exploration, and communication, maps helped explorers find promising new lands while avoiding sea monsters.

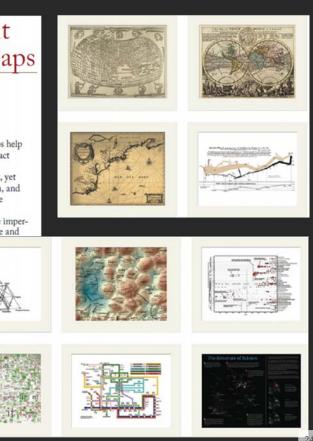
Maps of science today are based on limited knowledge and therefore imperfect. In order to generate comprehensive maps that are entirely accurate and reliable, we must first have proper coverage and inte

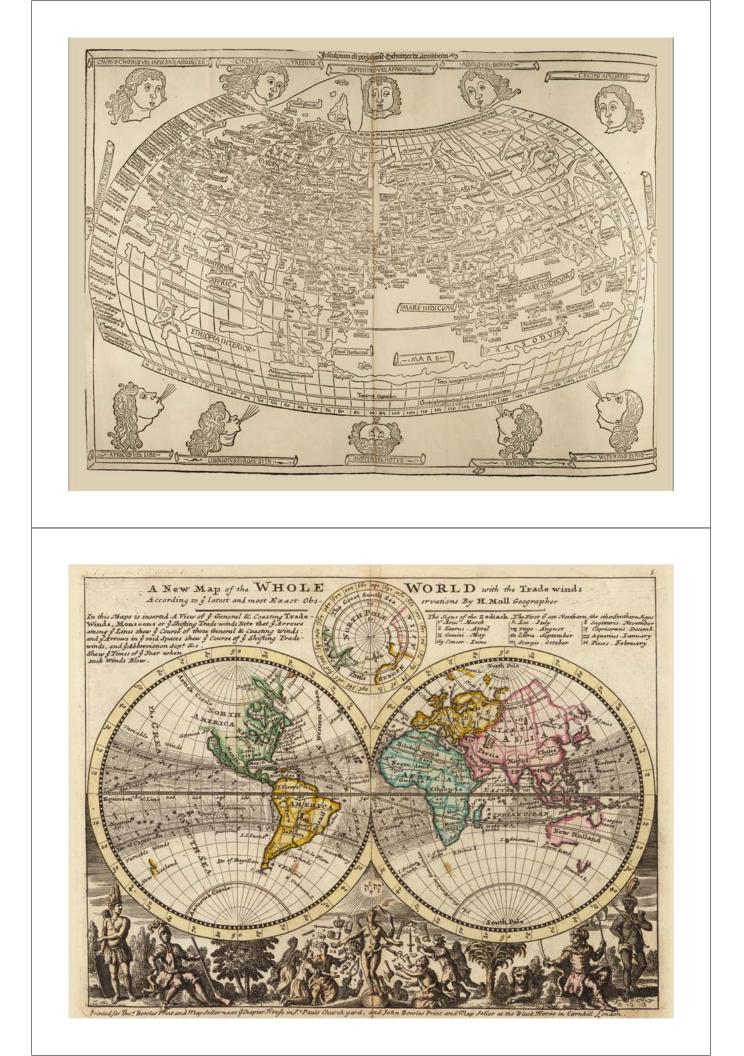
multidisciplinary, and multimedia scholarly knowled The first pictures of Earth from space were experi

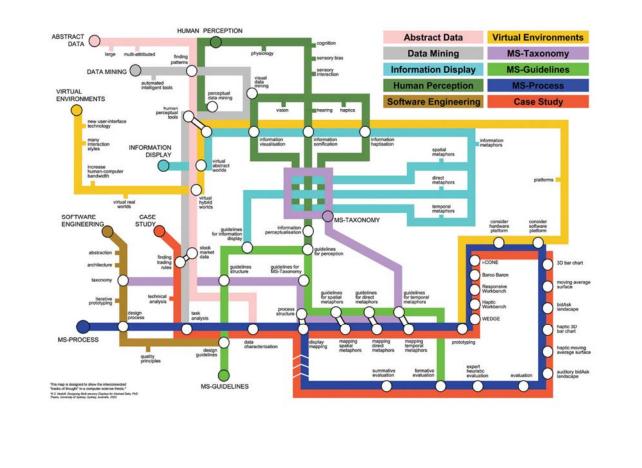
ne first pictures of Earth from space were expen mative of their perceptions of life and the cosmos. It science will increase our appreciation and applicatio serving as useful navigational tools.

