

## Knowledge emergence in scientific communication: from “fullerenes” to “nanotubes”

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This article explores the emergence of knowledge from scientific discoveries and their effects on the structure of scientific communication. Network analysis is applied to understand this emergence institutionally as changes in the journals; semantically as changes in the codification of meaning in terms of words; and cognitively as the new knowledge becomes the emergent foundation of further developments. The discovery of fullerenes in 1985 is analyzed as the scientific discovery that triggered a process which led to research in nanotubes.

### Introduction

New frontiers of scientific research provide us with one of the best environments to explore the process of knowledge production from the perspective of scientific communication and its diffusion to other societal domains. This paper addresses questions such as how existing knowledge converges into new discoveries, how these discoveries are transmitted through scientific communication, and how they become knowledge (meaningful information) that gives way to new scientific developments and discoveries. Time-dependent analysis is required to understand this transition from information to meaningful information to knowledge.

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Development of nanoscale research and the attention it has captured due to its potential applications and implications suggest a case for the study of the dynamics inherent to the emergence and consolidation of research fronts. In nanoscience, fields of research like chemistry, physics, computer science, and biology, merge strongly to study nanometer<sup>1</sup> scale structures (equivalent in size to materials in the range from hundreds to tens of nanometers in size) and their properties.

Although research at the nanoscale can be dated back to the 19<sup>th</sup> century with the appearance of colloidal and surface science, it was not until the invention of high-resolution electron microscopes, particularly the Scanning Tunneling Microscope, that research at this level could be subject of scientometric study because a field could increasingly be distinguished. In 1997 the rate of growth of scientific journal papers with the prefix “nano” in their titles was exponentially doubling over time (BRAUN et al., 1997 and MEYER et al., 1998). Increased attention of science and technology policies for “nano” since 2000 encouraged the continuity of this exponential growth (SCHUMMER, 2004). Scientometric studies of the field have grown accordingly.

In this study, the focus will be on research in “fullerenes” and the fullerene-like structures “nanotubes”. This field of research originated after the discovery of fullerenes in 1985 from the study of properties of carbon molecules, especially the C<sub>60</sub> molecule. Research about “fullerenes” can be recognized as a significant research front of nanoscience, having developed its own terminology beyond the usage of the prefix “nano” (SCHUMMER, 2004). A series of events can be placed along the “evolution” of this research front: a Nobel Prize was awarded for the discovery of fullerene in 1996; the first issue of the journal *Fullerene Science and Technology* was published in 1993; the change of the name of this journal in 2002 to *Fullerenes, Nanotubes, and Carbon Nanostructures*; and the discovery in 1991 of cylindrical one-dimensional fullerenes, later named carbon nanotubes, with potential uses in very diverse areas such as disease treatment, computer memory, methods of drug delivery, cosmetics, alternative uses of energy, etc.

### On scientific communication

New knowledge can be considered as codification of communication that disrupts the state of the art of existing knowledge. In this paper, emphasis on scientific communication will be made to track emergence of knowledge generated from new scientific discoveries. By concentrating on scientific texts knowledge production can be made the subject of measurement considering the organizational, textual and cognitive dimensions of scientific developments (LEYDESDORFF, 1995). Knowledge production is structurally coupled to the circulation of texts (FUJIGAKI, 1998). These texts are:

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<sup>1</sup> Nanometer = 10<sup>-9</sup> meters = a billionth of a meter

(a) institutionally arranged in scientific journals produced by individuals affiliated to institutions and organizations, (b) semantically structured to carry meaning, and (c) cognitively associated to the existing body of knowledge through links formed by citations (*Ibid.*).

Producing and publishing scientific texts is one of the main activities of scientists. Peer reviewing of produced texts before accepting them for publishing validates the scientists' work. Issues related to money allocation, prestige, and a scientist's field of work can also be defined in relation to the output of publications. Through publishing, scientists select validated knowledge and differentiate their own results and conclusions to submit them for further validation. This is a continuous process triggered by its own self-referentiality as a process. The recursive process of selections and codifications carries the development of knowledge (FUJIGAKI, 1998).

Journals aggregate validated scientific knowledge represented in texts. Journals can be constituted where the codes of communication that the scientists use for communicating their results can be stabilized (LEYDESDORFF, 2007). These codes are further differentiated and respond to characteristics such as field or topic specificity, country or language. Aggregation of these differentiated codes of communication forms the journal space. One can expect that the differentiation can only be reproduced if it is also functional for the further development of knowledge.

Different journals are related in the journal space through a network of cited and citing relations. New discoveries generate new meaning that can irritate and change this network. These changes may imply the emergence of a new scientific journal that specializes in the communication generated by the discovery and its consequent knowledge or – if less fundamental – it can be absorbed in existing structures.

Variation generated by new discoveries can be measured through a change in the state of relations in the journal space. However, because knowledge is a semantic (and social) construct, variation from new discoveries can also be measured in relation to changes in the semantic representation of the social construction of knowledge.

Knowledge emerges semantically in a network of relations among words selected to carry meaning (LEYDESDORFF & HELLSTEN, 2005). This process of selection generates a network-structure of co-words where the position of the words is defined by the presence and absence of relations among them (HESSE, 1980; BURT, 1982). Thus, meaning and knowledge are intrinsic characteristics of the network: while meaning is easily measurable in the specific configuration of the network, knowledge requires a further analysis considering the time axis. Knowledge is a further codification of meaning. Meaning is information which is already codified.

These codifications depend on the purpose of the communication; meaning can be asymmetrically codified across domains. These asymmetries are caused by the different interpretations of meaning carried by words and co-occurrences of words across domains (LEYDESDORFF & HELLSTEN, 2005). In this study, the emergence of

knowledge originating from a discovery will be considered as (a) variation in the codes of scientific communication, (b) variation in the semantic structure of knowledge representations at different moments in time, and (c) further codification of the potentially serendipitous<sup>2</sup> discovery from previously constructed knowledge. An analysis of the codification in patents will be briefly presented as an expansion into knowledge-based applications assuming that these are a consequence of the knowledge constructed through scientific communications.

Our interest particularly resides in the question of how the codification of meaning changes with time resulting in changes in the communication structures and how different meaning codifications outlay the emergence of new knowledge that builds on but differentiates from the existing body of knowledge.

### Methodology

To understand structural changes derived from the emergence of new knowledge we use methods from network analysis at various levels: (a) to track changes in the network of relations of journals, (b) to measure changes of meaning through changes in the relations of words at different times and in different domains (patents), and (c) to understand the construction of knowledge as a process of selecting and differentiating from previous knowledge.

