

計量書誌学と情報工学の融合による 大規模学術・産業情報の分析

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イノベーション政策研究センター

Innovation Policy Research Center

Activities – 3 pillars

1. Innovation & Technology Management Research

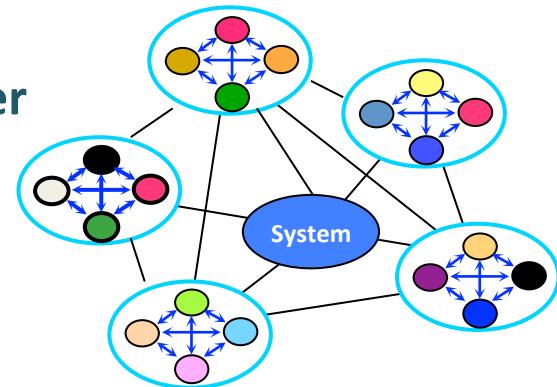
- Develop new methodologies
(Scientometrics, Information Retrieval etc.)
- Applied research (Roadmap, Process design etc.)
- Interdisciplinary research (Sustainability, Gerontology)

2. Workshop, Conference, Seminar, Technology Transfer

- International Conference, Monthly seminar
- Web system
- Discussion Paper Series

3. International Network and Collaboration

OECD, IEA, APEC, ERIA etc.



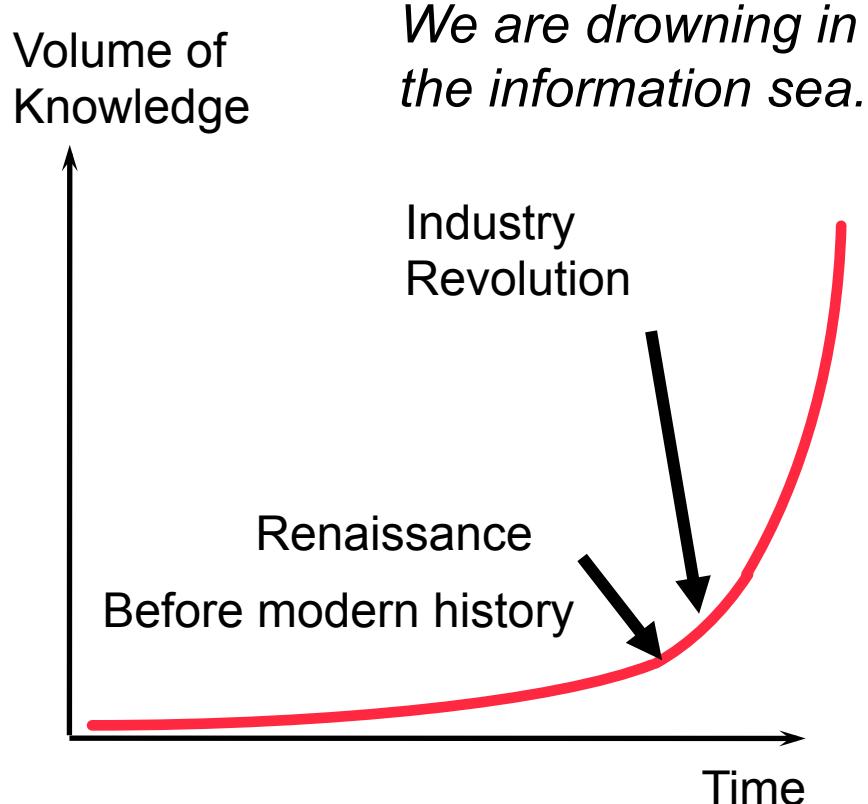
Our focus of Research

- US Government "Science of Science & Innovation policy" -

	Field	Models/Tools	Maturity	Query	Scope	# papers
Quantitative Analysis (Deterministic)	Economics	Econometric		Econometric*,	SSCI	11,189
		Risk Modeling		Risk* and Model*	ECONOMICS	8,594
		Options Modeling		Option* and Model*,	SSCI	8,043
		Cost Benefit		Cost* and Benefit*	SCI&SSCI	53,487
		Cost Effectiveness				
Quantitative Analysis (Stochastic)		Agent Based	Red	Agent based	SCI&SSCI	4,381
		System Dynamics	Yellow	System dynamics	SCI&SSCI	4,361
Qualitative Analysis	Social studies	Case Studies	Green			
		Peer/Expert Review	Green			
		Delphi	Green			
		Strategic/Logic	Green			
Visualization Tools	IT, WEB	Network Analysis	Red	Network analysis	SCI&SSCI	4,709
		Visual Analytics	Yellow	Visualization	CS&IS	7,811
		Science Mapping	Red	-	JISIS(T), Scientometrics , J Infometrics	5,670
		Scientomenrics	Yellow			
Data Collection Tools	Statistics 'WEB	Survey	Green			
		Web scraping	Red	Web	CS&IS	23,832
		Administration Data	Green			
		Data Mining	Red	Data mining	SCI&SSCI	15,473

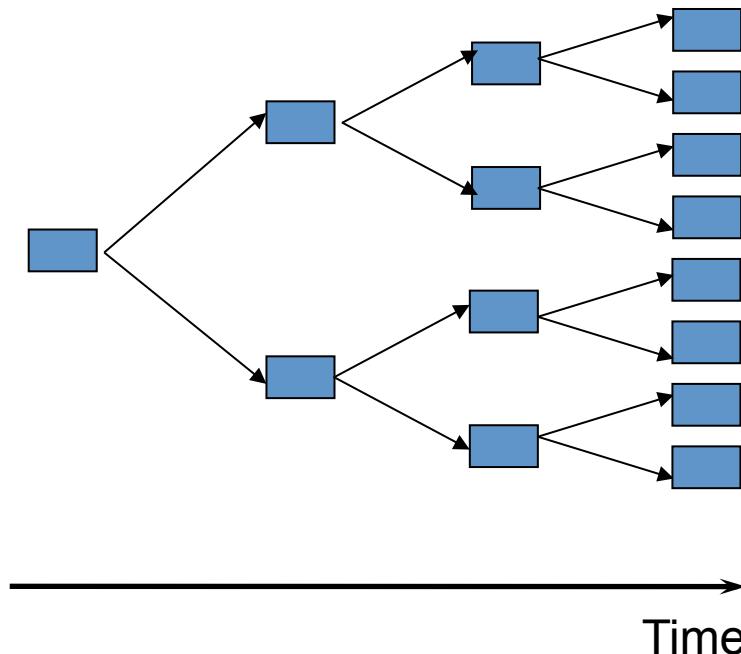
Fundamental challenges we face

- **Exponential growth of knowledge**



- **Segmentation & Specialization**

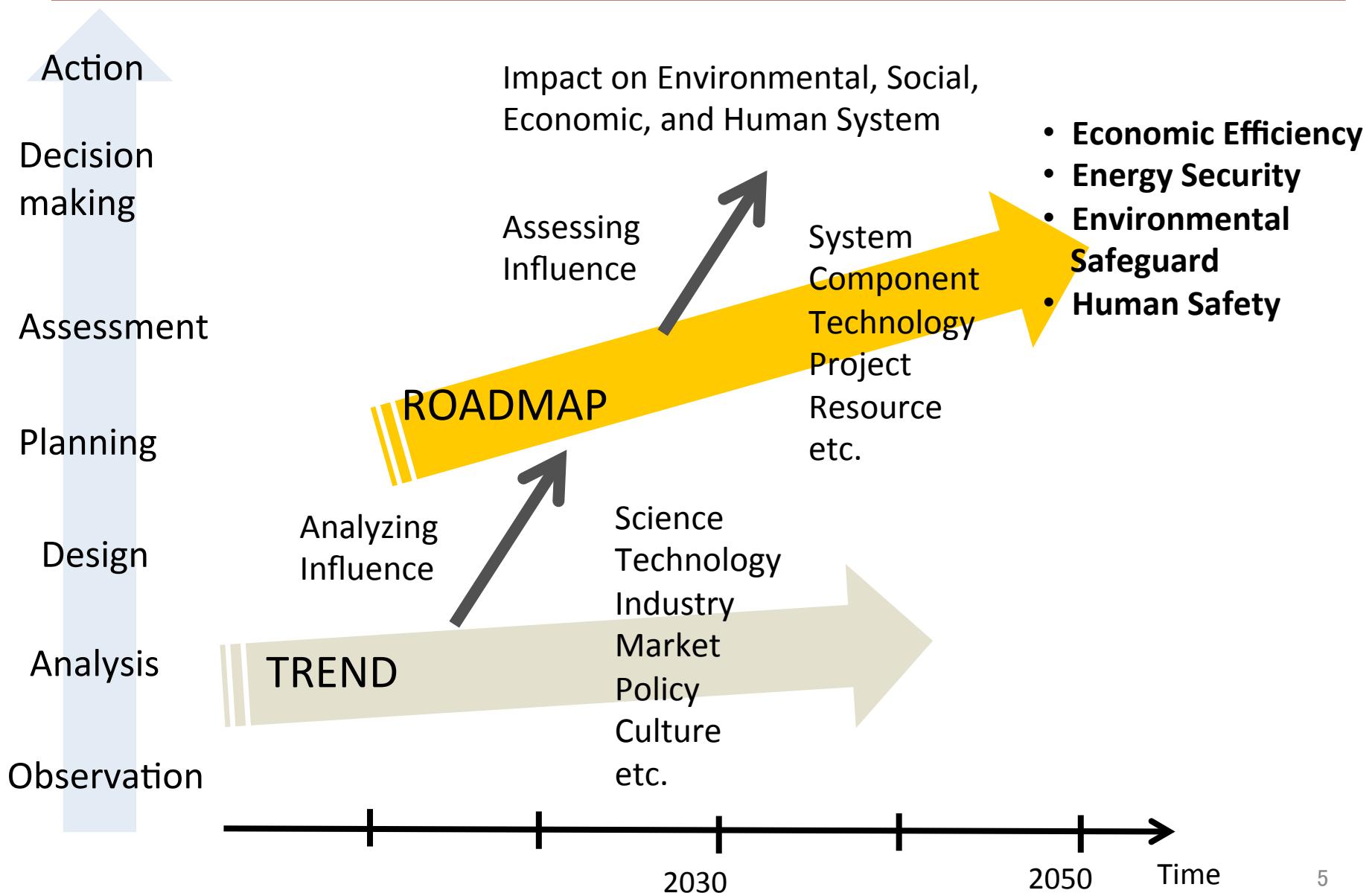
Prerequisite to catch up with the pace of development



- **Complexity of Social Issues.**

Ex) Sustainability, Aging Society

Short-, mid-, and long-term roadmapping



Limitation of expert-based approach

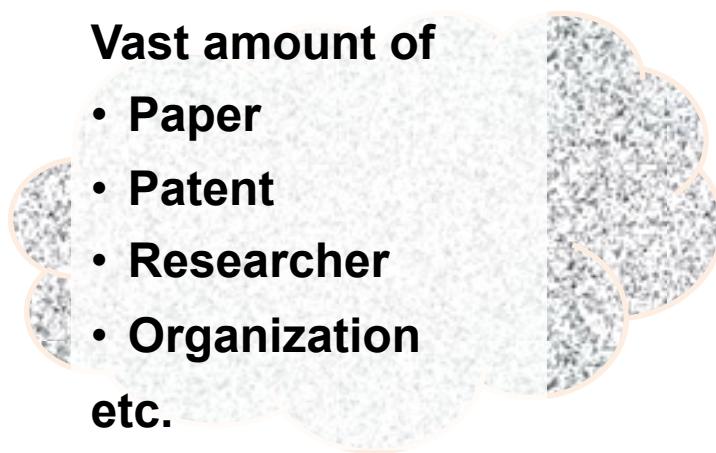
- Historically, such tasks have been handled by experts, such as by the so-called Delphi method initiated by the Rand Corporation of the US in the 1950s. These are known as the **social or expert based approach**.
- However, it becomes more **difficult** to create technological overview using an **expert-based approach** because:
 - 1) the amount of academic knowledge is increasing so fast that no expert can capture the entire knowledge structure of a specific knowledge domain;
 - 2) the expert-based approach is expensive and time consuming;
 - 3) the generally accepted definition of a targeted research field is sometimes lacking.
- Therefore, we have developed a **computer-based approach**, which analyzes explicit knowledge such as journal papers and letters.