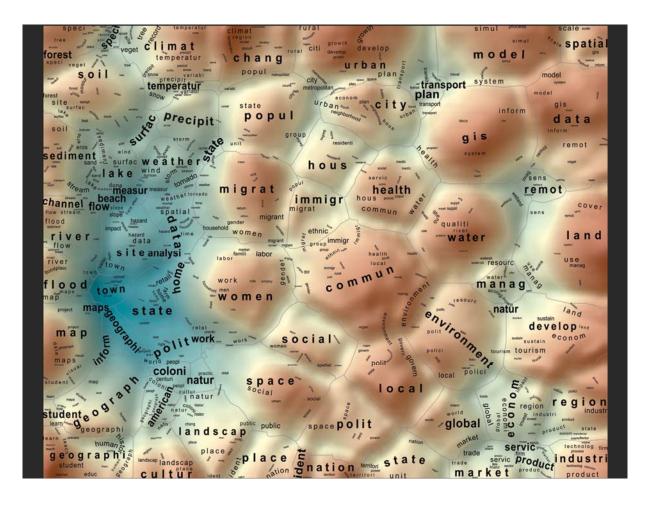
serving as useful navigational tools. The Power of Maps features four cartographic maps earliest global maps of our world by Ptolemy, an earl Johannes Janssonius, an early map of the whole worl early statistical graph by Charles Joseph Minard. Ea employs a different metaphor: a node-link diagram; ing map rendered using geographic information syst a crossmap; and a galaxy view. Which metaphor is r visual index of our collective science and technology

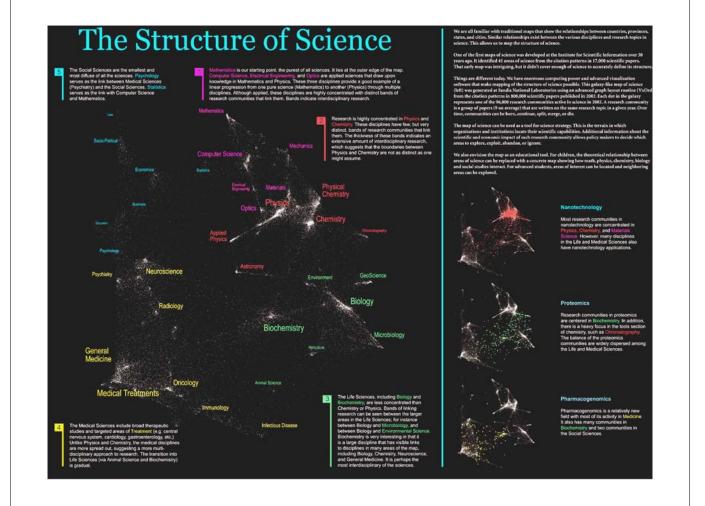
Note that the makers of the early cartographic ma ing presses, while the makers of the first maps of sci











Second Iteration of Exhibit (2006): The Power of Reference Systems

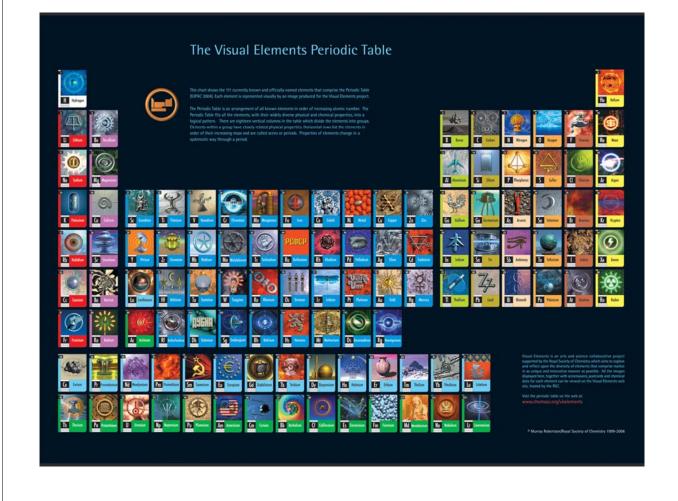
Four Existing Reference Systems Versus Six Potential Reference Systems

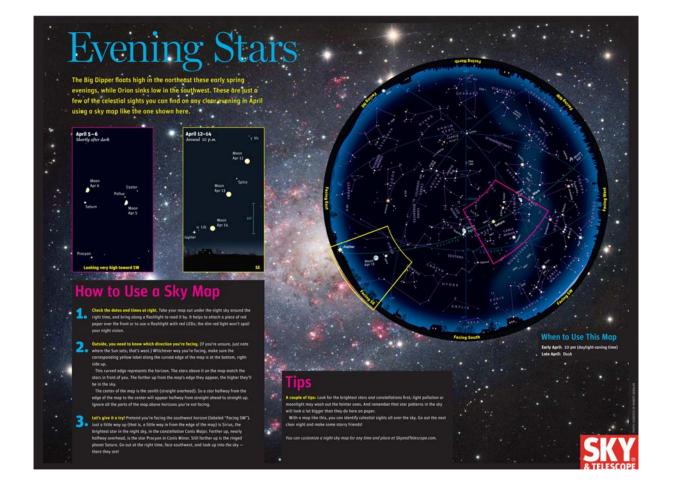
This iteration aims to inspire discussion about a common reference system for all existing scholarly knowledge. Throughout history, scientists have battled to agree on standardized reference systems for their respective fields of research. These standards are invaluable for indexing, storing, accessing, and managing scientific data efficiently.