#### *Journals*

The journal space (that is, the aggregation of publications in scientific journals) defines a cognitive structure that differs from other journal spaces and contextualizes papers belonging to it (COZZENS, 1985). Network analysis allows us to pinpoint journal spaces by assuming that the citation relations are cognitive relations as well (AMSTERDAMSKA & LEYDESDORFF, 1989). A journal space is composed of journals that have citation relations between them.

Definition of the journal space allows limiting the environment of a specific journal identifying the journals from which it “feeds”. The delineation of the environment of a journal is a relational problem that will be addressed considering the relevant environment in the overall database of citations taken from the *Journal Citation Reports* of the Science Citation Index. The mapping can be complemented with a factor analysis approach in order to outlay the position of the journal in a network of relations and its underlying dimensions (LEYDESDORFF & COZZENS, 1993).

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<sup>2</sup> Carbon nanotubes were discovered by Sumio Iijima, who refers to this finding as a serendipitous result of research in fullerenes.

For the special case of fullerenes research, the appearance of the journal *Fullerene Science and Technology* can be considered as an important breakthrough, since the journal specialized in scientific communication related to fullerene issues. The journal's environment was delineated by considering all citations to and from this journal. The citation environment of this journal will be studied for the years 1996 (the first year in which it appeared in the *Journal Citation Reports*) and 2004 in order to consider changes in the construction of boundaries.

Normalization using the cosine as proposed by SALTON & MCGILL (1983) will be applied to the journals environment defined by the matrix of citation relations. Visualizations are optimized using the algorithm of KAMADA & KAWAI (1989).

#### *Codification of meaning in time and space*

The study of scientific developments through the network of relations among words in texts has already been proposed by HESSE (1980) and CALLON et al. (1986). In actor-network theory, the strength of the relations of co-words depends on the network of associations that form its context (THEIL & LATOUR, 1995). The semantic maps in this study, however, are not derived from the relations between two specific words but among any number of words in a set of titles. For this, the asymmetric matrix of words versus the retrieved titles of documents was used. The relations were normalized using the cosine among word vectors as proposed by SALTON & MCGILL (1983). This provides us with spatial representations of how words are positioned in relation to other words.

Two different sources of information were considered to track changes of meaning in domains: the Science Citation Index (SCI) as available in the so-called Web of Science (at <http://scientific.thomson.com/products/wos/>); and the patents search facility made available by the United States Patent Office (USPTO) (<http://www.uspto.gov/patft/>). In both databases, records that matched the criteria “fullerene” (or “fullerenes”) and “nanotube” (or “nanotubes”) as title words were retrieved until and including 2005.

The study of the influence of time in the codification of meaning is explored only for scientific communication (i.e., the SCI) because the sets retrieved from the USPTO are too small for this purpose. Given that time is not relevant if it is not related to a series of events that may introduce variation to the codification of meaning, the number of published documents was considered as the clock-time. Initially, the analysis was made with pragmatic cut-offs for every 1,000 documents, but for the purpose of this paper, three different moments for each set were selected with equal distances in terms of numbers of events, that is, each 2,563 documents in the case of fullerene(s), and 3,224 documents in the case of nanotubes(s).

The asymmetric matrix of words versus titles was obtained using Tl.exe (at: <http://www.leydesdorff.net/software.htm>) that generates a word-occurrence matrix, and

a normalized co-occurrence matrix from a set of titles and a word list. The matrices were then read using the software package for network analysis PAJEK (at: <http://vlado.fmf.uni-lj.si/pub/networks/pajek/>). All the visualizations will be based on the algorithm of KAMADA & KAWAI (1989), present in PAJEK. For the sets retrieved from the SCI only words that occur more than 20 times, will be considered and the cosine is set at  $\geq 0.2$  in order to optimize the visualizations. For the case of the patents titles, all words occurring more than two times are used and the visualizations are optimized using only the cosine-normalized relations stronger than 0.3.

### *Citations*

In this paper we use citation analysis to delineate the environment of a journal, as explained previously. Citations inside the set of documents retrieved are also interesting as they can be used to track the history of the development of knowledge embedded in them.

Citation relations do not always represent the scientist's use of results previously achieved. Nevertheless, through citations scientists link their work to the existing literature generating a network structure that can be used to re-write the history of scientific developments (GARFIELD, 1973).

Citation behaviors distinguish two different types of scientific literature: classic literature that have high citation rates independently of their age; and transient literature that becomes obsolete short after their publication and loses citing importance (CHEN, 2006). In the first case, the literature belongs to the validated knowledge-base while the second type of literature is typical of the rapidly changing dynamics of the research fronts (*Ibid.*).

For analyzing the citing relations inside our set of documents, the software package *HistCite*<sup>TM</sup> (<http://www.histcite.com/>) was used. *HistCite* allows to build citation histograms considering the retrieved documents from the SCI. The documents are represented by nodes, displayed historically and their size depends on the amount of citations it gets inside the set.

## **Results**

For the case of fullerene, a search in the SCI retrieved 7,696 documents with “fullerene(s)” in their titles. The first document of the set was published in *Nature* by Harold W. Kroto, one of the three scientists awarded with the Nobel Prize for the discovery of fullerenes in 1996. This document was titled: “The Stability of the Fullerenes C-24, C-28, C-32, C-36, C-50, C-60 and C-70” (KROTO, 1987). Of the total set of documents, 84% were articles, 5% meeting abstracts, and 11% either reviews, letters, notes or editorial matter. For the second case, 9,672 documents were downloaded from the SCI with “nanotube(s)” in their title; 87% of them were scientific

articles. The earliest document was entitled “Large Scale Synthesis of Carbon Nanotubes” (EBBESEN, et al., 1992) and published in *Nature*.

The evolution of research in fullerenes is depicted in Figure 1 as the annual growth of documents having “fullerene(s)” or “nanotube(s)” as words in their titles. Notable events such as the emergence of the journal, the Nobel Prize awarded to Harold W. Kroto, Richard E. Smalley and Robert F. Curl Jr. for the discovery of fullerenes, and the discovery of the one-dimensional fullerenes, that were named carbon nanotubes, are also represented in this figure.

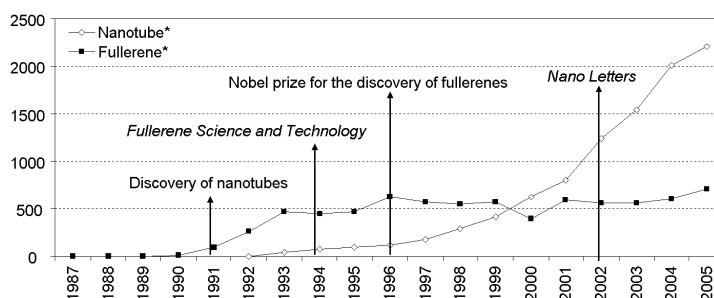


Figure 1. Number of documents in the SCI with “fullerene” and “nanotube” in their titles over time.