Computational Intelligence for R&D management

Non-structured Information

Vast amount of

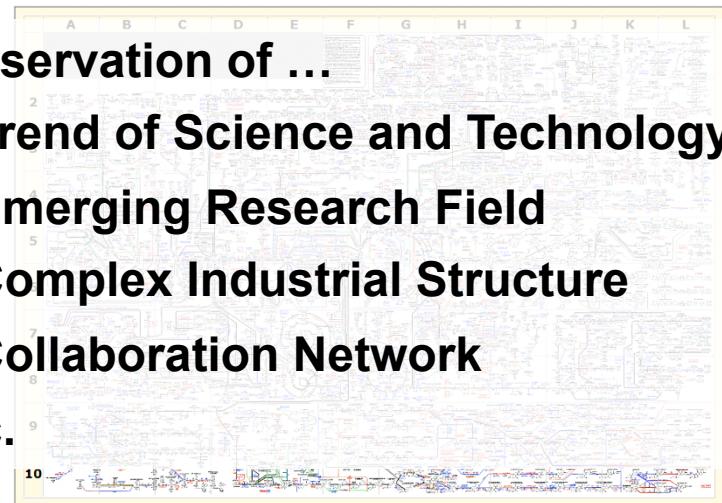
- Paper
- Patent
- Researcher
- Organization
- etc.



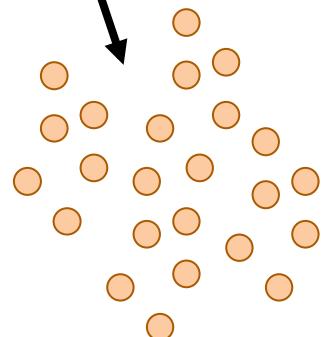
Structured Information

Observation of ...

- Trend of Science and Technology
- Emerging Research Field
- Complex Industrial Structure
- Collaboration Network
- etc.



Collect

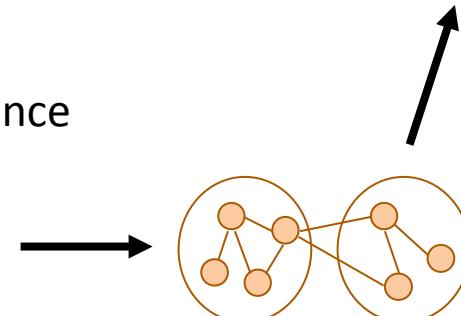


Computational Intelligence

Analyze



Organize



Present

Methodology of academic landscape

Target selection



Ex. Solar Cell

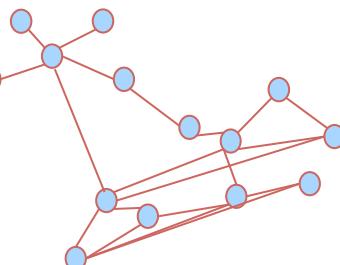
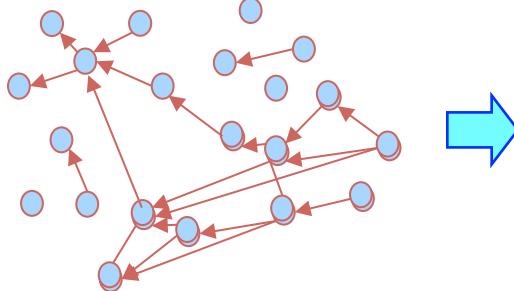
Corpus construction



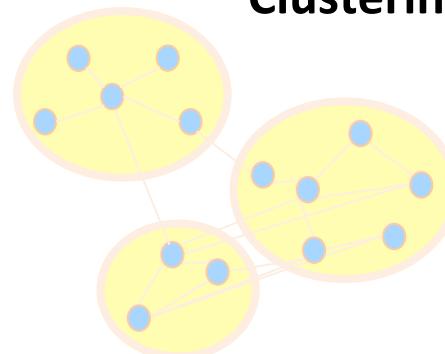
Ex. Query = "Solar Cell*" or Photvolt*

Time span = 1959-2009

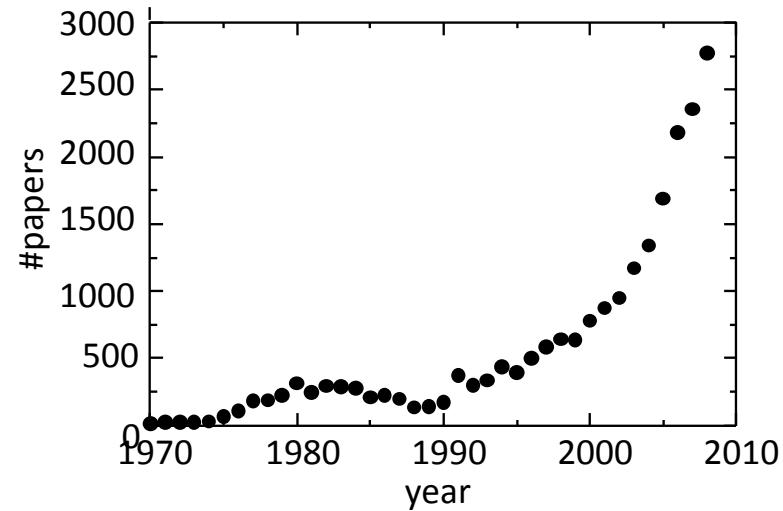
Citation Network Analysis



Kajikawa et al., *TFSC* (2008, 2009)
Shibata et al., *Technovation* (2008)
Sakata et al., *TFSC* (2012)



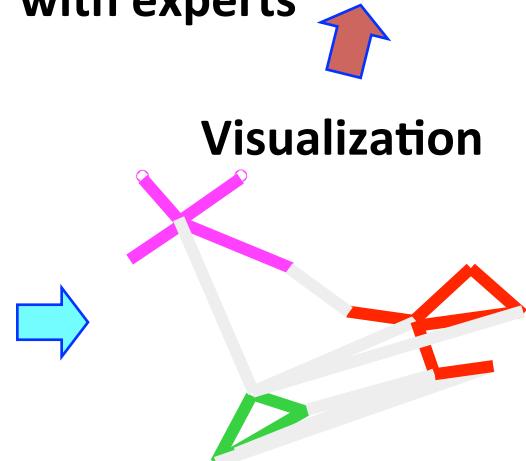
Clustering



Identification of characteristics of clusters with experts



Visualization



Citation Network Analysis

- Node: Papers in the largest-graph component data
- Edge: Citation between Papers
- Year: Average Publication Year in the cluster
- Keywords: Characteristic words in the cluster

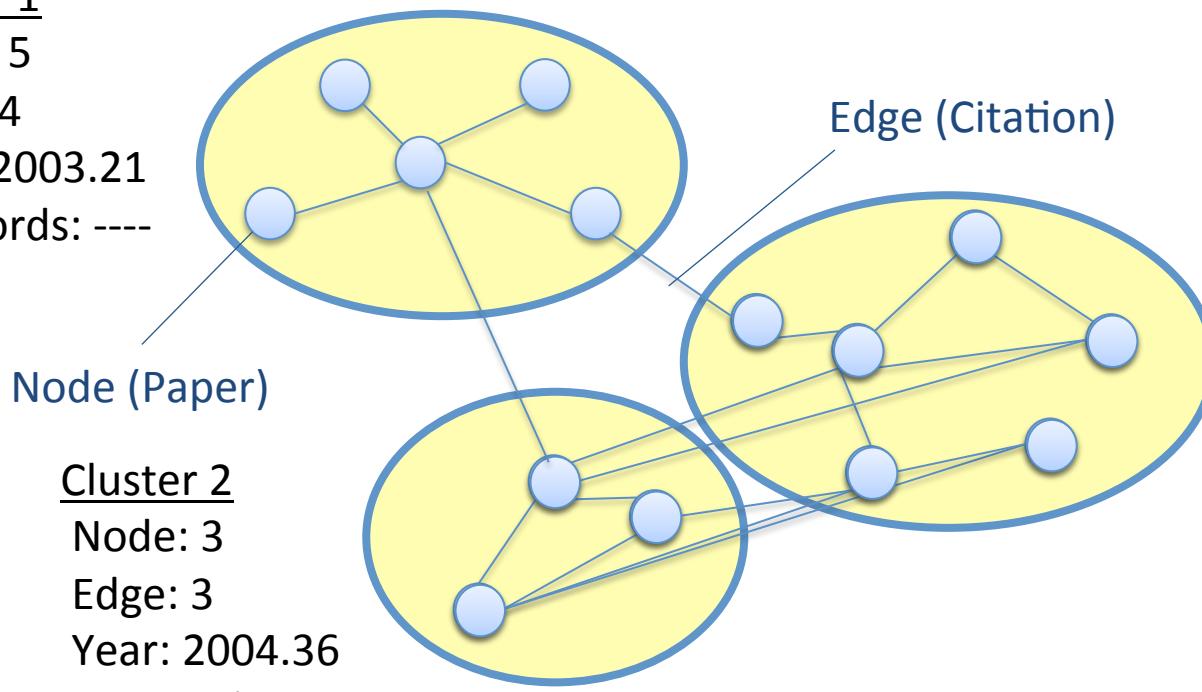
Cluster 1

Node: 5

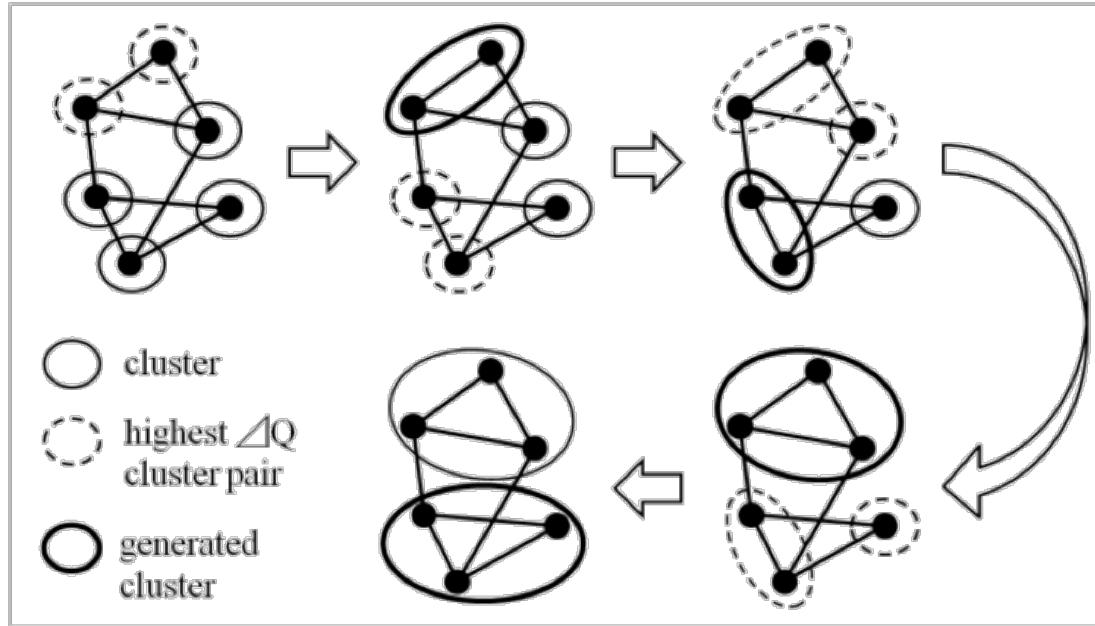
Edge: 4

Year: 2003.21

Keywords: ----



Network Clustering (Newman M.E.J 2004)



$$Q = \sum_i (w_{ii} - a_i^2)$$
$$a_i = \sum_j w_{ij}$$

w_{ij} : the possibility of the weights of edges in the network that connected nodes in cluster s to those in cluster j

- Connect clusters sparsely and extract clusters within which nodes are connected densely is cut.
- A high value of Q represents good community division where only dense edges remain within clusters and sparse edges between clusters are cut off, and
- $Q = 0$ means that a particular division gives no more within-community edges.