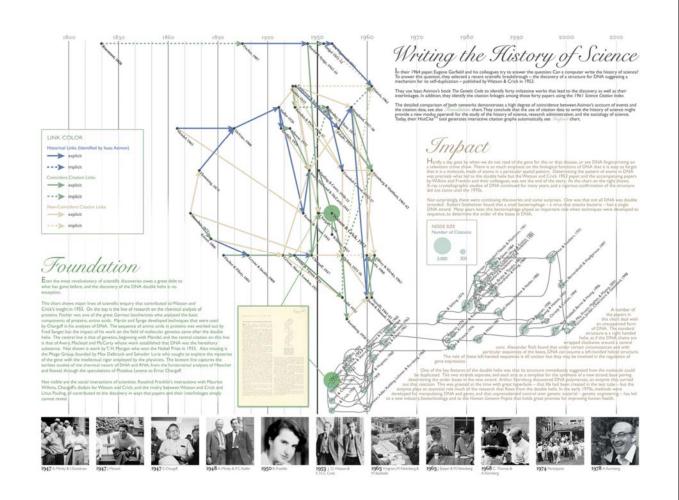
Results include the description of the electromag odic table of elements, geographic projections, and systems, shown here. Note that the geographic may from paper to geographic information systems (GIS for public use and consumption.

In comparison to these four existing systems are systems for scholarly knowledge. Each reference sy sional timeline and the geographic system to the se used to identify the location of an author, paper, pa tory or contribution.









L Science can be thought of as containing themes and paradigms. Themes are areas of current research, while paradigms comprise the dominant tool sets and existing knowledge that are used by today's researchers. This map shows 776 major paradigms in science along with the dominant relationships between henes paradigms. Paradigms are shown as circles; strong relationships between paradigms are indicated by the lines connecting the circles. The map was created by recursively clustering the 820,000 papers referenced most often in 2003. Clustering at each leved was done using Y&Ord, a force-directed graph layout routine. These papers formed 33,000 clusters, 6,100 bilgher level clusters, and finally the 776 paradigms. Although each paradigm contains, on average, 1,000 papers, some are larger and some are smaller, as shown by different sized circles on the map. The ring-like structure that is formed by scientific paradigms The ring-like structure that is formed by scientific paradigms is very robust. We find similar structures for different years, and for maps generated from scientific journals. "The Structure of Science", a galaxy map shown in the first iteration of Places is Spaces, is a map based on clustering of scientific journals, with superimposition of papers on the journal structure, whereas this map was gene-rated directly from highly-cited papers. "The Structure of Science" shows current science in a disciplinary context, while this map can show the breadth of disciplines that contribute to single paradigms. Matha Mechanics Because of the robust nature of the str Because of the robust nature of the structure of science and its paradigms, we have placed our 776 scientific paradigms within a reference sys-tem containing 12 radial slices and 6 rings. This liows the position of each paradigm to be codified and available for lookup; for instance *Fluid Mechanics* paradigms are in grid B3. sychiat Ecology We have also calculated and displayed the vitality of each paradigm. *Vitality* is a measure of the speed at which a group of researchers reaches consensus about major improvements. Paradigms are major. The white circles represent usually takes years to reach consensus about which improvements are major. The white circles represent communities where consensus is reached relatively slowly. This is a common phenomenon in the social sciences, ecological sciences, computer sciences, and mathematics disciplines. The red circles represent communities of researchers where common in physics, chemistry, biochemistry, and many medical disciplines. Very dark circles juch as those in Astrophysics, L5-6) resent communities where consensus is reached extremely quickly. We have also calculated and displayed the vi Circle size = Para Vitality Scale Average or li High Very high The map of scientific paradigms and its reference system can be H E used for multiple purposes. Countries, industries, companies, universities and individual researchers can all locate themselves within the map, eithe Disea and individual researchers can all **locate themserves wrunn the map**, encore as single points, or as a specific collection of paradigms. Various metrics, such a vitality, can be overlayed on this reference system to highlight specific impacts Science education and personal discovery can also be enhanced by linking stories an facts to the map that highlight scientific history, current advances and relationship between scientific paradigms G



Map of Scientific Paradigms

By Kevin W. Boyack and Richard Klavans ALBUQUERQUE, NEW MEXICO, AND BERWYN, PENNSYLVANIA, 2006 Courtery of Kevin W. Boyack and Richard Klavans, SciTech Strategies, Inc.

Aim Science can be thought of as containing themes and paradigms; themes are current areas of research, while paradigms comprise the dominant tool sets and existing knowledge that are used by current researchers. What would a paradigm map of science look like? How many paradigms are currently active? How large and how vital are they?

Interpretation

This map was generated by recursively clustering the 820,000 most important papers referenced in 2003 using the processing pipeline described on page 12, Toward a Reference System for Science. The result is a map of 776 paradigms, which are shown as circles on the map. Although each paradigm contains an average of 1,000 papers, they range in sizes, as shown by the variously sized circles on the map. The most dominant relationships between paradigms were also calculated and are shown as lines between paradigms. A reference system was added for means of navigation and communication.

Color-coding indicates the vitality of a research topic—the darker the red, the younger the average reference age and the more vital and faster moving the topic. The white circles represent paradigms where consensus is reached relatively slowly. This is a common phenomenon in the social sciences, coological sciences, computer sciences, and mathematics disciplines. The red circles represent communities of researchers where consensus is reached relatively rapidly. This is more common in physics, chemistry, biochemistry, and many medical disciplines. Very dark circles (such as those in quantum physics) represent communities where consensus is reached most quickly.