### Journal differentiation

The system of scientific communication is highly differentiated; it achieves organization through the functional differentiation of journals that allow the communication of more complexity (COZZENS & LEYDESDORFF, 1993). Journals are positioned in the journal space in accordance to the relations they have with other journals; this positioning allows the delineation of scientific specialties as clusters of scientific journals. New discoveries produce variation that disrupts the organization of scientific communication. For example, the emergence of a new journal can respond to specialization of the communication because of the emergence of new research fronts.

Although for both sets of documents – those retrieved with “fullerene(s)” and those with “nanotube(s)” in their title – the distribution in traditional chemistry and physics journals is similar to those found in other studies about nanoscience research (MEYER & PERSSON, 1998), a significant number of the documents containing “fullerene(s)” in their title words is published in *Fullerene Science and Technology*. In Figure 2, the distribution of the journals publishing the 7,696 documents retrieved for “fullerene(s)” in their title is shown. Although *Chemical Physics Letter* published more documents,

the share of fullerene-related articles in each journal is highest for *Fullerene Science and Technology* (72% of the total number of articles).

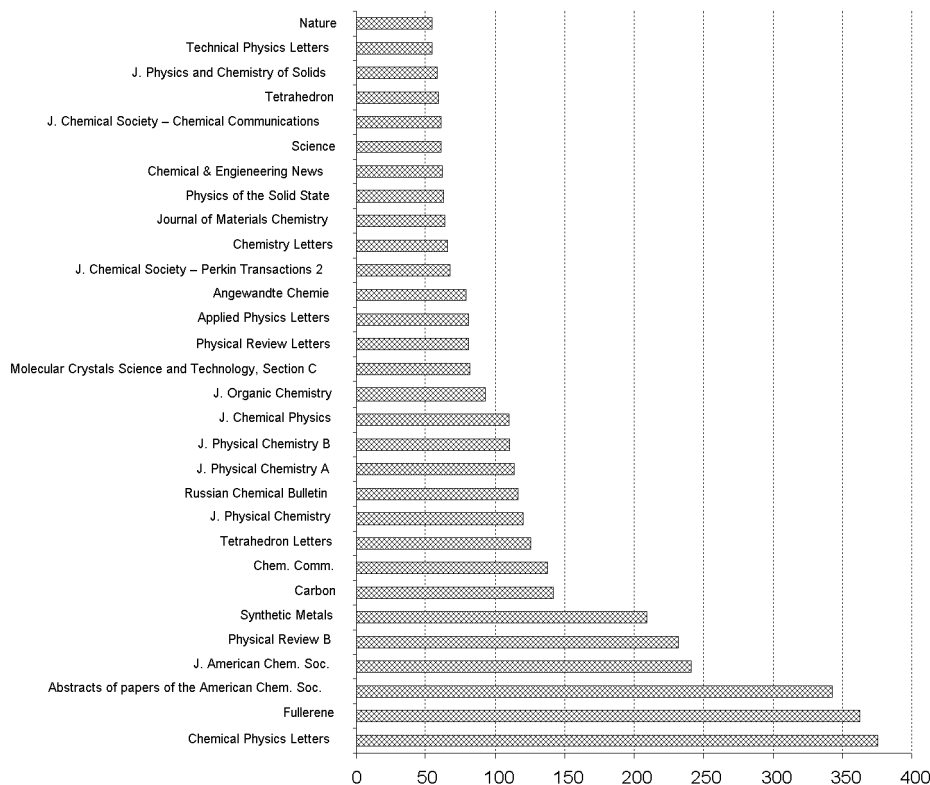


Figure 2. Distribution of fullerene-related documents in journals, 1987–2005

*Fullerene Science and Technology* changed its name in 2002 into *Fullerenes, Nanotubes, and Carbon Nanostructures*. This journal has published 840 documents of which 92% are classified as scientific articles.

In Figure 3, the evolution of the number of documents published in the journal is shown. Although it is not a high number of documents and, as will be seen further, it is not highly-cited, the constitution of the journal can be considered as very important in the organization of communication in the field. Further analysis of the journal’s contents and authors could give more insight on the importance of the emergence of the journal as self-organization of the communication in the nano-field.



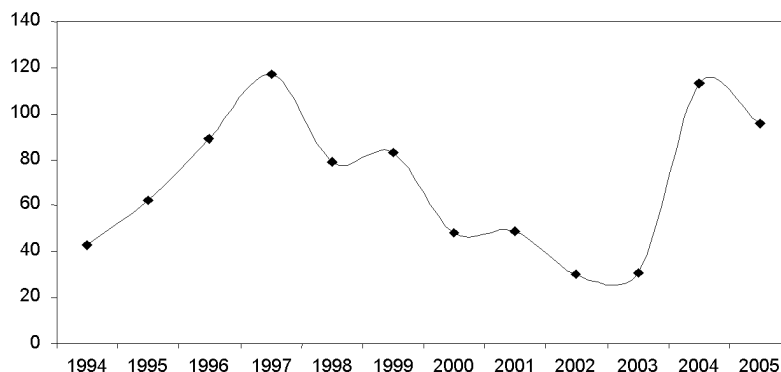


Figure 3. Number of documents in the journal *Fullerene Science and Technology* (since 2002: *Fullerenes, Nanotubes, and Carbon Nanostructures*).

Two different network approaches can be applied to the position of a journal in a set of citations to other journals. The first analysis uses the cited journals to understand the position of a specific journal among a series of established cognitive structures. For this specific case, an analysis of the journals cited in *Fullerene Science and Technology* is first presented in 1996, the year in which the journal appears for the first time in the *Journal Citation Reports*. This result is analyzed similarly to the environment for the year 2004 in order to illustrate changes in its boundaries ten years after its constitution. The second analysis uses the other journals citing *Fullerenes, Nanotubes, and Carbon Nanostructures* for the year 2004 when the definition of the journal's boundaries is already set.

For the year 1996, the matrix representing the citation environment of *Fullerene Science and Technology* consisted of 18 cited journals. The factor analysis of this citation environment is shown in Table 1.