Academic Landscape System

- Web-based system <http://academic-landscape.com>
 - Python scripts, libraries, Web server and Database on a Linux server
- Automatically analyze the large volume of scientific paper and patent data
 - Input:
 - Records of Web of Science database (paper) or Thomson Innovation database (patent)
 - Creating a citation network
 - Direct citation, co-citation, and bibliographic coupling
 - Analyzing a citation network
 - Clustering and Network Centrality
 - Analyzing text information
 - Keyword and Topic extraction
 - Visualization
 - Statistics
 - Publication years, Countries, Journals, Researchers, etc.,
 - Citation network
 - Heatmap (similarity among clusters)



Derive a new dataset	
Summary	
Ave. year	2001.7
# of nodes	17,096
# of edges	92,738
Keywords	
film	0.0027
silicon	0.0023
layer	0.0018
deposition	0.0016
thin film	0.0015
Countries	
Institutes	
Natl Renewable Energy Lab	446
Univ New S Wales	325
Hahn Meitner Inst Berlin GmbH	263
Chinese Acad Sci	262
Fraunhofer Inst Solar Energy Syst	218
Journals	
SOLAR ENERG MATER SOLAR CELLS	1946
THIN SOLID FILMS	1596
J APPL PHYS	1340
APPL PHYS LETT	1101
PROG PHOTOVOLTAICS	546
Authors	
Green, MA	163
Schock, HW	144
Lux-Steiner, MC	128
Yamada, A	122
Schropp, REI	122
Publication years	
2011	2155
2010	1676
2009	1403
2008	1038
2006	960

Cluster 1 (17096 fac) Search

Page 1 of 17,096 facets · [<](#) [>](#)

Progress toward 20% efficiency in Cu(In,Ca)Se-2 polycrystalline thin-film solar cells
Cluster 1 Within-cluster cites 490 [Detail](#)

Authors: Contreras, MA and Egaas, B and Ramanathan, K and Hiltner, J and Swartzlander, A and Hasoon, F and Noufi, R
 Countries: USA
 Institutes: Colorado State Univ, NREL
 Abstract: This short communication reports on achieving 18.8% total-area conversion efficiency for a ZnO/CdS/Cu(In,Ga)Se-2/Mo polycrystalline thin-film solar cell. We also report a 15%-efficient, Cd-free device fabricated via physical vapor deposition methods. The Cd-free cell includes no buffer layer, and it is fabricated by direct deposition of ZnO on the Cu(In,Ga)Se-2 thin-film absorber. Both results have been measured at the National Renewable Energy Laboratory under standard reporting conditions (1000 W/m², 25 degrees C, ASTM E 892 Global). The 18.8% conversion efficiency represents a new record for such devices (Notable Exceptions) and makes the 20% performance level by thin-film polycrystalline materials much closer to reality. We allude to rite enhancement in performance of such cells as compared to previous record cells, and we discuss possible and realistic routes to enhance the performance reward the 20% efficiency level. Published in 1999 by John Wiley & Sons, Ltd. This article is a US government work and is in the public domain in the United States.

19.9%-efficient ZnO/CdS/CuInGaSe2 solar cell with 81.2% fill factor
Cluster 1 Within-cluster cites 343 [Detail](#)

Authors: Repins, I and Contreras, MA and Egaas, B and DeHart, C and Scharf, J and Perkins, CL and To, B and Noufi, R
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: We report a new record total-area efficiency of 19.9% for CuInGaSe₂-based thin-film solar cells. Improved performance is due to higher fill factor. The device was made by three-stage co-evaporation with a modified surface termination. Growth conditions, device analysis, and basic film characterization are presented. Published in 2008 by John Wiley & Sons, Ltd.

Properties of 19.2% efficiency ZnO/CdS/CuInGaSe2 thin-film solar cells
Cluster 1 Within-cluster cites 317 [Detail](#)

Authors: Ramanathan, K et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Ramanathan, K et al., PROG PHOTOVOLTAICS, V11, P225 (2003)

Increasing the efficiency of ideal solar cells by photon induced transitions at intermediate levels
Cluster 1 Within-cluster cites 282 [Detail](#)

Authors: Luque, A et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Luque, A et al., PHYS REV LETT, V78, P5014 (1997)

Coaxial silicon nanowires as solar cells and nanoelectronic power sources
Cluster 1 Within-cluster cites 259 [Detail](#)

Authors: Tian, BZ et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Tian, BZ et al., NATURE, V449, P885 (2007)

THIN-FILM CDS/CDT-E SOLAR-CELL WITH 15.8-PERCENT EFFICIENCY
Cluster 1 Within-cluster cites 233 [Detail](#)

Authors: BRITT, J et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: BRITT, J et al., APPL PHYS LETT, V62, P2851 (1993)

Diode (characteristics in state-of-the-art ZnO/CdS/Cu(In(1-x)Ga)xSe-2 solar cells
Cluster 1 Within-cluster cites 211 [Detail](#)

Authors: Contreras, MA et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Contreras, MA et al., PROG PHOTOVOLTAICS, V13, P209 (2005)

Intrinsic microcrystalline silicon: A new material for photovoltaics
Cluster 1 Within-cluster cites 208 [Detail](#)

Authors: Vetterl, O et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Vetterl, O et al., SOLAR ENERG MATER SOLAR CELLS, V62, P97 (2000)

Thin film deposition methods for CuInSe(2) solar cells
Cluster 1 Within-cluster cites 205 [Detail](#)

Authors: Kemell, M et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Kemell, M et al., CRIT REV SOLID STATE MAT SCI, V30, P1 (2005)

Electronic properties of Cu(In,Ga)Se-2 heterojunction solar cells-recent achievements, current understanding, and future challenges
Cluster 1 Within-cluster cites 197 [Detail](#)

Authors: Rau, U et al.
 Countries: USA
 Institutes: Natl Renewable Energy Lab
 Abstract: Rau, U et al., APPL PHYS A-MAT SCI PROCESS, V69, P131 (1999)

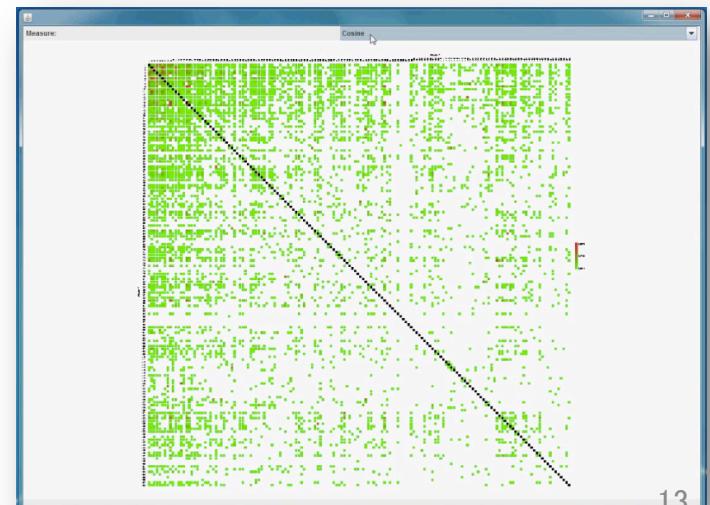
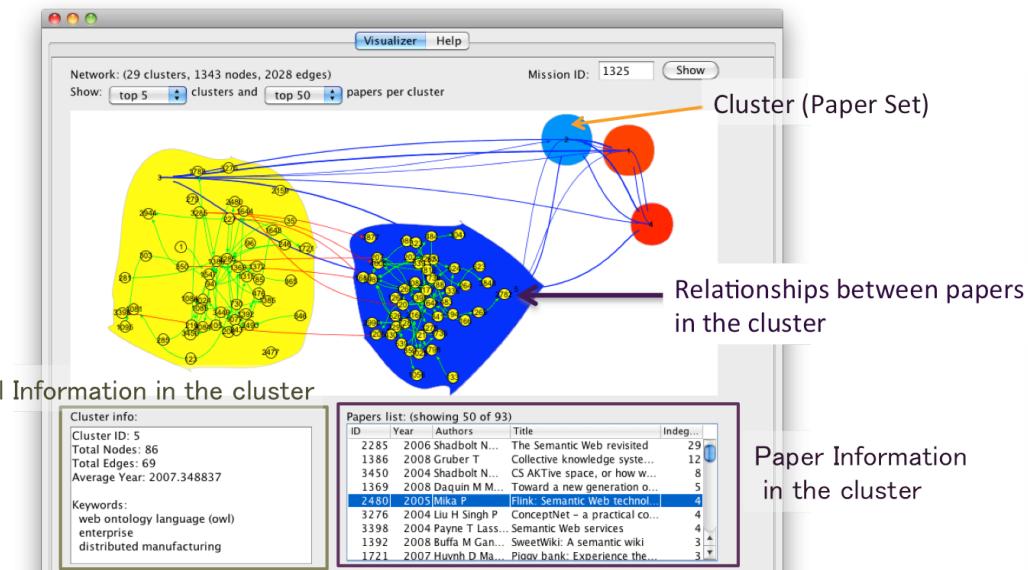
Intrinsic microcrystalline silicon: A new material for photovoltaics
Cluster 1 Within-cluster cites 208 [Detail](#)

Authors: Rau, U and Schock, HW
 Countries: Germany
 Institutes: Univ Stuttgart
 Abstract: The recent achievements of high-efficiency Cu(In,Ga)Se-2 heterojunction solar cells are reviewed with a special focus on the understanding of the electronic transport properties of the devices. We discuss the basic limitations of the device performance, the present understanding of electronic device analysis, as well as the role of intrinsic defects and of the interfaces for the performance of the solar cells.



Network

Heat Map



Academic Landscape of Solar Cell Research (1959-2009)

#5 System

2,527 papers, 5.6 ages

#1 Si

10,520 papers 11.0 ages

#2 Organics

5,712 papers, 4.0 ages

#3 Compounds

4,932 papers,
8.2 ages

**#4 Dye-
sensitized**
4,647 papers,
3.4 ages

Age = 2009-(average publication year)

Identifying Emerging Research Domains

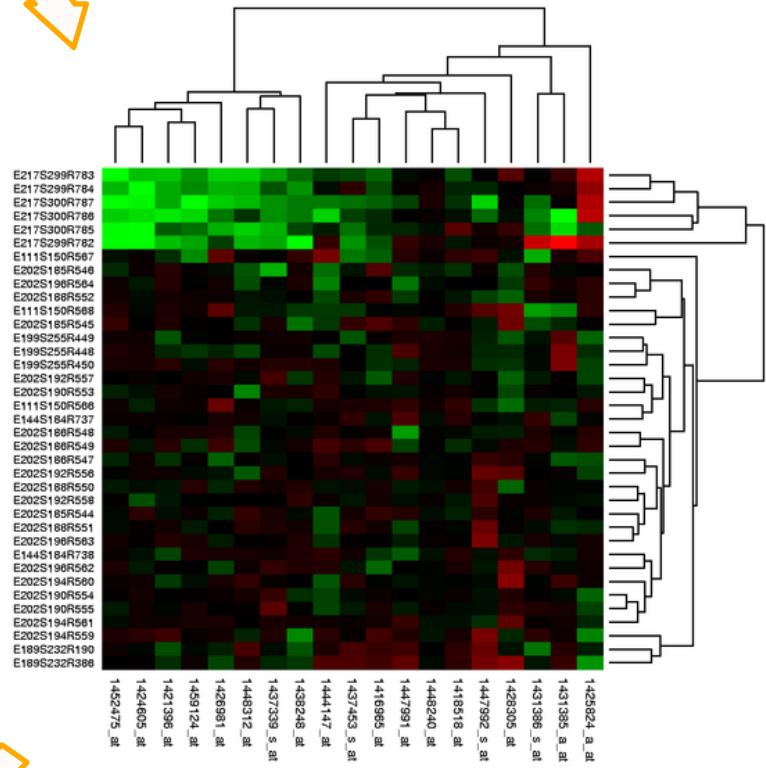
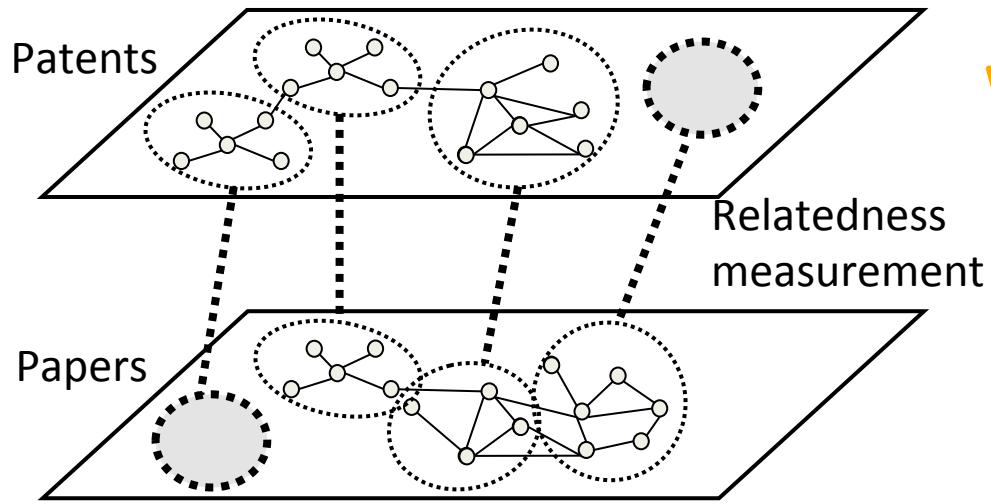
1 st layer	2 nd layer			3 rd layer		
Cluster name	Cluster name	Ages	Nodes	Cluster name	Ages	Nodes
Si	a-Si	8.53	2905	Degradation of a-Si	15.33	785
				Microcrystalline	4.93	705
				H dilution effect in a-Si:H	7.27	573
				Textured ZnO	5.57	432
	Modeling	21.78	2477	Modeling of recombination	20.37	747
				Compounds	25.24	584
				Shottokky	19.10	537
				Resistance	23.20	359
				Tandem-type	9.56	581
	High efficiency	7.05	2196	Band structure	5.82	478
				Metal-induced crystallization	6.63	481
				Surface passivation	5.75	475
				Metal impurities	7.61	409
	c-SI	6.13	2151	HIT	3.71	231