Countries, industries, companies, neptoence communications and individual researchers can all locate themselves within the map, either as single points or as a specific collection of paradigms. Science education and discovery can also be enhanced by linking to the map stories and facts that highlight content and relationships between scientific paradigms.



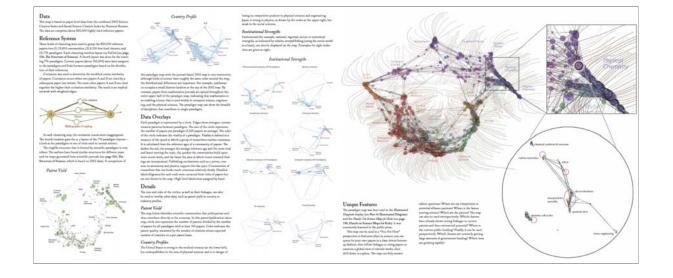
Kevin W. Boyack joined SciTich Strategie, Ike, in 2007 ofter welking at Sachia National Laboratories, where he spost several years in the Computation Computers, Information and Mathematics Contex, 16 holds a PhD in chemical engineering from Brigham Young University and work are mitiated to information

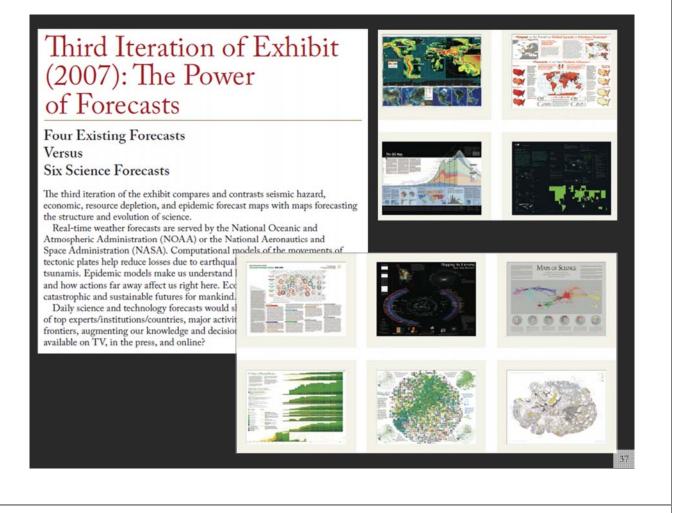
His current interests and work are related to information visualization, knowledge domains, wience mapping with associated metrics and indicators, network analysis, and the integration and analysis of multiple data types.

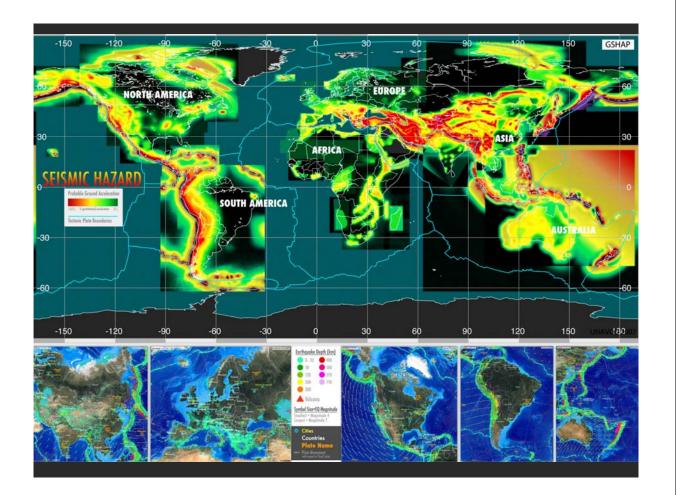


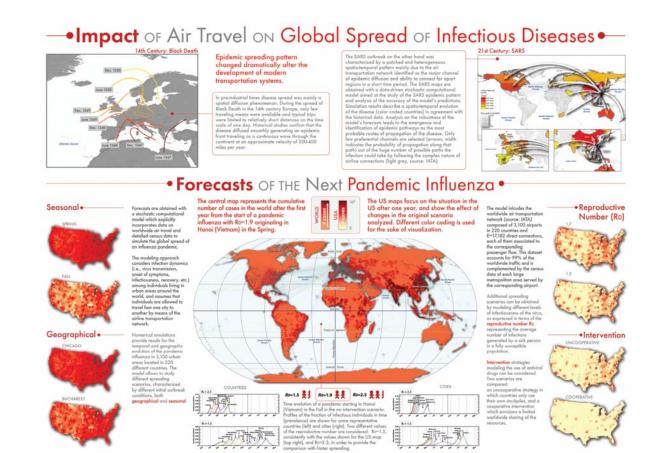
Richard Klavans is the proident of SoTieh Streingies, Inc. He holds a PHO in mangement from the Wharton School of the University of Phoneylowin His carrent work is related to the construction of the source of the maps of science using multiple techniques, and as Mildiagraphic techniques, and as Mildiagraphic

coupling, contation, and cowerd, as well as the associated metrics and indicators that allow government and industry asers to make more offscrive policy detrieons. He is interested in somantics, sugmented cognition, and the application of mathematical tools to information spaces.