Table 1 shows the organization of the 18 journals which cite *Fullerene Science and Technology* in 1996, in four dimensions explaining 49.2% of the variance. The first three components are physics, physical chemistry, and organic chemistry. *Fullerene Science and Technology* has low or negative loadings on these factors, but leads a fourth factor as a separate grouping. *Transition Metal Chemistry* is also attributed to this group. In Figure 4, the citation environment just discussed with a factor analytical approach is visualized.

Table 1. Factor structure among 18 journals citing *Fullerene Science and Technology* in 1996  
Rotated Component Matrix<sup>a</sup>

	Component			
	1	2	3	4
PHYS REV B	0.948			
SOLID STATE COMMUN	0.947			
APPL PHYS A-MATER	0.879		-0.102	0.113
JPN J APPL PHYS	0.308	-0.241	-0.180	0.284
CARCINOGENESIS	-0.210	-0.188	-0.105	0.167
CHEM PHYS LETT		0.920		
J PHYS CHEM-US		0.906		0.105
INT J QUANTUM CHEM		0.814		
CROAT CHEM ACTA	-0.172	0.284		
B SOC CHIM BELG			0.899	
J ORG CHEM			0.876	
<b>FULLERENE SCI TECHN</b>		<b>-0.116</b>	<b>-0.119</b>	<b>-0.806</b>
TRANSIT METAL CHEM				-0.664
J CRYST GROWTH		-0.253	-0.151	0.349
J ELECTROANAL CHEM	-0.151	0.227		0.266
SYNTHETIC MET	0.219	0.113		0.251
J PHYS B-AT MOL OPT			-0.174	-0.219
CHEM VAPOR DEPOS	-0.191		-0.129	0.206

Extraction Method: Principal Component Analysis.

Rotation Method: Varimax with Kaiser Normalization.

<sup>a</sup> Rotation converged in 6 iterations.

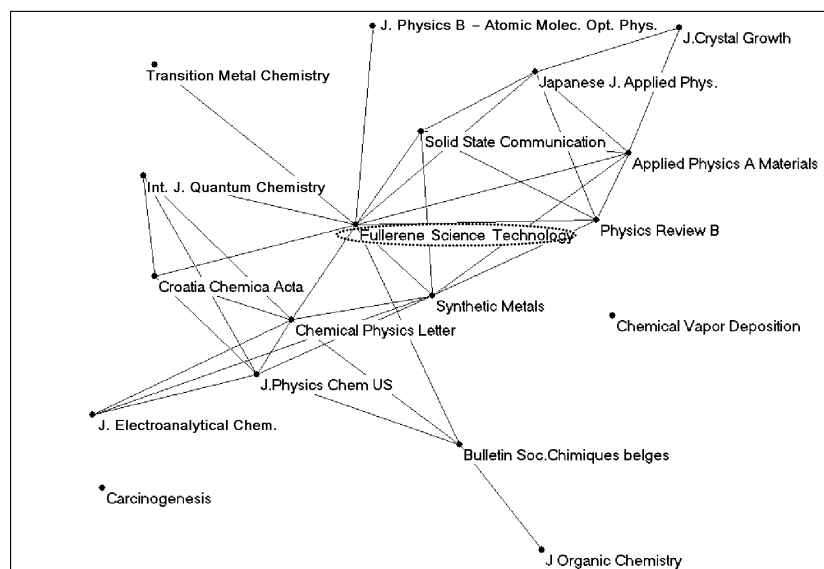


Figure 4. Eighteen journals citing *Fullerene Science and Technology* in 1996 (cosine  $\geq 0.2$ )

The same exercise was repeated for 2004 in order to illustrate possible changes in the disciplinary foundations of fullerene-related research. In 2004, *Fullerenes, Nanotubes, and Carbon Nanostructures* is cited by only 14 other journals.

In 2004, four factors explain 52.4% of the variance in the matrix. The physics environment has disappeared. *Fullerenes, Nanotubes, and Carbon Nanostructures* forms a fourth factor with the journal *Carbon*. It is worth considering that from 2001 to 2003 the total number of documents published in the journal revealed a strong descent (see Figure 3) that influenced the overall cited environment of the journal.

Table 2. Factor structure among 14 journals citing *Fullerenes, Nanotubes, and Carbon Nanostructures* in 2004 (Rotated Component Matrix<sup>a</sup>)

	Component			
	1	2	3	4
CHEM PHYS LETT	0.900			
CHEM PHYS	0.876		-0.110	
PHYS CHEM CHEM PHYS	0.826			
J PHYS CHEM B	0.805		0.163	
TETRAHEDRON	-0.144	0.762	0.118	-0.116
J FLUORINE CHEM	-0.180	0.640	-0.207	0.116
ANGEW CHEM INT EDIT		0.551	0.367	-0.324
RUSS J INORG CHEM+	-0.265	-0.307	0.162	
RADIAT PHYS CHEM		-0.135	-0.604	-0.140
POLYHEDRON	-0.221	-0.230	0.603	-0.107
J MATER CHEM	0.390		0.499	
ORIGINS LIFE EVOL B	-0.180	-0.244	-0.179	-0.666
<b>FULLER NANOTUB CAR N</b>		<b>-0.202</b>		<b>0.566</b>
CARBON				0.523

Extraction Method: Principal Component Analysis.

Rotation Method: Varimax with Kaiser Normalization.

<sup>a</sup> Rotation converged in 6 iterations.

Figure 5 visualizes the citation environment that was factor analyzed in Table 2 on the basis of the cosine as the similarity measure. This visualization shows that a strong component of the graph is formed by six journals in the field of physical chemistry and materials chemistry. *Fullerenes, Nanotubes, and Carbon Nanostructures* is one of these six journals.

It is also important to consider how authors in the journal *Fullerenes, Nanotubes, and Carbon Nanostructures* see the environments when citing other journals. The previous exercise for the journals citing *Fullerenes, Nanotubes, and Carbon Nanostructures* was also done for the journals cited by it in 2004. These are 95 journals. Fifteen journals are cited to the extent of more than one percent of the total number of 1,122 references provided by 104 articles published in this journal in 2004 (HE & PAO, 1986; LEYDESDORFF & COZZENS, 1993).

Table 3 shows that for 2004, the 15 journals cited by *Fullerenes, Nanotubes, and Carbon Nanostructures* organized in four dimensions. These four dimensions explain

75.7% of the variance. The “self-”references within the journal correlate highly with the references to papers in *Chemical Physics Letters* and *Carbon*. These three journals load on a third factor which explains 13.2% of the variance. Unlike the relevant citation environment, authors publishing in these journals relate to a physics factor (17.1%) which is the second one when compared with a chemistry factor (35.8%).