Identifying Emerging Research Domains

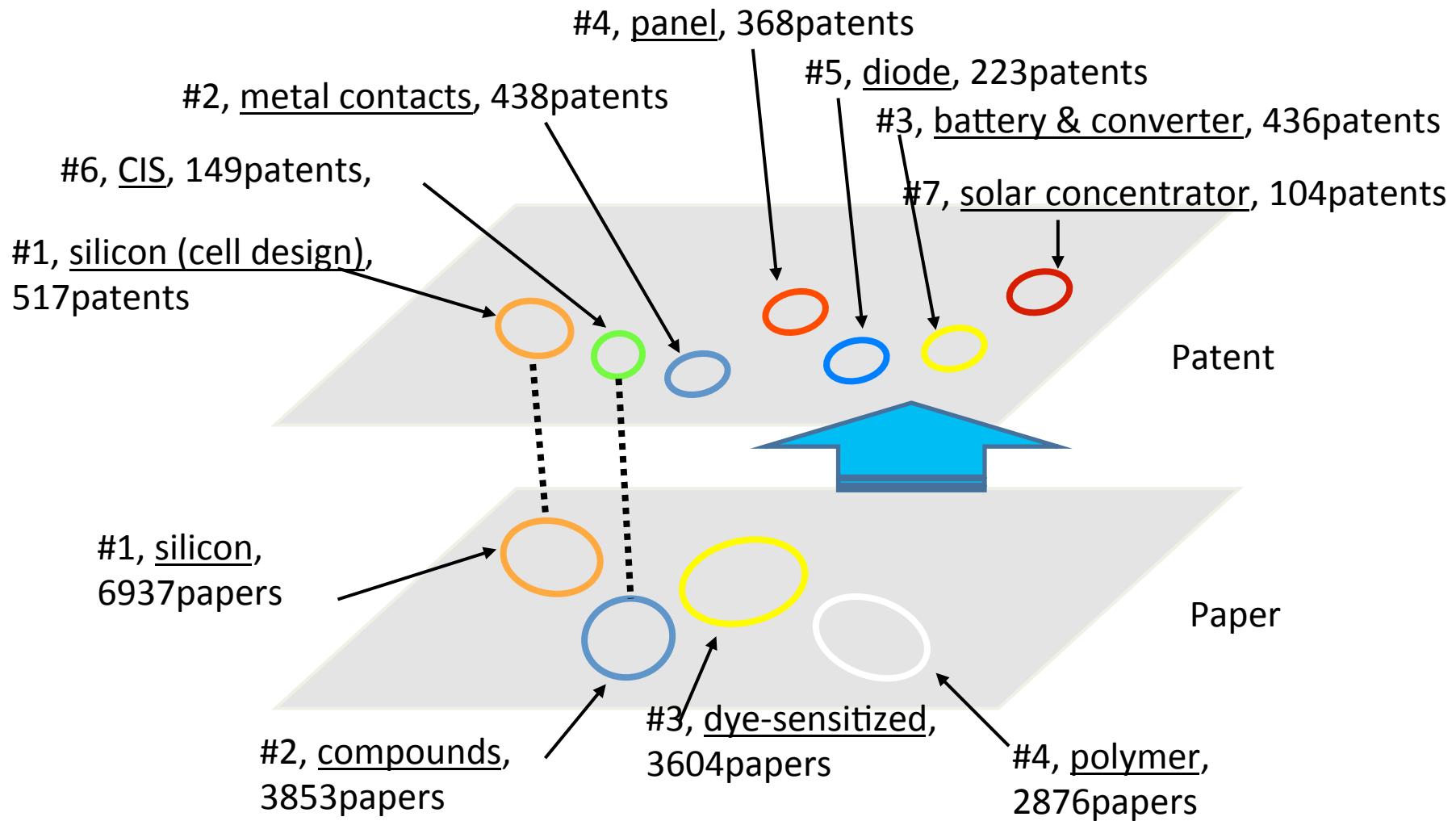
Emerging Research Domains Analysis						
Category	Sub-Category	Impact Factor	Publications	Key Research Areas		
				Area	Citation Rate	H-index
Organics	Organics	6.46	2023	Double-hetero structure	2.63	679
				phthalocyanine	11.89	552
				Photodiode	5.99	527
				Plastic solar cell	3.00	521
	New materials and processes	2.31	1570	Narrow bandgap	2.05	517
				Liquid process	1.62	423
	Complexes with Nanoparticles	2.49	1263	Nanopartciels/polymer	2.26	427
				Conjugated polymer	2.15	402
				TiO ₂ nanotube/polymer	2.94	322
	Complexes with Nanocarbons	3.56	667	nanotube/polymer	2.33	177
				fullerene/olygomer	3.95	168
				fullerene/ polvfiline	3.44	106
Dye-sensitized	Electrode	2.97	1467	Modeling	4.23	520
				TiO ₂ nanotube	2.27	399
				Nano-structured ZnO	2.08	387
	Electrolyte	3.28	1427	Semi-solid electrolyte	2.73	488
				Solid-electrolyte	4.45	412
				Impedance measurement	2.86	374
	Photosensitizer	3.69	1245	Ru-based dyes	4.56	4.88
				Molecular design	2.00	327

Extracting Candidates for Innovation

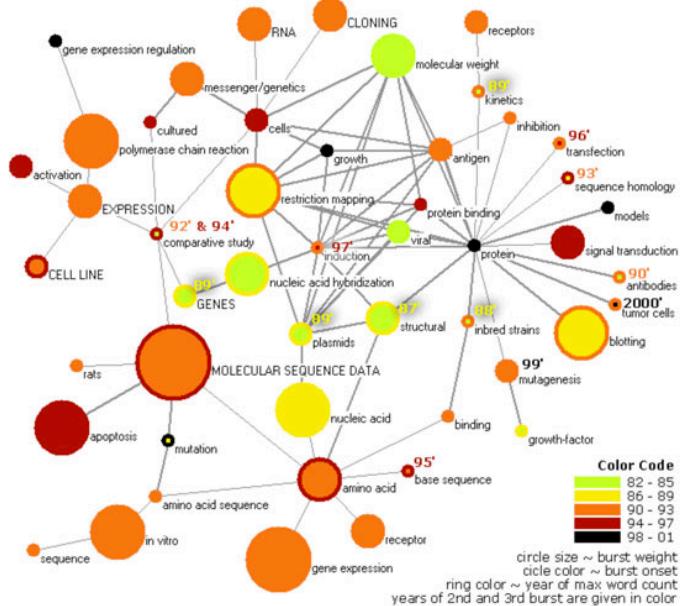
Multi-layer analysis of paper and patents



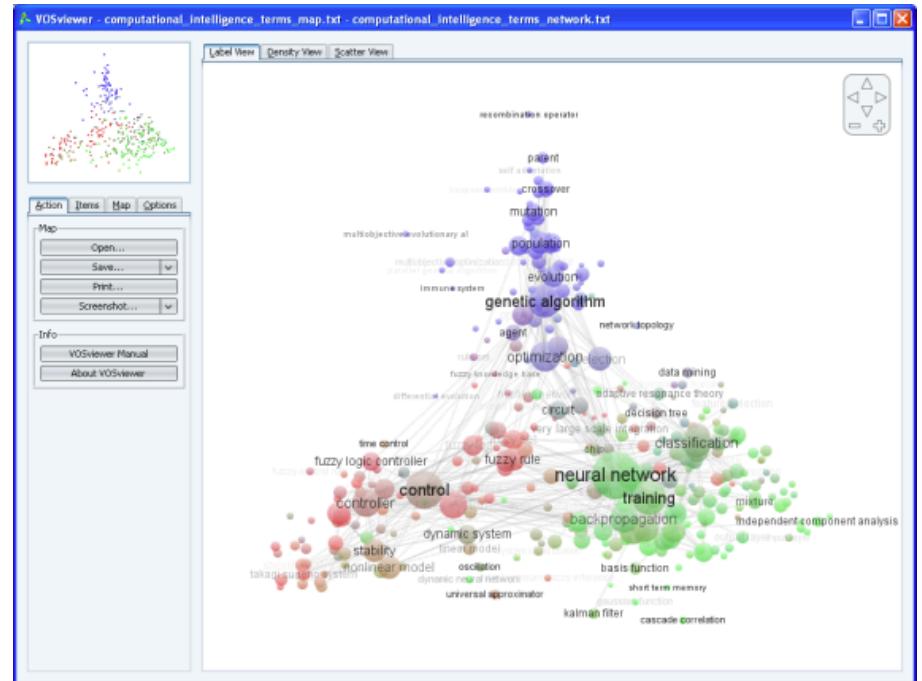
Science and Technology Linkage in Solar Cell Research



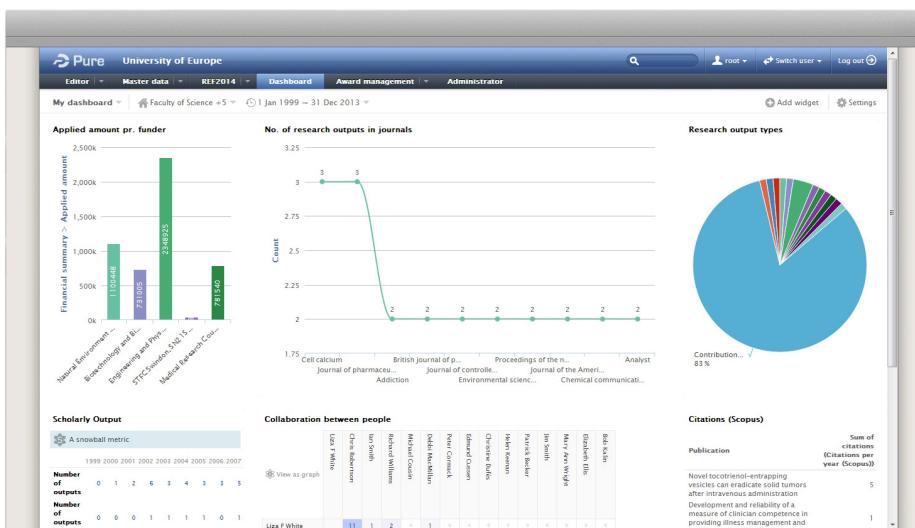
Related works



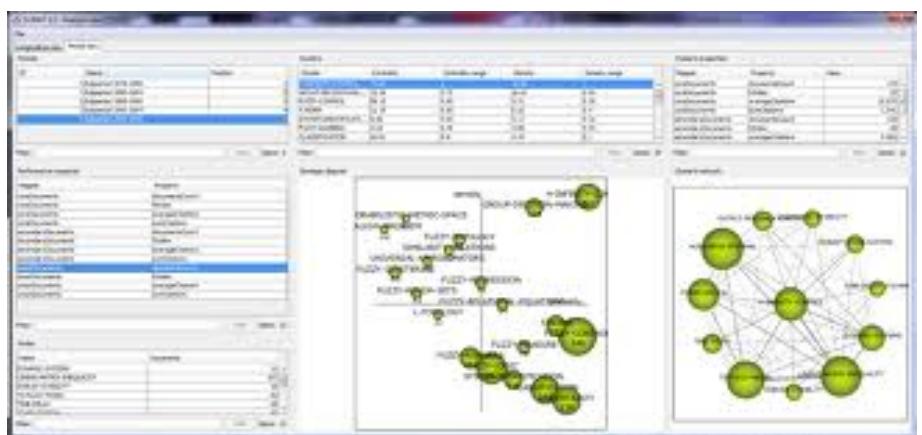
Mapping Topics and Topic Bursts in PNAS using Sci2