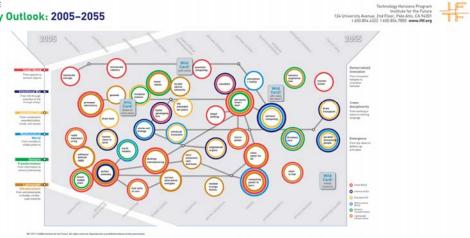
INSTITUTE FOR THE FUTURE Science & Technology Outlook: 2005-2055

HAP THEMES

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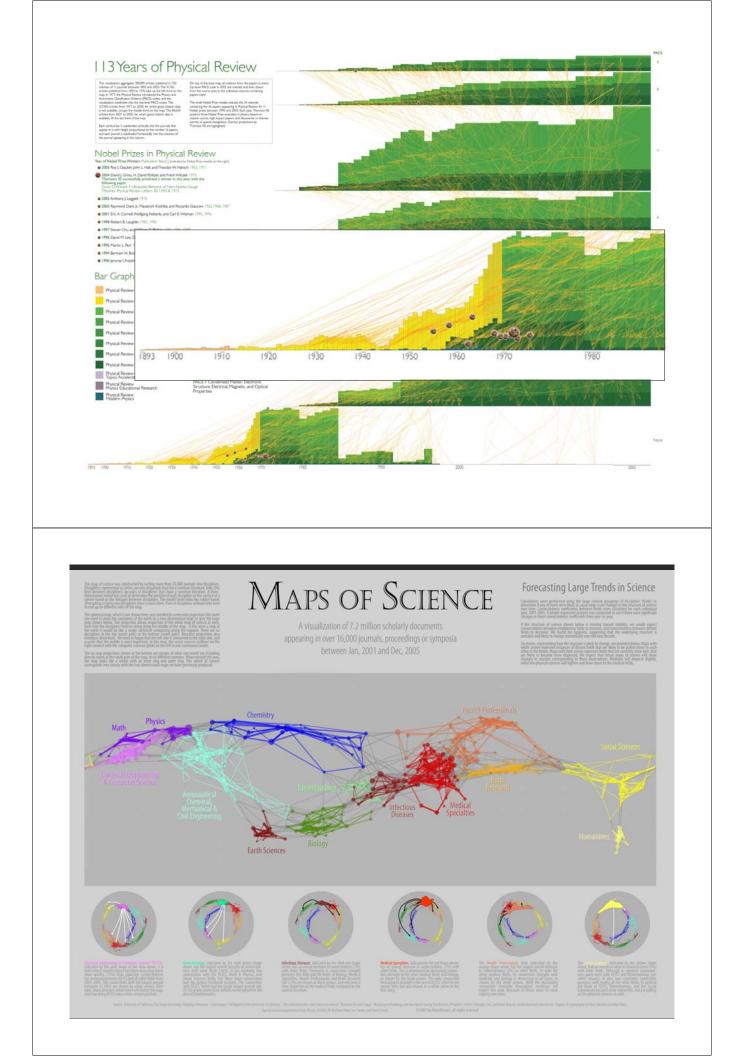


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Additional Elements of the Exhibit

Certainly science maps and data graphs work to engage viewers intellectually but can they also capture the imagination, as did the early maps of the world? Is it possible to involve viewers in a more dynamic way that heightens both their awareness and appreciation of data, information, and knowledge? What can be learned from theater, movies, and art exhibits—as well as science displays—to improve the ability of science maps to entertain while educating, to inspire while

being true to facts, and ers to engage in science

Additional exhibit e and interact with scient exceptional high data (and a map of today's sc drives a touch panel dis the touch panel display on any given topic are given geographic locat

The Hands-On Scient stand science from abc color drawings. Childi placing images of majo appropriate places on to of various countries fo patents. Shape of Sciet The Video of the Exhi Public Library (NYPI NYPL officials, who c



Illuminated Diagram Display

W. Bradford Paley, Kevin W. Boyack, Richard Kalvans, and Katy Börner (2007) Mapping, Illuminating, and Interacting with Science. SIGGRAPH 2007.

Questions:

- Who is doing research on what topic and where?
- What is the 'footprint' of interdisciplinary research fields?
- > What impact have scientists?

Contributions:

Interactive, high resolution interface to access and make sense of data about scholarly activity.

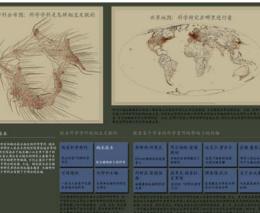


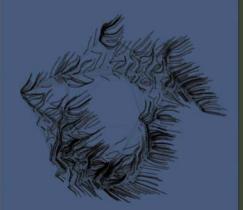




Large-scale, high resolution prints illuminated via projector or screen.

Interactive touch panel.







You may run your finger over each of these maps to control the lighting on the other: touching a place on the world map will light up topics studied in that place; touching a paradigm on the topic map will light up the places that study that topic.