Table 3. Factor structure among 15 journals cited by *Fullerenes, Nanotubes, and Carbon Nanostructures*, 2004 (Rotated Component Matrix<sup>a</sup>)

	Component			
	1	2	3	4
CHEM COMMUN	0.912	-0.204		
J AM CHEM SOC	0.888		0.273	
J ORG CHEM	0.872	-0.176	-0.115	-0.172
ANGEW CHEM INT EDIT	0.816	-0.158		
RUSS CHEM B+	0.787	-0.252		-0.210
TETRAHEDRON LETT	0.756	-0.192	-0.264	-0.208
PHYS REV B	-0.119	0.892	0.246	
PHYS REV LETT	-0.114	0.788	0.193	0.184
PHYS SOLID STATE+	-0.241	0.776		-0.170
APPL PHYS LETT	-0.221	0.528		
<b>FULLER NANOTUB CAR N</b>		<b>0.197</b>	<b>0.931</b>	
CHEM PHYS LETT	0.136	0.214	0.846	
CARBON	-0.431	-0.251	0.486	
SCIENCE				0.959
NATURE	-0.105			0.941

Extraction Method: Principal Component Analysis.

Rotation Method: Varimax with Kaiser Normalization.

<sup>a</sup> Rotation converged in 6 iterations.

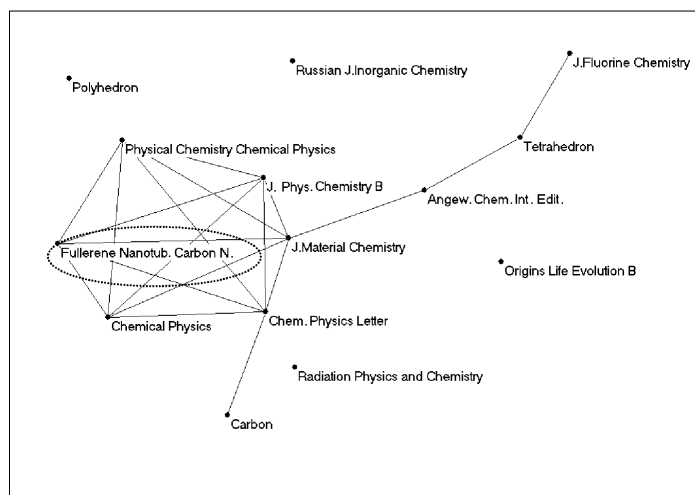


Figure 5. Fourteen journals citing *Fullerenes, Nanotubes, and Carbon Nanostructures*, 2004 (cosine  $\geq 0.2$ )

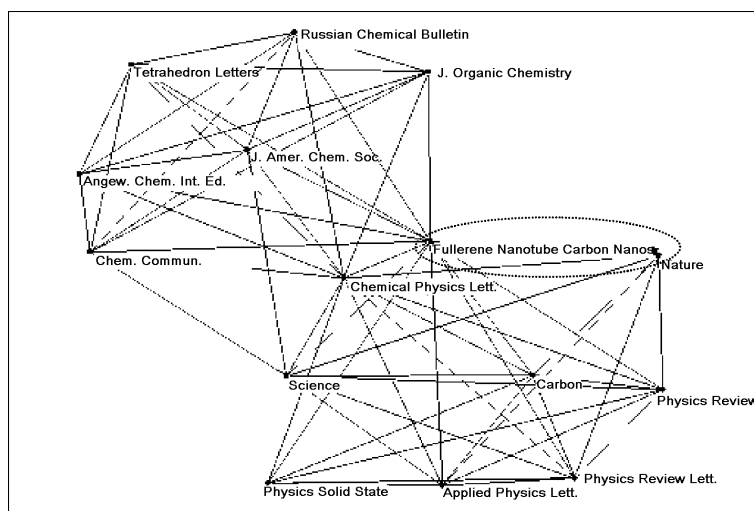


Figure 6. Fifteen journals cited within articles in *Fullerenes, Nanotubes, and Carbon Nanostructures* in 2004 (cosine  $\geq 0.2$ ).

*Nature* and *Science*, with a high load in the fourth component, can be considered as multidisciplinary; their appearance in the citation environment of *Fullerenes, Nanotubes, and Carbon Nanostructures* might be explained by the diffusion of new discoveries in multidisciplinary journals aimed at a broader audience. We shall see below that the articles which are most cited in this field appear in *Science* and *Nature*.

#### *Codification of meaning in time and space*

Until now, the emergence of knowledge has been conceptualized in terms of variation in the structure of the journal space. New discoveries disrupt the network structure communicating scientific developments. In the following section, the evolution of the term “fullerene” will be analyzed considering semantic changes that occur in time and in a different domain than the one represented by scientific communication.

Nanotubes are fullerene-like structures. They were discovered in 1991. The fact that nanotubes have more potential applications than fullerenes may explain the exponential growth of documents with the word “nanotube” in their titles (Figure 1). Because nanotubes are a specific form of fullerenes, research with this focus is related to research in fullerenes. Nanotubes discoverer, Sumio Iijima, defined his discovery of nanotubes as serendipitous while researching fullerene carbon structures (IJIMA, 2002). Research in nanotubes as some specific types of fullerenes made us hypothesize that through the codification of the concept of “nanotube” a further codification of “fullerene” can be explained. For this reason, fullerene and nanotube related documents are both considered.

For the case of codification in a different space than the one represented by scientific communication, the codification from association of words in the titles of the patents of the United States Patents and Trademark Office ([www.uspto.gov](http://www.uspto.gov)) was analyzed.

*Codification in time.* This part of the analysis emphasizes on the effect of time in the codification of the concept of fullerene and the posterior feedback-effect of further research in a specialized application of fullerenes (nanotubes). Documents with fullerene(s) or nanotube(s) in their titles were retrieved from the SCI. Because time is considered in this study as a sequence of events that produce a difference,<sup>3</sup> each of the sets was divided in three sets with an equal number of consecutively published documents. The purpose of this division was to find out how the codification of the concept changes and if this change could be observed as a change in the process of producing and validating knowledge.

For every case, only words occurring more than 20 times were considered, and the search terms (fullerene(s) and nanotube(s)) were excluded from the analysis. The cosine was used for the normalization. The algorithm of KAMADA & KAWAI (1989) available in the software PAJEK was applied to the visualization of the networks with a threshold of cosine  $\geq 0.2$ .