Science Mapping using VOSviewer



Research Performance Management using PURE



Science Mapping Analysis using SciMAT

一覧

俯瞰図

グラフツール

ヒートマップ

実行ログ

概要

平均年 2006.1

フェセット数 16626

ノード数 14704

エッジ数 74662

クラスタ数 79

キーワード

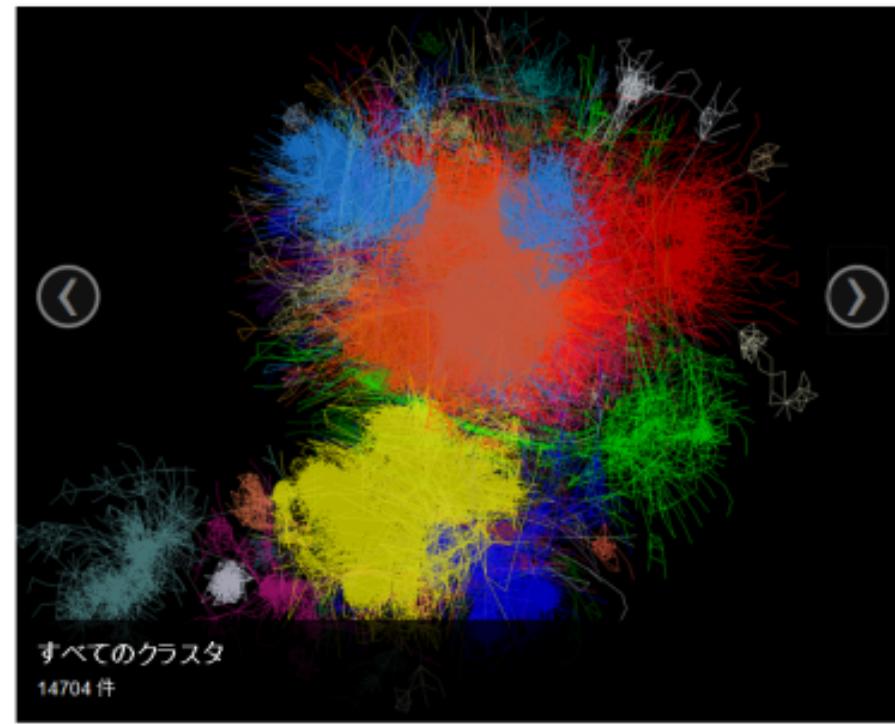
国籍

組織

ジャーナル

著者

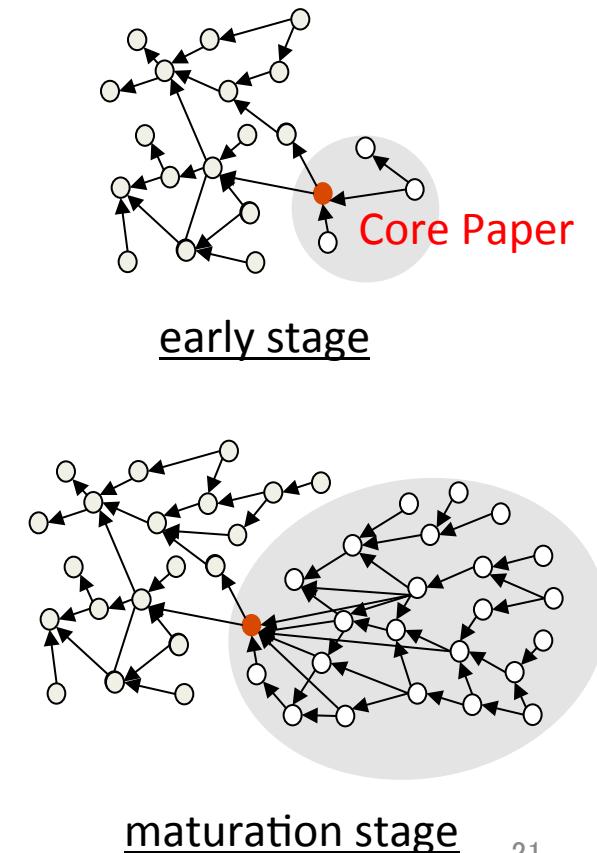
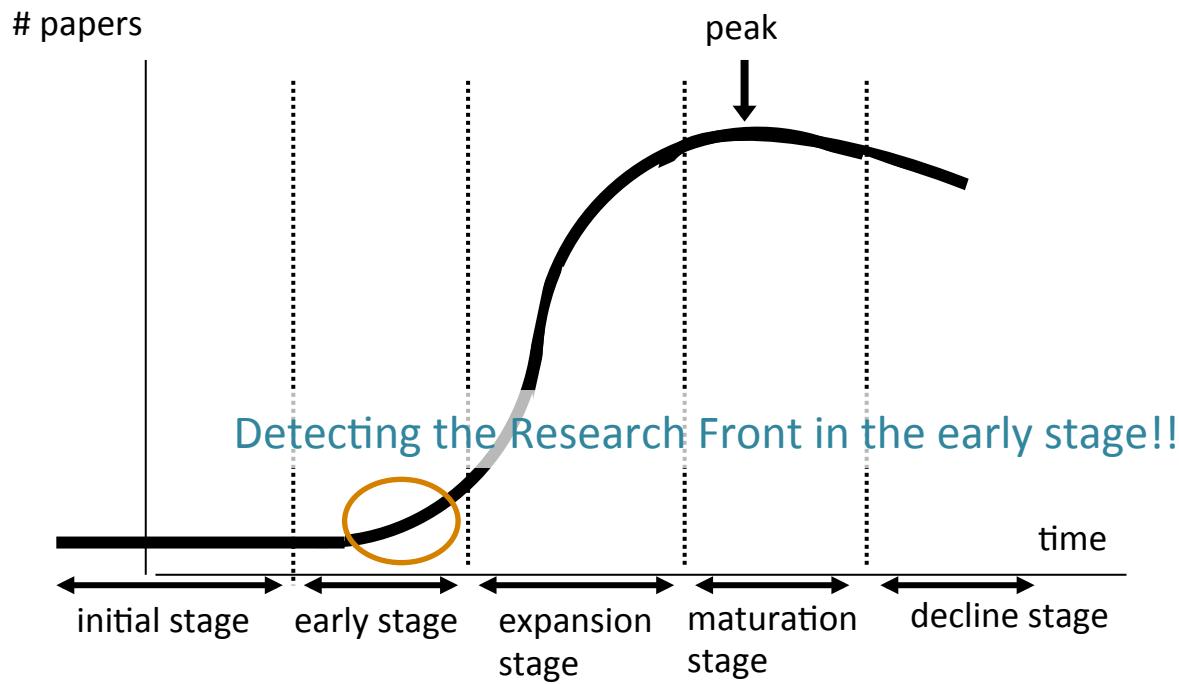
発行年度



DETECTING THE RESEARCH FRONTS USING CITATION NETWORK ANALYSIS

Emerging research domains

- Gaining rapidly growing interests
- Its technology is not matured at the moment and therefore has limitations in industrial applications
- Its technology potentially has highly economic and social impacts in the near future



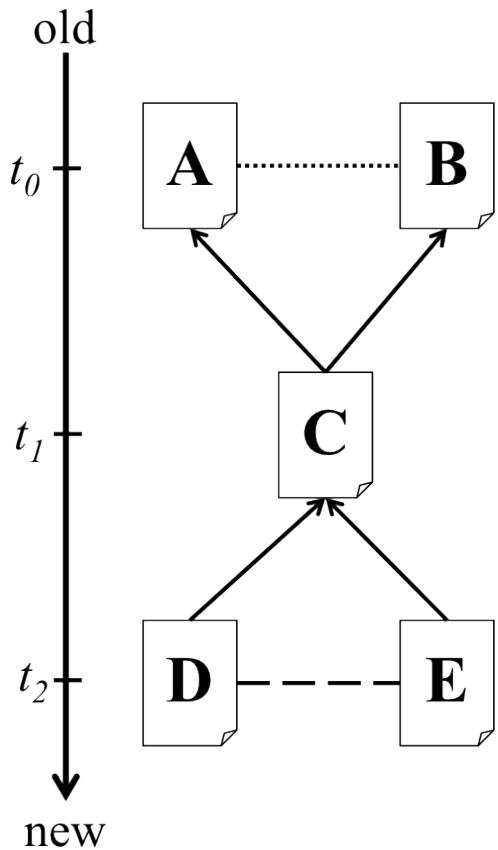
Performance of Each method in Detecting Domains

visibility, speed, topological and textual relevance of the cluster with core paper

- Visibility (Cluster Size): $|N_i \in C_x| / |N|$
 $(|N|: \# \text{ of nodes}, |N_i \in C_x|: \# \text{ of nodes in core paper cluster } C_x)$
- Speed (Average publication year in the cluster)
- Topological relevance (Cluster Density): $|E_i \in C_x| / |N| C_2$
 $|E_i \in C_x| : \# \text{ of edges; both nodes are in the core paper cluster } C_x$
- Textual relevance (Keyword similarity):
$$\sum_{N_i \in C_x, N_j \in C_x (i \neq j)} Sim(N_i, N_j) / \sum_{C_i \in C} Sim(C_x, C_i)$$

(Paper Keyword Similarity in the cluster)
/ (Keyword Similarity between clusters and the core paper cluster)

Type of Citations



→ direct-citation
..... co-citation
- - bibliographic coupling

Direct citation

- Edge between two documents when *paper C* cites *paper A* directly
- An earlier paper is cited by a new paper

Co-citation

- Edge between two documents cited by the same paper(s)
- Considering the number of citations

Bibliographic coupling

- Edge between two documents citing the same paper(s)
- Considering the number of citations

	Direct vs Co-citation vs Bibliographic
Nodes	Direct > Bibliographic > Co-citation
Edges	Bibliographic > Co-citation > Direct
Year	Direct = Bibliographic > Co-citation

Weighted Citation Graph

* Jaccard similarity is defined by P. Jaccard 1912

(i) Frequency of citations: $w(E_{ij}) = |E_{ij}|$

Considering the number of citations

(ii) Difference of publication years:

$w(E_{ij}) = -|y_i - y_j|/10 + 2$ if $|y_i - y_j| > 10$, $w(E_{ij}) = 1$

Differences between the publication years of paper are small => High

(iii) Reference Similarity: $w(E_{ij}) = \text{Jaccard}(C_i, C_j) + 1$

Similar reference list => High

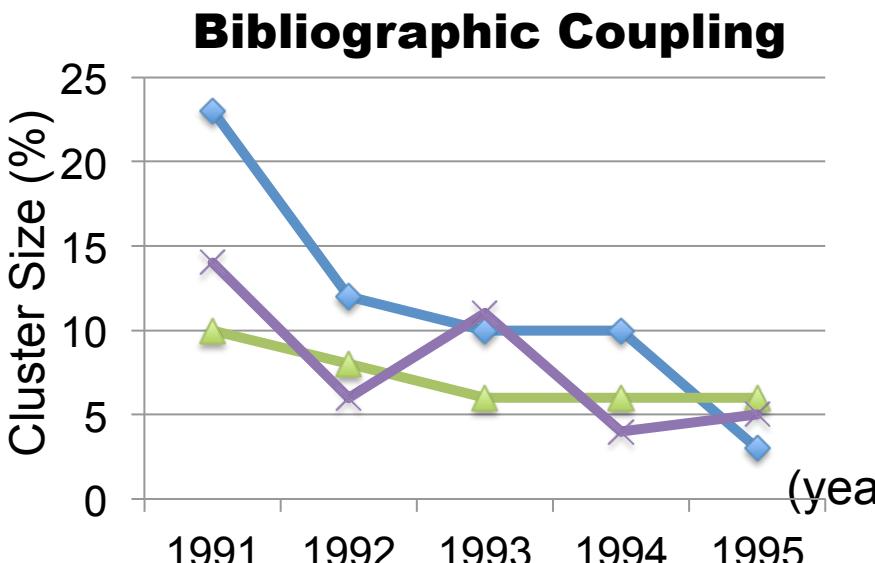
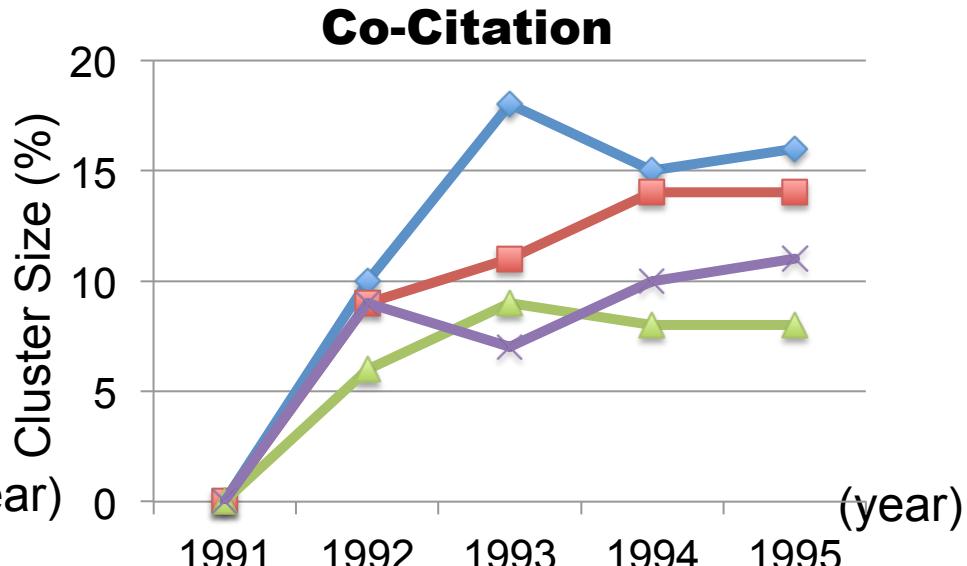
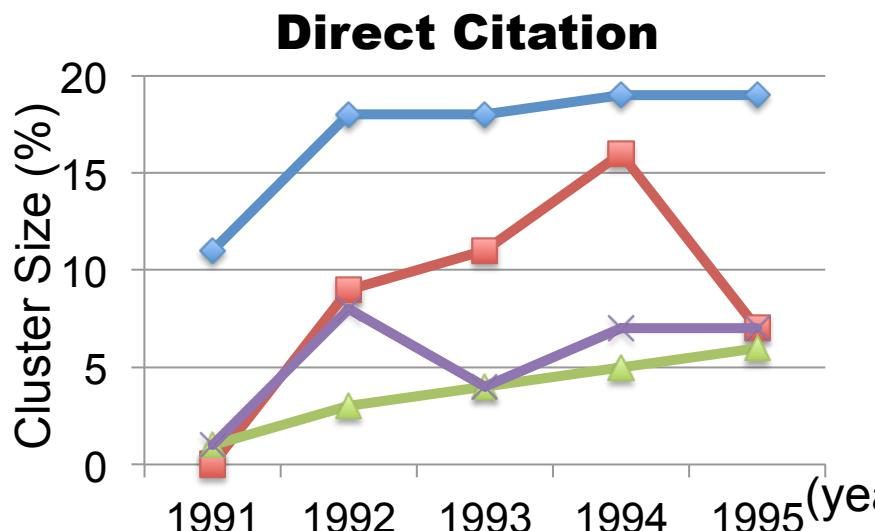
(iv) Keyword Similarity: $w(E_{ij}) = \text{Jaccard}(K_i, K_j) + 1$