Nanotechnology

This overlay shows the distribution of nanotechnology within the para-digms of science. The majority of current work in nanotechnology takes places in physics, chemistry, and materials science, at the upper right portion of the map. However, an increasing amount of nanotechnology is being applied in the bio-logical and medical sciences, at the lower right.

| p through all 776 | Science on the tiny | Co-discovered DNA's | Revitalized physics | the second se | |
|---------------------------------|--|---|--|---|--|
| tific paradigms | scale of molecules | double helix | with Relativity theories | Models critical phase transitions of matter | Connects perception and stereotypes |
| tainability | Biology & Chemistry | Joshua LEDERBERG | Derek J. de Solla PRICE | Richard N. ZARE | About this display |
| cience behind ong-term hopes | The interface between these two vital fields | Pioneer in bacterial genetic mechanisms | Known as the "Father of Scientometrics" | Uses laser chemistry in molecular dynamics | People & organizations that helped create it |
| c | ience behind ng-term hopes | Chemistry ience behind The interface between | ience behind ng-term hopes The interface between these two vital fields Planeer in bacterial genetic mechanisms | ience behind ng-term hopes The interface between these two vital fields ELEDERBERG PRICE Pioneer in bacterial genetic mechanisms of Scientometrics" | ience behind ng-term hopes Chemistry LEDERBERG PRICE ZARE Uses laser chemistry in genetic mechanisms Chemistry Dioneer in bacterial Dioneer in bacteri |





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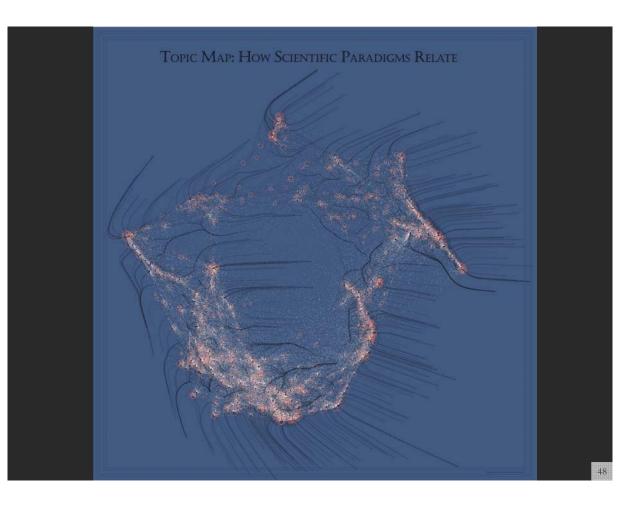
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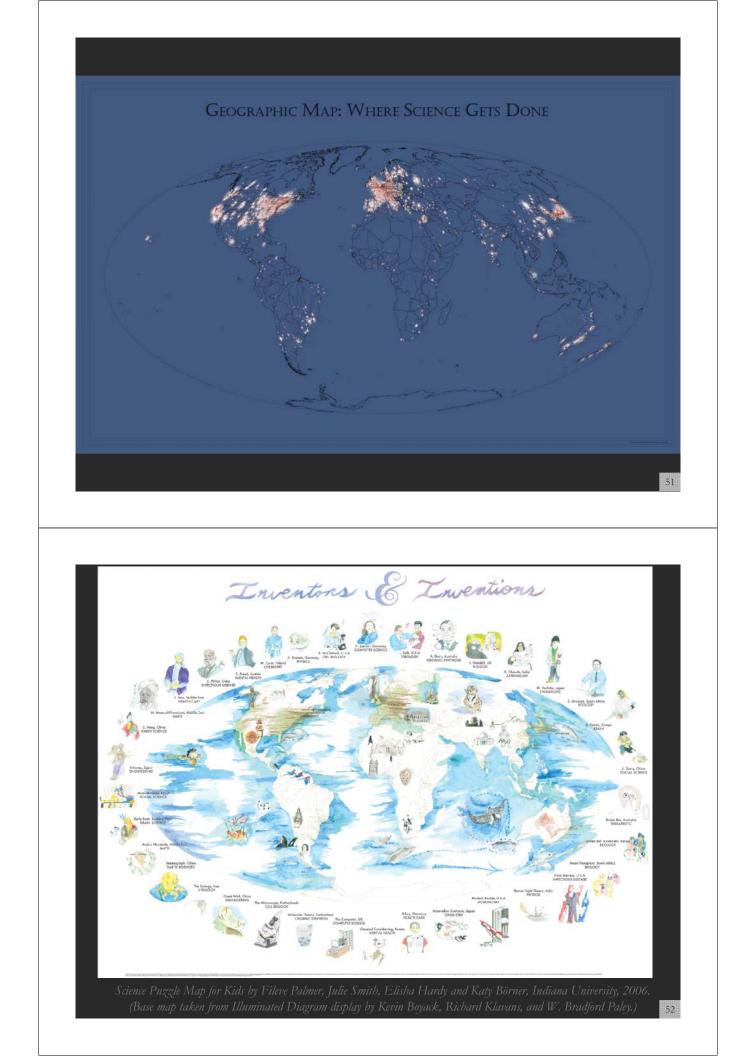
| All Topics Sweep through all 776 scientific paradigms | Nanotechnology Science on the tiny scale of molecules | Francis H. C. CRICK Co-discovered DNA's double helix | Albert EINSTEIN Revitalized physics with Relativity theories | Michael E. FISHER Models critical phase transitions of matter | Susan T. FISKE Connects perception and stereolypes |
|---|--|---|--|--|--|
| Sustainability The science behind our long-term hopes | Biology & Chemistry The interface between these two vital fields | Joshua LEDERBERG Pioneer in bacterial genetic mechanisms | Derek J. de Solla PRICE Known as the "Father of Scientometrics" | Richard N. ZARE Uses laser chemistry in molecular dynamics | About this display People & organizations that helped create it |
| ighting up the places in t opic. You may select a su | adjoining related topics, he world that study each bset of the topics that deal ng subjects by touching it. | places relating to that p thing that cites that orig | ng influence is shown as a s erson's papers — papers that inal work. Note that this firs ie third shapshot lights scier | are still highly cited today. t-generation impact exten | The second lights every- ds to far more topics than |