*Fullerene documents.* For the set of fullerenes, the division was made into two subsets of 2,565 and one of 2,566 documents. The first set, Figure 7, corresponds to documents published from 1987 to 1997. A total of 4,645 words occur in the titles of these documents, and 1,905 occur more than once. For this case 90 words that appeared more than 20 times were considered.

As can be seen from Figure 7, this first set depicts a loose set of nodes with very few clusters mostly composed of dyadic relations between words. The carbon nanotube, fullerene-like structures that were first spotted in 1991, have a high frequency of occurring inside the fullerene-related documents, but their relation vanishes when the threshold of the cosine is set at 0.2. In other words, the patterns of relations among the title words are not specific. The loose association of words illustrates a first stage of research dominated by documents related to the chemistry of fullerenes and processes associated with the production and synthesis of fullerene-like structures.

For the second set, shown in Figure 8, the documents were published between 1997 and 2001 and the total number of words in these titles was 5,478 of which 2,238 happened at least twice. For the analysis, 127 words occurring more than 20 times were considered.

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<sup>3</sup> And not only a variable which may co-vary. For a more detailed explanation of the dynamic analysis of network structures: LEYDESDORFF (1991).













of the domains and their different purposes in the use and treatment of knowledge result in different functions and meaning of words.

Information was retrieved from the USPTO ([www.uspto.org](http://www.uspto.org)) for all patents applications in the United States that had fullerene(s) or nanotube(s) in their titles.<sup>5</sup>

The potential applications of both fullerenes and nanotubes in the development of new materials were expected to be evident in the codification of the concepts in the titles of these documents.

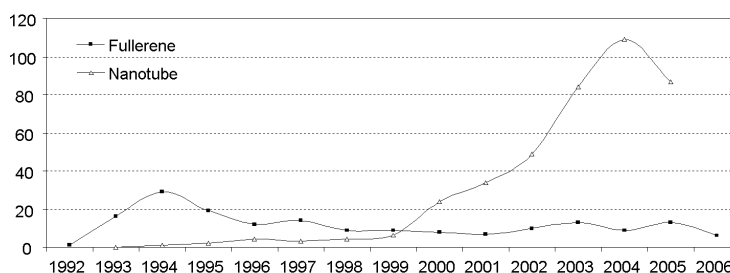


Figure 13. Number of patent applications in USPTO with “fullerene(s)” or “nanotube(s)” in their titles over time.

Figure 13 resembles Figure 1 in the tendency of the yearly increase of documents. Patents applications for fullerenes started earlier and had a higher growing rate in earlier stages. Properties of carbon nanotubes evidenced more potential applications than just fullerenes; applications of nanotubes adopted an exponential growing rate (as the documents published) while for fullerenes they stabilized with time. An early growth of fullerenes-applications its stabilization and a further ‘boom’ in nanotubes-applications can respond to an innovation process characterized by an early science-push followed by market-push (SCHMOCH, 1997). What is evident from both Figure 1 and Figure 13, is that even though nanotubes is a spin-off effect of research in fullerenes, it differentiates from and forms its own research front. For the case of patents applications, just four documents have both the word nanotubes and fullerenes in their title.

*Fullerene patent documents.* For the case of fullerene, the exercise retrieved a total of 175 patents, with “fullerene(s)” in their titles, in which 411 words happened. For this analysis 117 words that occurred more than twice were used. The semantic map of the title words of these 175 patent documents is illustrated in Figure 14.

From Figure 14, the codification of the meaning of fullerene does not seem to be strongly codified in relation to its envisaged applications and differently from codifications at the scientific domain. In fact just the cluster that is formed with HIV-

<sup>5</sup> ttl/fullerene\$ ; ttl/nanotube\$



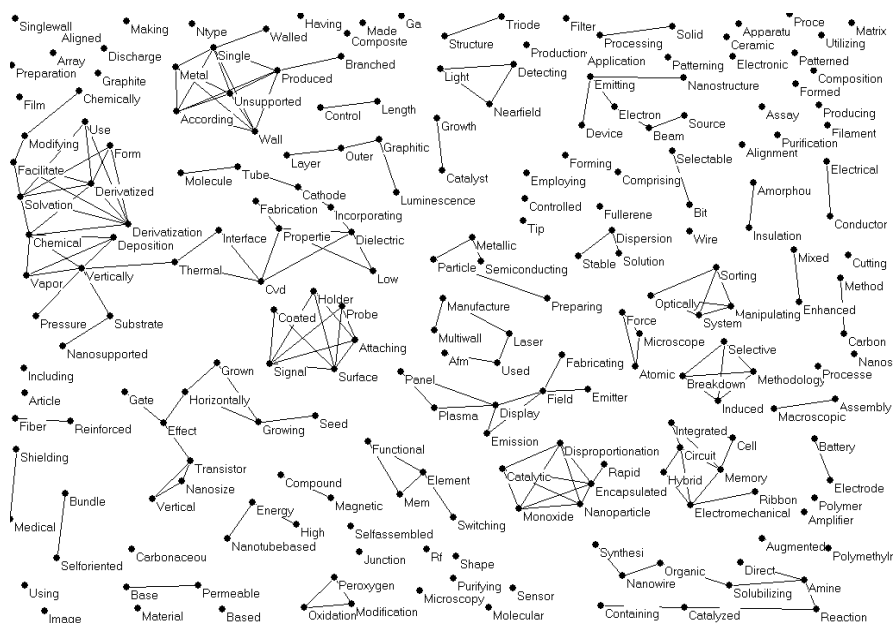


Figure 15. Cosine map of the titles in nanotube related patent documents (cosine  $\geq 0.4$ ).

The results from the analysis of the titles in the nanotube patents in Figure 15, show more relation to its expected applications in comparison to fullerene patent documents. Clustering words such as emitter, plasma, signal, fiber, medical shielding, nanosize transistor, growing seed, high energy, emitting device, electrical conductor, cell, memory, circuits, battery electrode, nanowire, seem to be more related to potential applications.

Nevertheless, the permanence, when increasing the threshold of the cosine, of some clusters formed with words such as cvd,<sup>6</sup> methodology, discharge, chemical, vapor, deposition are very related to nanotube production. This indicates that the tension to patent nanotube producing methods continues to be very important in relation to its further applications.