Similar Keywords of papers => High

- Graph: $G = (N, E, w)$, Node Set: $N = \{N_1, \dots, N_p, \dots, N_{|N|}\}$, Edge Set = $E = \{\dots, E_{ij}, \dots\}$
- E_{ij} : Edges between Node i and Node j ($|E_{ij}|$: Number of citations between Node i and Node j)
- Attributes of N_i : y_i : publication year, C_i : reference set,
 K_i : Keyword (Author Keyword, Characteristic Keyword in Title and Abstract)

Visibility (Cluster Size)

(B) IIJIMA, S, 1991, NATURE, V354, P56

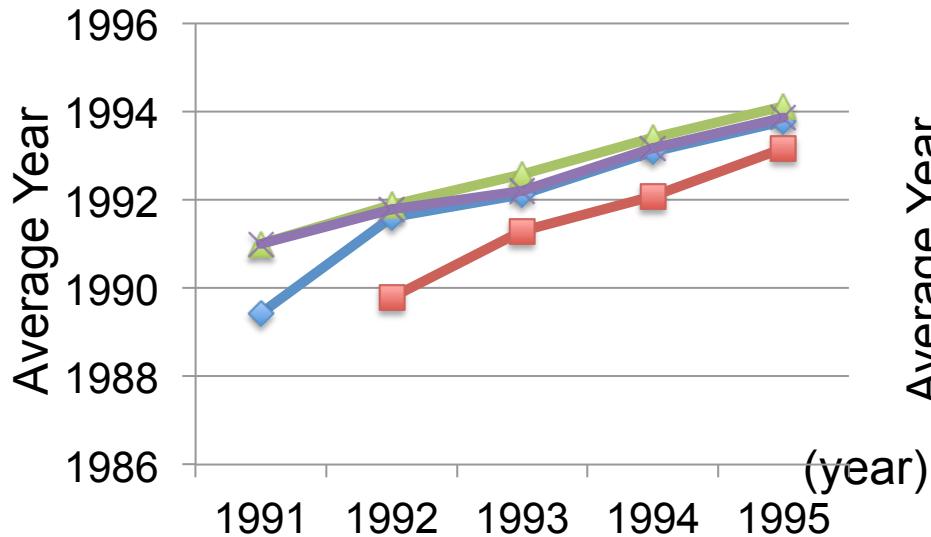


- ◊— (i) Frequency of citations
- (ii) Publication Years
- ▲— (iii) Reference Similarity
- ×— (iv) Keyword Similarity

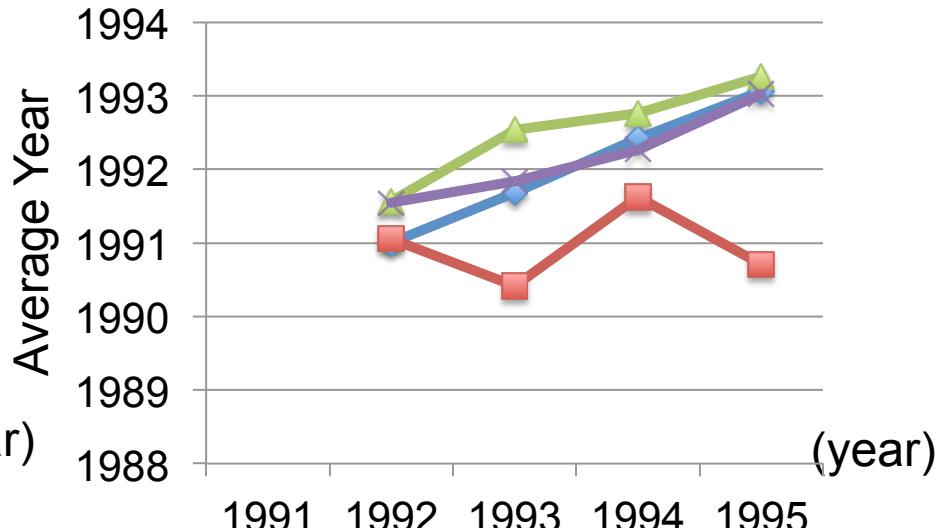
Speed (Average publication year)

(B) IIJIMA, S, 1991, NATURE, V354, P56

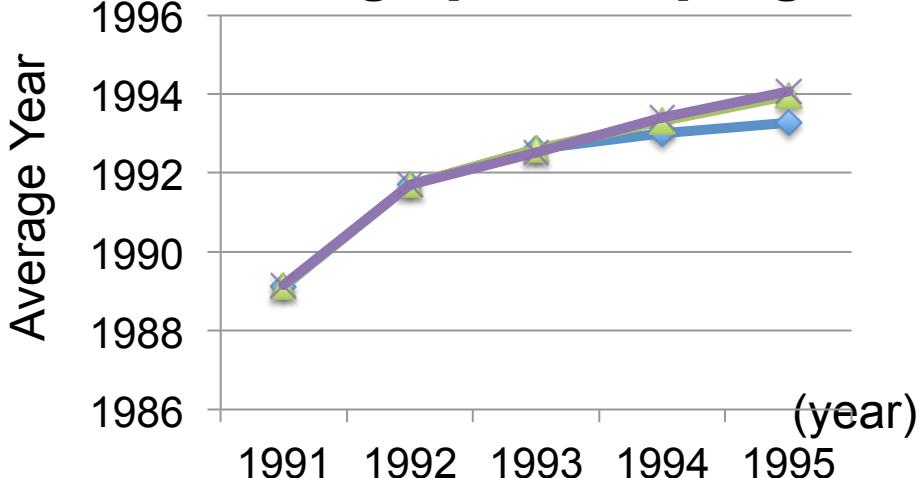
Direct Citation



Co-Citation



Bibliographic Coupling

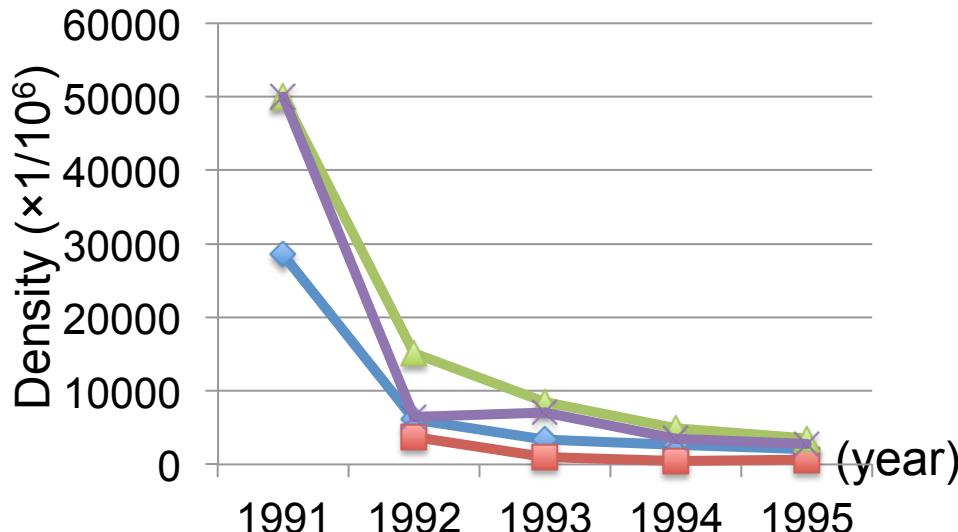


- ◊— (i) Frequency of citations
- (ii) Publication Years
- ▲— (iii) Reference Similarity
- *— (iv) Keyword Similarity

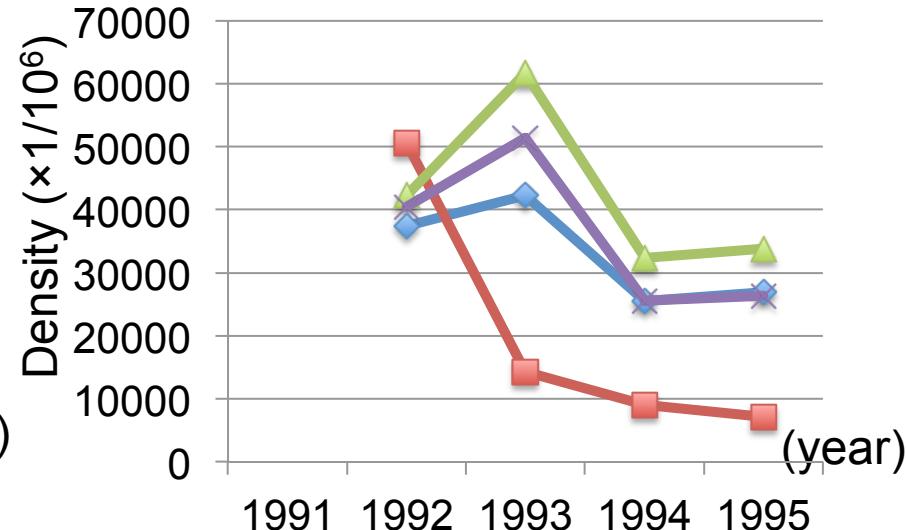
Topological relevance (Cluster Density)

(B) IIJIMA, S, 1991, NATURE, V354, P56

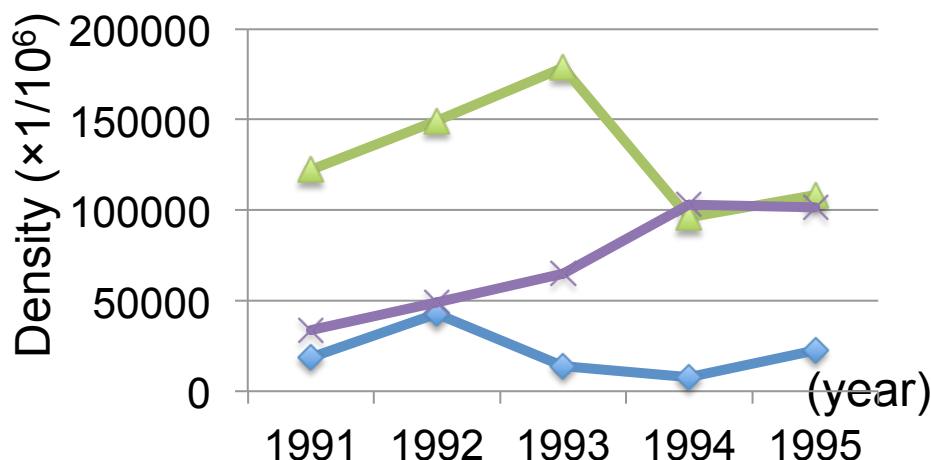
Direct Citation



Co-Citation



Bibliographic Coupling

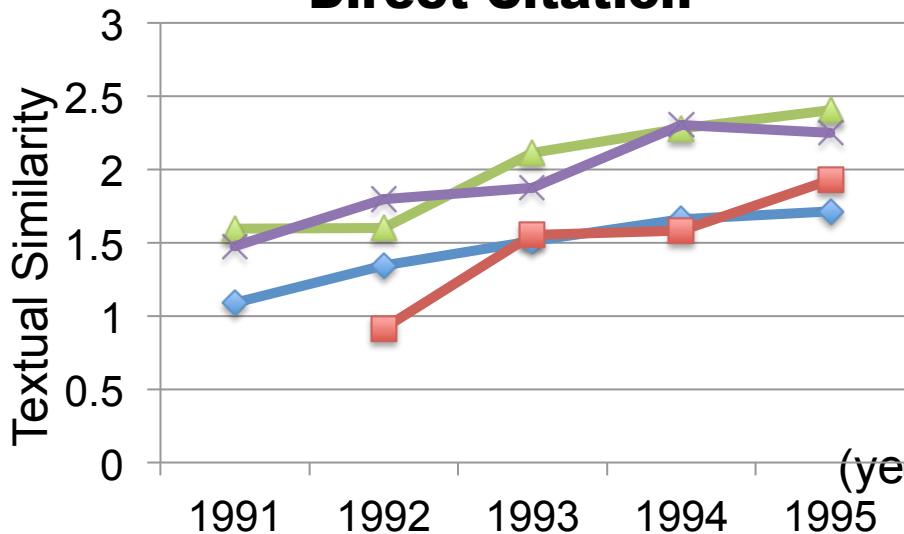


- (i) Frequency of citations
- (ii) Publication Years
- (iii) Reference Similarity
- (iv) Keyword Similarity