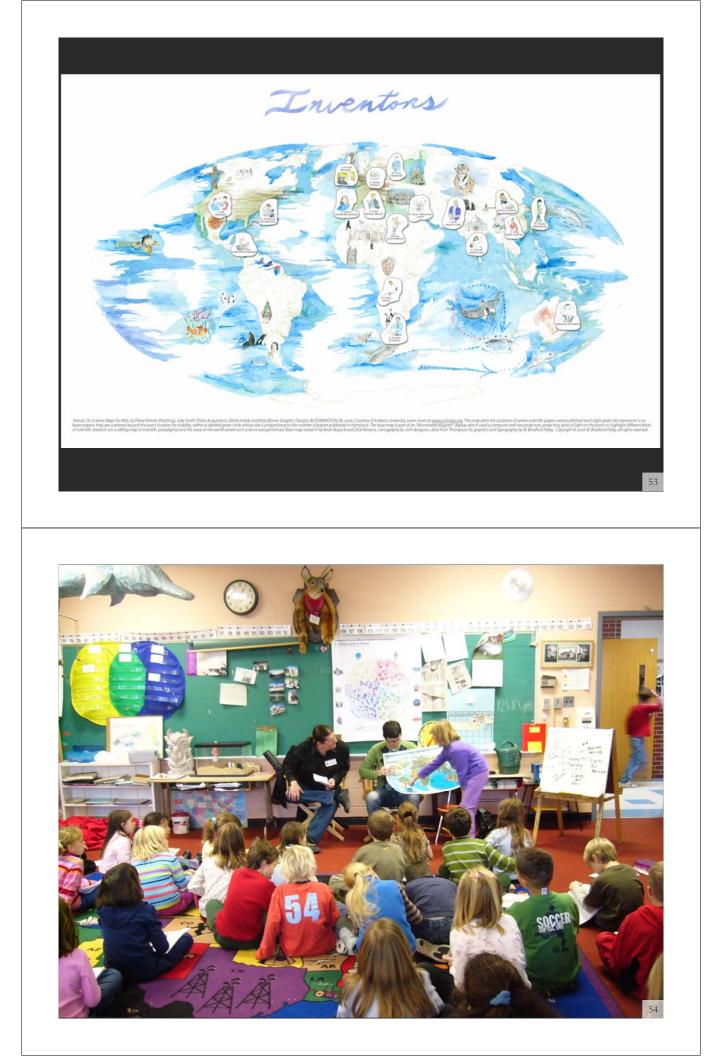


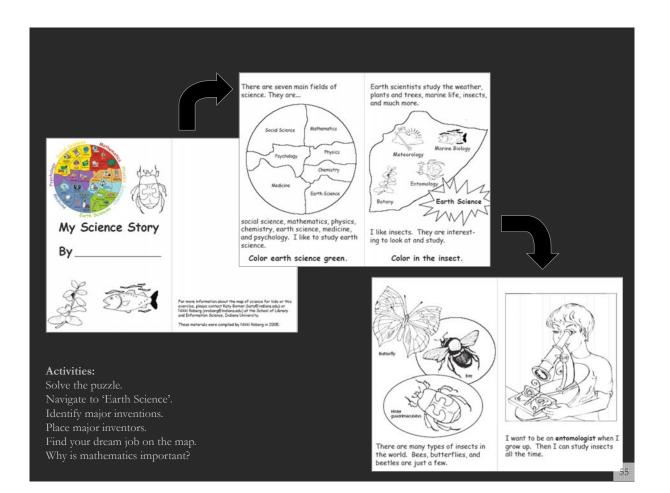
Science Maps in "Expedition Zukunft" science train visiting 62 cities in 7 months 12 coaches, 300 m long Opening was on April 23rd, 2009 by German Chancellor Merkel <u>http://www.expedition-zukunft.de</u>











Part 5: The Future of Science Maps

The inspiration of a noble cause involving human interests wide and far, enables men to do things they did not dream themselves capable of before, and which they were not capable of alone. The consciousness of belonging, vitally, to something beyond individuality; of being part of a personality that reaches we know not where, in space and time, greatens the heart to the limit of the soul's ideal, and builds out the supreme of character.