“Building-blocks” properties of nanotubes expose a broad range of potential commercial applications as response to further research in the field. “Nanotech researchers worldwide are steadily filing patents in the hopes of creating ‘tollbooths’ for future products incorporating nanomaterials” (*Lux Research Report*, 2005). The semantic maps obtained for patent documents with “fullerene(s)” and “nanotube(s)” in their titles; seem to reveal this excessive patenting situation. Indications of consumer

<sup>6</sup> Chemical Vapor Deposition

applications from the semantic maps are very limited and word-clusters are more related to the production and properties of the molecules. If this behavior continues, the possibility to apply fullerenes and nanotubes in consumer oriented devices might be limited as the costs of licensing can become inefficiently high. (*Ibid.*)

### *Citation behavior*

For the last part of the analysis the software *HistCite* was used to establish the citing relations inside the fullerene and nanotube related documents retrieved from the SCI. This software feeds from files obtained from queries to the Web of Science and highlights different aspects of a set of documents such as inside citations, most relevant authors or institutions, links, missing links, most cited nodes.

The importance of this particular software for this part of the analysis is that it creates a citation index for the documents retrieved. Chronological citation maps are automatically generated limiting the citations to the desired set of documents. This facilitates historical reconstruction of scientific developments. This way, differences in the citing dynamics inside each of the sets (fullerene and nanotubes) can be associated with differences in the emergence and stabilization of research fronts.

For the 7,962 documents that have fullerene in their titles, Figure 16 shows the relations between the 30 most cited documents.<sup>7</sup> The size of the nodes indicates the amount of citations it gets in the set. There are 3,050 documents that are not cited and 1,237 documents not citing any of the other documents of the set.

One of the most cited articles was “C60: Buckminsterfullerene” (KROTO, 1985). This document was not included in the set. A further analysis including the 408 documents from the SCI with Buckminsterfullerene\* in their titles might be appropriate.

In Figure 17, the citing relations for the nanotubes documents are depicted. The total number of documents that do not cite any other document in is 1,035; 4,517 documents are not cited by any other document.

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<sup>7</sup> Inside the set, 63,026 references were outside the set of documents. Two references are worth mentioning: “C60 Buckminsterfullerene” published in *Nature* in 1985 and referenced 1,495 times in the set and “Solid C60: A new form of carbon” published in *Nature* in 1990 and being referenced 1,410 times

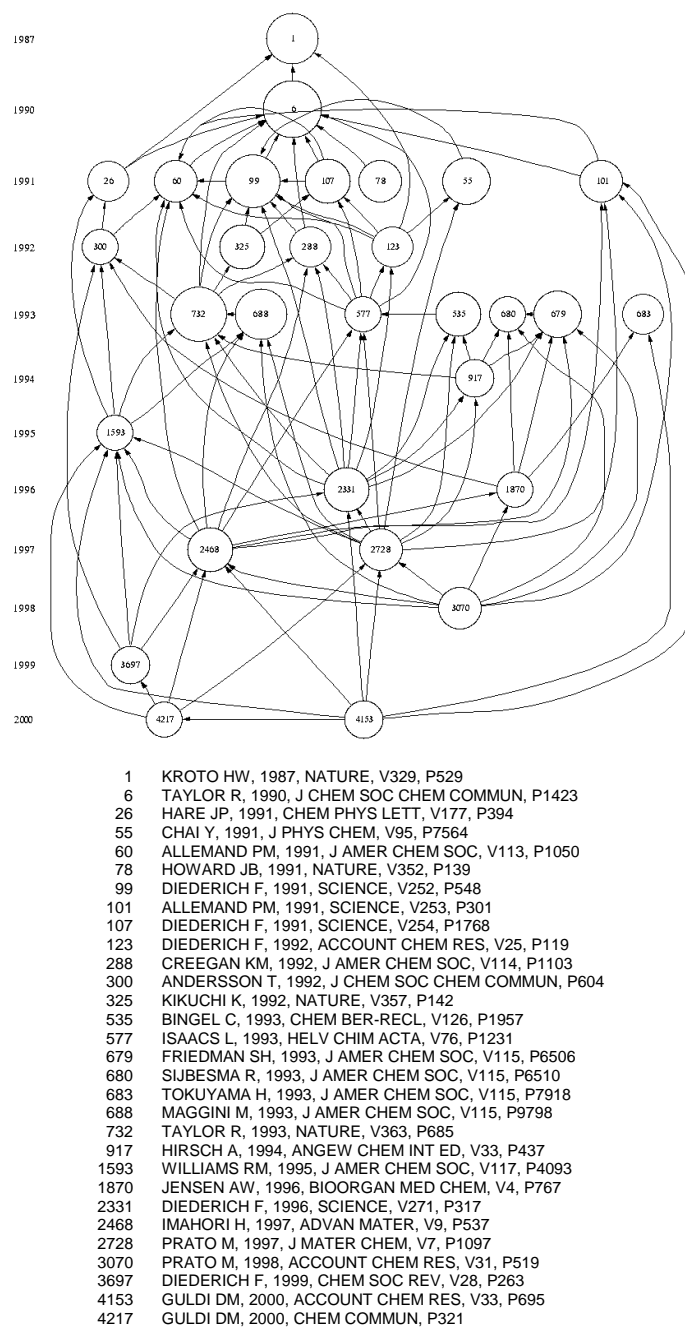


Figure 16. Citing relations among documents with “fullerene(s)” in their titles, *HistCite*