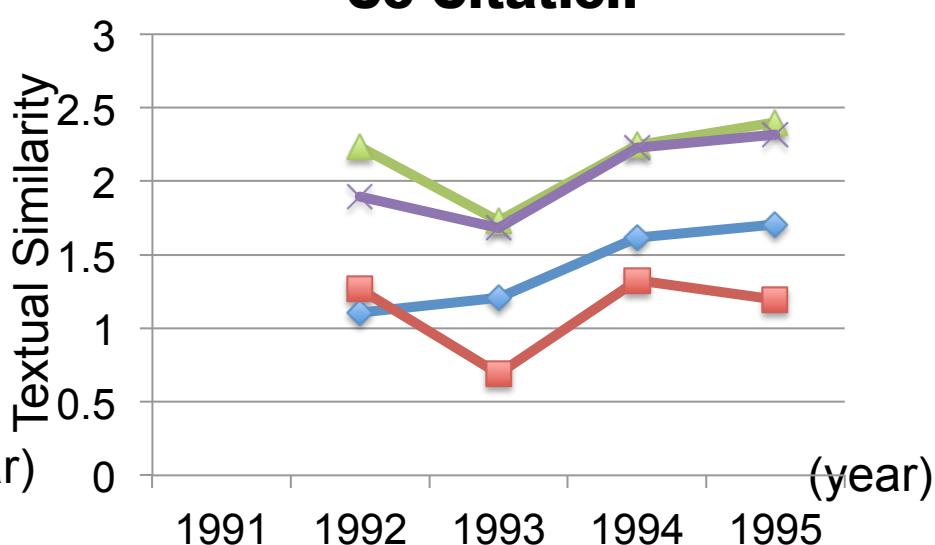
Textual Similarity

(B) IIJIMA, S, 1991, NATURE, V354, P56

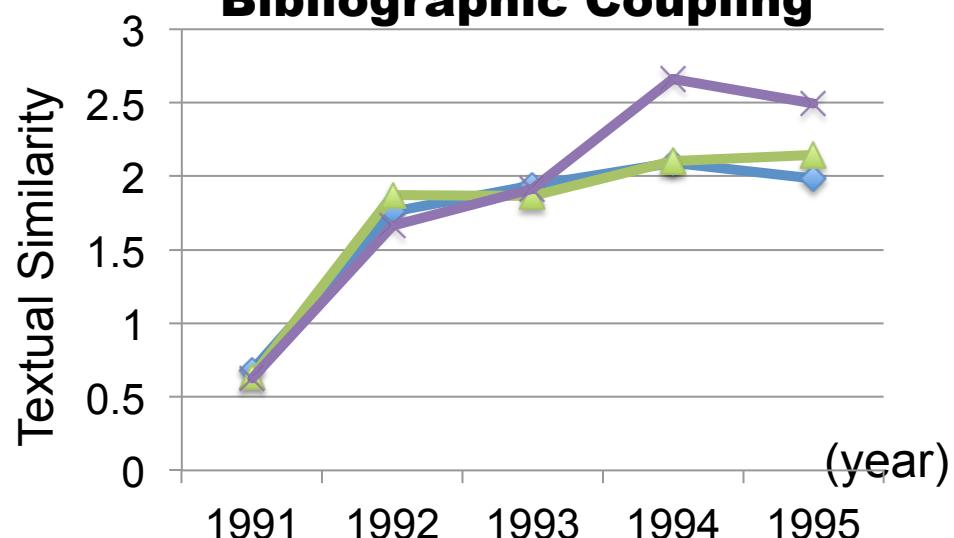
Direct Citation



Co-Citation



Bibliographic Coupling



- (i) Frequency of citations
- (ii) Publication Years
- (iii) Reference Similarity
- (iv) Keyword Similarity

Discussion

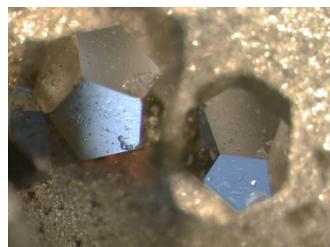
- “(i) Frequency of citation” is **higher performance** in all metrics when the types of citations are co-citation and bibliographic coupling
 - The frequency of citation is effective to find the emerging fronts
- “(ii) Difference of publication year” shows the **worst** results regarding as the average publication year
 - It divides the too small clusters
 - The functions based on the Difference of publication year should be improved
- “(iii) Reference Similarity” and “(iv) Keyword Similarity” are effective to divide **the accurate clusters**
 - The weights based on the references and keywords help dividing the accurate clusters
 - Reference information helps dividing the topological accurate clusters
 - Keywords of papers help dividing the textual accurate clusters

Early Detection of Emerging Research Fronts

Quasi-crystal (the 2011 Nobel Prize in Chemistry)



Photo: U. Montan
Dan Shechtman



quasi-crystal
(Tsai Lab., Tohoku Univ.)

- Published Year: 1984
- Cited Count: 3,402
- History of quasi-crystal's discovery
 - Quasi-crystal is discovered in 1982.
 - His discovery was not understood by his boss., and he lost his job.
 - In 1983, He got a job of Israel Institute of Technology.
 - In 1984, he and his colleagues submitted a paper into *Journal of Applied Physics*, but it was rejected by editor.
 - In 1984, they submitted it into *Physical Review Letters*, and it was accepted.

This emerging research was not acknowledged at its initial stage.

TABLE II
The Growth of the Citation Network (N/F = Node / Facet, E/N = Edge / Node)

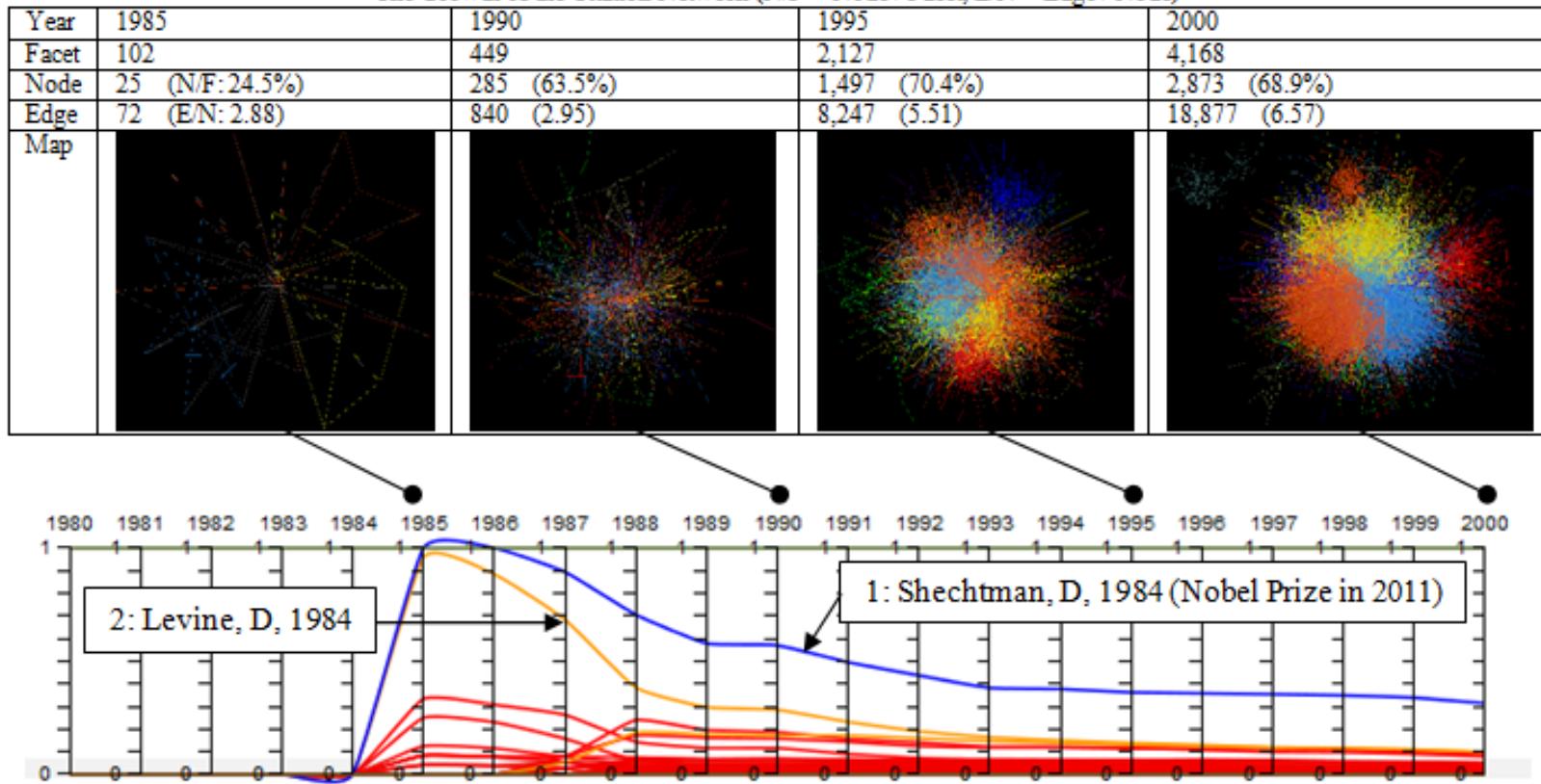


Fig. 2. Time Transition about in-Degree Centralities of 311 Papers Published in 1981-1990

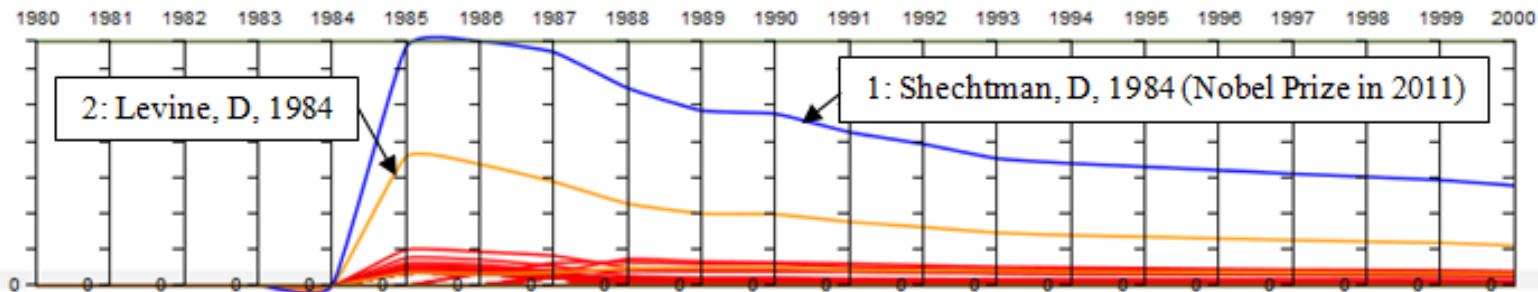


Fig. 3. Time Transition about PageRank of 311 Papers Published in 1981-1990

Early Detection of Emerging Research Fronts

Fluorescent Protein (the 2008 Nobel Prize in Chemistry)

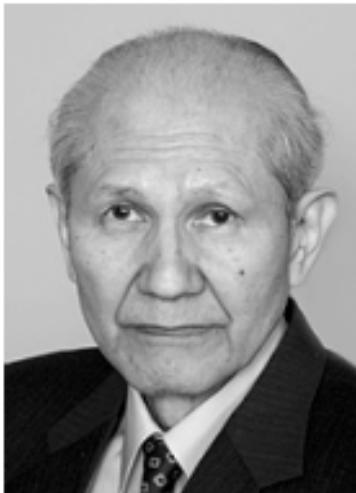


Photo: U. Montan
Osamu Shimomura

- Published Year: 1962
- Cited Count: 861
- He discovered GFP as a by-product.



Photo: U. Montan
Martin Chalfie

- Published Year: 1994
- Cited Count: 3,627
- He inserted GFPs into other creatures.



Photo: U. Montan
Roger Y. Tsien

- Published Year: 1998
- Cited Count: 2,761
- He developed various colored fluorescent

People do not notice this emerging research during 30 years.
The emerging research have less citations than others.



Aequorea victoria
(Jellyfish)
[Photo by Sierra Blakely](#)

GFPs are extracted



GFPs are inserted into other creatures.