Joshua L. Chamberlain



Part 5: The Future of Science Maps

- 198 Science Maps as Visual Interfaces to Scholarly Knowledge
- 200 Mapping Intellectual Landscapes for Economic Decision-Making
- 202 Science of Science Policy Maps for Government Agencies
- 204 Professional Knowledge Management Tools for Scholars
- 206 Science Maps for Kids
- 208 Daily Science Forecasts
- 210 Growing a "Global Brain and Heart"

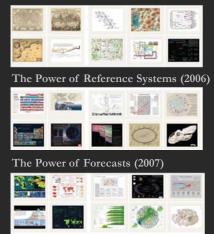




Mapping Science Exhibit - 10 Iterations in 10 years

<u>http://scimaps.org/</u>

The Power of Maps (2005)



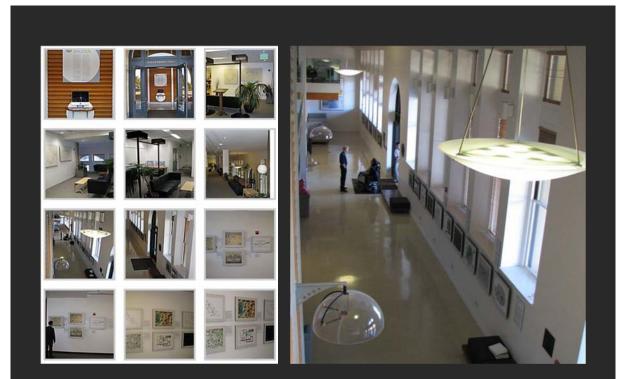
Science Maps for Economic Decision Makers (2008)

Science Maps for Scholars (2010) Science Maps as Visual Interfaces to Digital Libraries (2011) Science Maps for Kids (2012) Science Forecasts (2013) How to Lie with Science Maps (2014)

Exhibit has been shown in 72 venues on four continents. Currently at

- NSF, 10th Floor, 4201 Wilson Boulevard, Arlington, VA
- Center of Advanced European Studies and Research, Bonn, Germany
- Cultural Dimensions of Innovation, UCD Conference, Dublin, Ireland





Debut of 5th Iteration of Mapping Science Exhibit at MEDIA X was on May 18, 2009 at Wallenberg Hall, Stanford University, <u>http://mediax.stanford.edu</u>, <u>http://scaleindependentthought.typepad.com/photos/scimaps</u>

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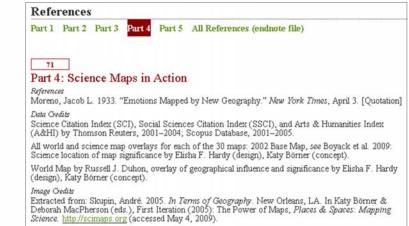


References & Credits

This section lists 1,650 citation references, more than 580 image credits, 80 data credits, and 60 software credits. More than 150 scholars provided input on the material presented in the atlas, and their contributions are acknowledged here.

As some spreads have up to 80 references and adding 80 parenthetical references or four-digit numbers to the page layout would considerably hurt readability, the references and credits are not given in the text. Instead, they are listed here by section. References and credits are ordered alphabetically except for those for **Part 2/Timeline**, which are ordered chronologically.

The Web site for the atlas (<u>http://scimaps.org</u>) supports pinpoint citations (that is, references and credits are associated with the specific text they support). In addition, the site will make available EndNote and bibtex files containing all the references.





Computational Scientometrics Cyberinfrastructures



Scholarly Database: 25 million scholarly records <u>http://sdb.slis.indiana.edu</u>

James S. McDonnell Foundation



VIVO Research Networking <u>http://vivoweb.org</u>



Information Visualization Cyberinfrastructure <u>http://iv.cns.iu.edu</u>



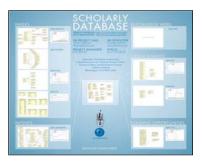
Network Workbench Tool & Community Wiki <u>http://nwb.cns.iu.edu</u>



Science of Science (Sci²) Tool http://sci2.cns.iu.edu



Epidemics Tool & Marketplace Forthcoming





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/

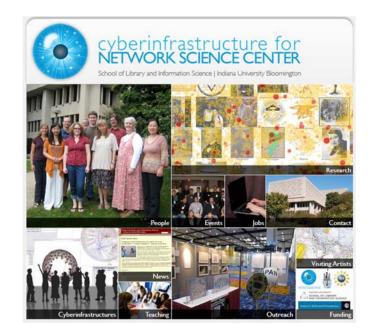
Börner, Katy, Sanyal, Soma and Vespignani, Alessandro (2007). **Network Science.** In Blaise Cronin (Ed.), *ARIST*, Information Today, Inc., Volume 41, Chapter 12, pp. 537-607.

http://ivl.slis.indiana.edu/km/pub/2007-borner-arist.pdf

Börner, Katy (2010) Atlas of Science. MIT Press. http://scimaps.org/atlas

Scharnhorst, Andrea, Börner, Katy, van den Besselaar, Peter (2011) **Models of Science Dynamics**. Springer Verlag.





All papers, maps, tools, talks, press are linked from http://cns.iu.edu

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