[Credit: Mayo Clinic](#)

Early Detection of Emerging Research Fronts

Fluorescent Protein (the 2008 Nobel Prize in Chemistry)

Cited count within the dataset(Reference)

Chalfie, 1994

Tsien, 1998

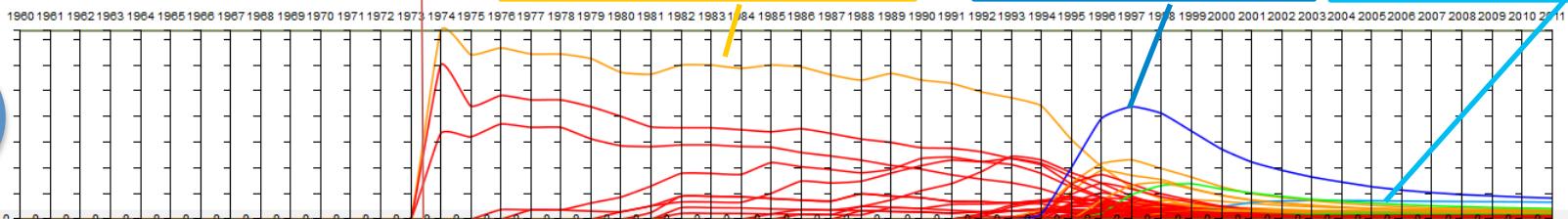


in-Degree Centrality

Shimomura, 1962

Chalfie, 1994

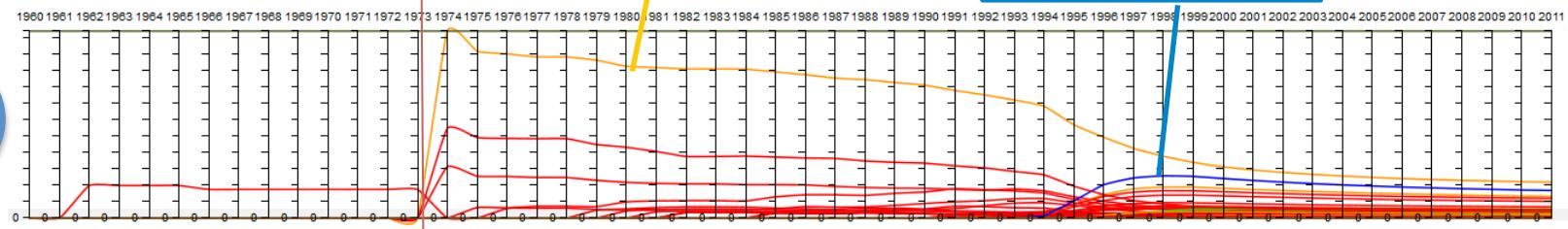
Tsien, 1998

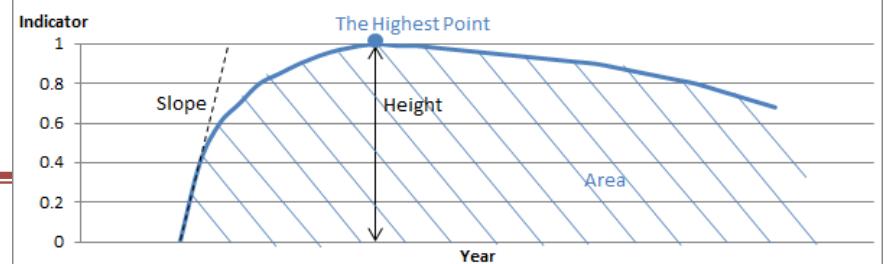


PageRank

Shimomura, 1962

Chalfie, 1994





gfp (1,967 papers)

Upper!

Shimomura, 1962

Chalfie, 1994

Tsien, 1998

In-Degree
Centrality

10th

PageRank

10th

Number
of Citation
10th

In-Degree Centrality

Rank	1st Author	PY	Height	Rank	1st Author	PY	Area	Rank	1st Author	PY	Slope	Rank	1st Author	PY	SlopeAve
1	SHIMOMURA, O	1962	0.7555	1	SHIMOMURA, O	1962	15.2242	1	SHIMOMURA, O	1962	0.7555	1	HEIM, R	1994	49.6667
2	SHIMOMURA, O	1965	0.6000	2	SHIMOMURA, O	1965	7.0012	2	SHIMOMURA, O	1965	0.6000	2	Patterson, OH	1997	25.8855
3	CHALFIE, M	1994	0.4580	5	SHIMOMURA, O	1969	5.7045	4	CHALFIE, M	1994	-0.1911	5	SHEEN, J	1998	12.8714
4	SHIMOMURA, O	1969	0.5704	4	CHALFIE, M	1994	5.4029	5	WANG, BX	1994	0.1500	6	DELAGRAVE, S	1998	12.0667
5	INOUE, S	1985	0.2441	5	ELINKER, JR	1976	5.2959	6	HEIM, R	1994	0.1084	6	SHIMOMURA, O	1962	11.5056
6	ELINKER, JR	1976	0.2414	6	SHIMOMURA, O	1975	2.7550	7	FRASHER, DO	1992	0.1011	7	Gardes, HH	1998	9.6925
7	SHIMOMURA, O	1978	0.2562	7	INOUE, S	1985	1.7408	8	FRASHER, DO	1992	0.0736	8	Ogawa, H	1998	9.3714
8	FRASHER, DO	1992	0.2309	8	FRASHER, DO	1992	1.7584	9	Uebitt, AB	1995	0.0712	9	Biagi, MB	1997	7.9167
9	HEIM, R	1994	0.1900	9	WARD, WW	1980	1.4662	10	Cormack, EP	1996	0.0712	10	Cheng, LZ	1998	6.8462
10	WANG, BX	1994	0.1754	10	SHIMOMURA, O	1979	1.4048	11	WUDY, CW	1995	0.0701	11	Amsterdam, A	1998	6.7145
21	Tsien, RY	1998	0.0724	11	SHIMOMURA, O	1962	0.8589	*	Tsien, RY	1998	0.0289	22	CHALFIE, M	1994	0.1861
				12	Tsien, RY	1998	0.8589	*	Tsien, RY	1998	0.0158	23	Tsien, RY	1998	0.0158

PageRank

Rank	1st Author	PY	Height	Rank	1st Author	PY	Area	Rank	1st Author	PY	Slope	Rank	1st Author	PY	SlopeAve
1	SHIMOMURA, O	1962	0.2216	1	SHIMOMURA, O	1962	4.7741	1	SHIMOMURA, O	1962	0.2276	1	SHIMOMURA, O	1962	11.5086
2	SHIMOMURA, O	1965	0.1092	2	SHIMOMURA, O	1965	1.8784	2	SHIMOMURA, O	1965	0.1092	2	Biagi, MB	1997	7.9167
3	SHIMOMURA, O	1969	0.0625	5	SHIMOMURA, O	1969	1.0662	5	SHIMOMURA, O	1969	0.0625	5	Stuber, RH	1998	5.6564
4	CHALFIE, M	1994	0.0818	4	CHALFIE, M	1994	0.6874	4	STEINER, RF	1992	0.0596	6	Oparks, KJ	1997	5.5000
5	STEINER, RF	1992	0.0598	5	SHIMOMURA, O	1979	0.6417	5	CHALFIE, M	1994	0.0197	5	Burke, NV	1997	5.2727
6	FRASHER, DO	1992	0.0577	6	ELINKER, JR	1976	0.6144	6	SHIMOMURA, O	1975	0.0118	6	WARD, WW	1982	4.0786
7	ELINKER, JR	1976	0.0556	7	FRASHER, DO	1992	0.5504	7	FRASHER, DO	1992	0.0127	7	OLSON, KR	1998	4.5000
8	SHIMOMURA, O	1979	0.0555	8	WARD, WW	1980	0.5258	8	ELINKER, JR	1976	0.0118	8	BRINI, M	1998	4.4000
9	WARD, WW	1980	0.0279	9	STEINER, RF	1992	0.4571	9	SHIMOMURA, O	1979	0.0097	9	MONTERO, M	1998	4.1429
10	SHIMOMURA, O	1988	0.0251	10	SHIMOMURA, O	1978	0.5620	10	WARD, WW	1980	-0.0087	10	Klein, RL	1998	4.0000
21	Tsien, RY	1998	0.0049	22	Tsien, RY	1998	0.0485	23	Tsien, RY	1998	0.0000	24	CHALFIE, M	1994	0.0155
				25	Tsien, RY	1998	0.0485	*	Tsien, RY	1998	0.0000	26	Tsien, RY	1998	0.0004

Number of Citation

Rank	1st Author	PY	Height	Rank	1st Author	PY	Area	Rank	1st Author	PY	Slope	Rank	1st Author	PY	SlopeAve
1	CHALFIE, M	1994	2571	1	CHALFIE, M	1994	22918	1	CHALFIE, M	1994	261	1	Tsien, RY	1998	147
2	Tsien, RY	1998	1899	2	Tsien, RY	1998	12740	2	Tsien, RY	1998	165	2	CHALFIE, M	1994	141
5	Cormack, EP	1996	1116	5	Cormack, EP	1996	10804	5	Shaner, NO	2004	185	5	Shaner, NO	2004	125
4	FRASHER, DO	1992	1028	4	FRASHER, DO	1992	10116	4	Cormack, EP	1996	181	4	Campbell, RE	2002	84
5	Orno, M	1996	949	6	HEIM, R	1994	7819	5	FRASHER, DO	1992	124	5	Cormack, EP	1996	81
6	HEIM, R	1994	820	6	Orno, M	1996	7500	6	Campbell, RE	2002	115	6	Shaner, NO	2006	70
7	Shaner, NO	2004	772	7	QUBITT, AB	1995	7285	7	Shaner, NO	2006	94	7	Orno, M	1996	64
8	Campbell, RE	2002	757	8	Miyawaki, A	1997	6591	8	Nagai, T	2002	90	8	Matz, MV	1999	61
9	Miyawaki, A	1997	718	9	Yang, F	1996	5569	9	QUBITT, AB	1995	89	9	FRASHER, DO	1992	58
10	Matz, MV	1999	718	10	Gramsci, A	1996	4650	10	Orno, M	1996	85	10	Nagai, T	2002	58
17	SHIMOMURA, O	1962	469	12	SHIMOMURA, O	1962	4547	16	SHIMOMURA, O	1962	88	159	SHIMOMURA, O	1962	11

Height

Area

Slope

SlopeAve

Academic and Technological Landscape System

- New Energy and Industrial Technology Development Organization (NEDO) funded project (FY2013-FY2017)
- Developing Scientific and Technological Landscape System
 - Detecting emerging researches
 - automatically detects rapidly growing technologies in the near future (emerging research)
 - Detecting related researches
 - Automatically detects complementary technologies to the emerging research (related research)
 - Detecting leading researchers and groups
 - Automatically detects researchers and their groups in the emerging research
- The system contributes to planning and executing a research and development strategy of both public and private sectors

Project Overview

③ User study and Evaluation

Users
Policy makers
R&D

②

Web-based System

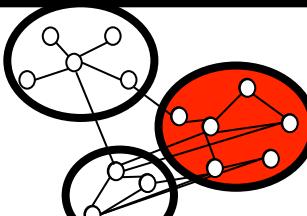


Intuitive Interface

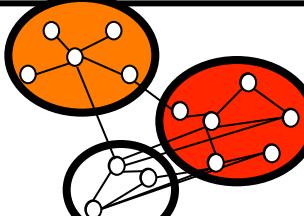
Leading researchers
and groups



Emerging researches



Related researches

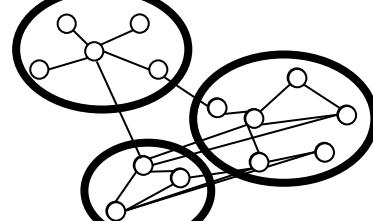
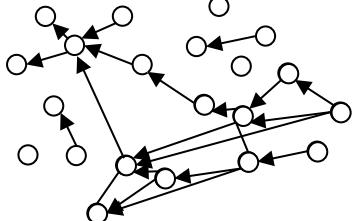


Prediction models

Prediction models

Prediction models

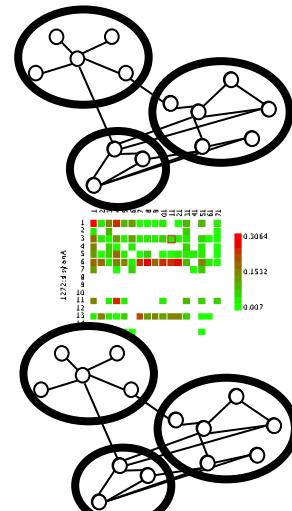
Current Academic Landscape System



Features

- Network-based
- Text-based
- Time series

Relation mining



Academic Paper
Database

Patent Database



Innovation system at the global frontiers