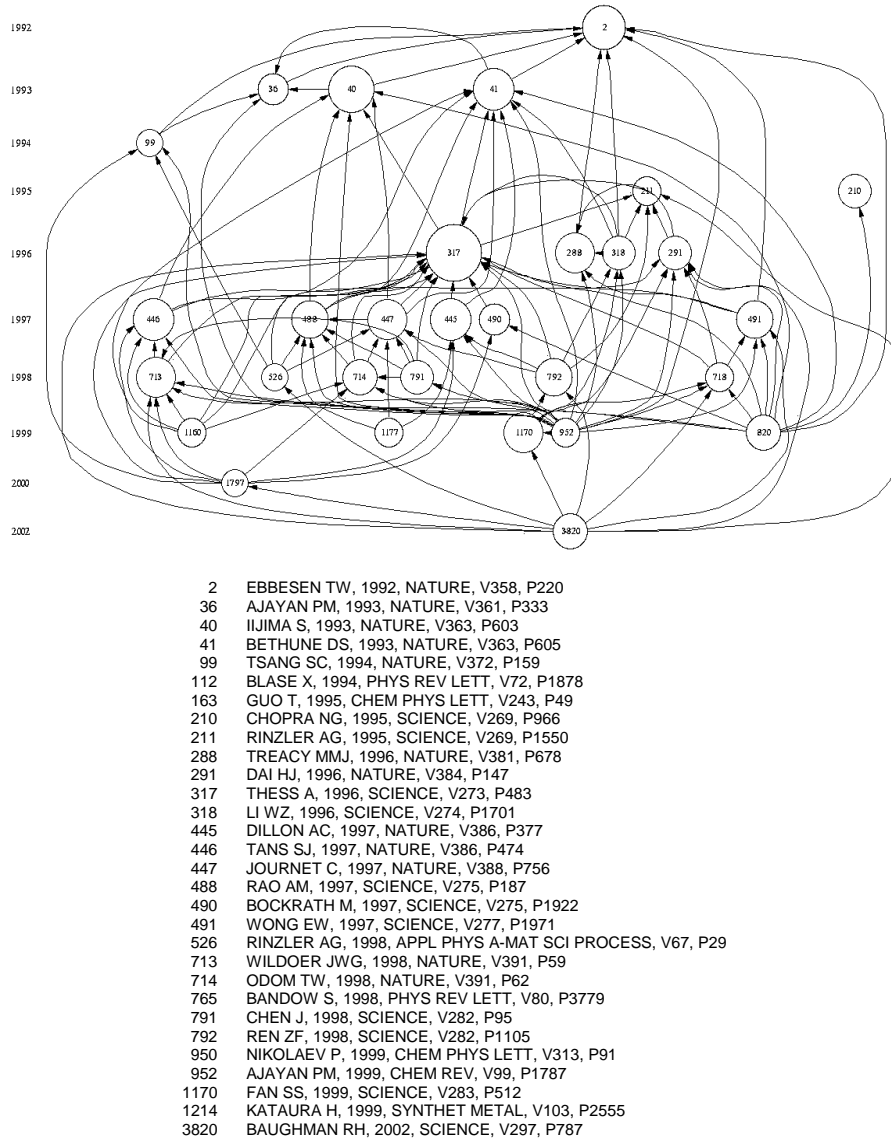
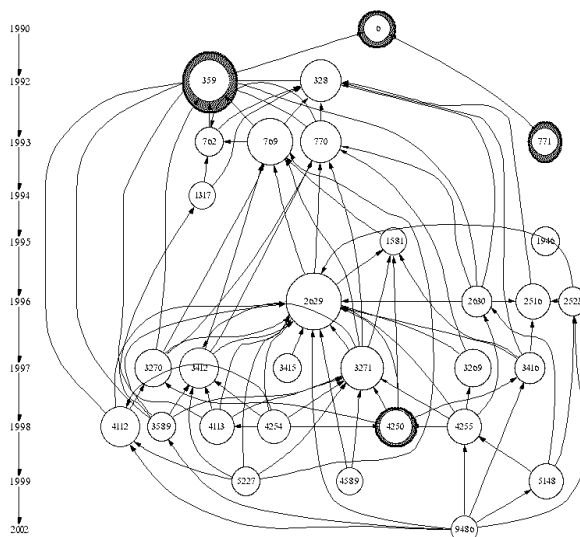


Figure 17. Citing relations among nanotube-related documents, *HistCite*



6 TAYLOR R, 1990, J CHEM SOC CHEM COMMUN, P1423  
 328 EBBESEN TW, 1992, NATURE, V358, P220  
 359 MINTMIRE JW, 1992, PHYS REV LETT, V68, P631  
 762 AJAYAN PM, 1993, NATURE, V361, P333  
 769 IJIMA S, 1993, NATURE, V363, P603  
 770 BETHUNE DS, 1993, NATURE, V363, P605  
 771 TAYLOR R, 1993, NATURE, V363, P685  
 1317 TSANG SC, 1994, NATURE, V372, P159  
 1581 GUO T, 1995, CHEM PHYS LETT, V243, P49  
 1946 CHOPRA NG, 1995, SCIENCE, V269, P966  
 2516 TREACY MMJ, 1996, NATURE, V381, P678  
 2523 DAI HJ, 1996, NATURE, V384, P147  
 2629 THESS A, 1996, SCIENCE, V273, P483  
 2630 LI WZ, 1996, SCIENCE, V274, P1701  
 3269 DILLON AC, 1997, NATURE, V386, P377  
 3270 TANS SJ, 1997, NATURE, V386, P474  
 3271 JOURNET C, 1997, NATURE, V388, P756  
 3412 RAO AM, 1997, SCIENCE, V275, P187  
 3415 BOCKRATH M, 1997, SCIENCE, V275, P1922  
 3416 WONG EW, 1997, SCIENCE, V277, P1971  
 3589 RINZLER AG, 1998, APPL PHYS A-MAT SCI PROCESS, V67, P29  
 4112 WILDOER JWG, 1998, NATURE, V391, P59  
 4113 ODOM TW, 1998, NATURE, V391, P62  
 4250 LIU J, 1998, SCIENCE, V280, P1253  
 4254 CHEN J, 1998, SCIENCE, V282, P95  
 4255 REN ZF, 1998, SCIENCE, V282, P1105  
 4589 NIKOLAEV P, 1999, CHEM PHYS LETT, V313, P91  
 5148 FAN SS, 1999, SCIENCE, V283, P512  
 5227 KATAURA H, 1999, SYNTHET METAL, V103, P2555  
 9486 BAUGHMAN RH, 2002, SCIENCE, V297, P787

Figure 18. Citing relations among nanotube- and fullerene-related documents, *HistCite*. Highlighted nodes denote documents with the word “fullerene(s)” in their titles.

The citation dynamics inside each of the sets illustrates different behaviors. For the set of fullerene, a clear vertical hierarchy illustrates that early documents continue being very relevant for the development of the field. For the case of nanotubes, the relations are more horizontally shaped and there is not one single document with an

extraordinary citation score. The importance of citations of recent documents in the set of nanotubes is typical of the development of research fronts (CHEN, 2006).

If nanotubes research have characteristic of a research fronts, fullerene research could be forming the intellectual base of this new development. Measuring the integration of knowledge acquired in fullerene research in the further development of a more specialized research front in nanotubes is possible analyzing both sets of documents together.

In Figure 18 citing relations of both sets are illustrated. Inside the set, 2,154 do not cite any of the documents of the set and 7,377 are not cited by other documents in the set.

Although nanotubes have been recognized as a type of one-dimensional fullerene, and their discovery can be understood as a trigger effect of research in fullerene, the amount of documents published with nanotube in their title and the participation of countries in their production can be embedded in a shift of effort and attention in the different research fronts.

### Conclusions

Network analysis proves useful to understand the dynamic process of knowledge production as a further codification of information; in this text, consequence of new discoveries. In the journal space, the emergence of a new journal as a consequence of discoveries marks an important breakthrough. For this particular case, *Fullerene Science and Technology* publishes an important share of documents related to fullerenes but loses importance in the distribution of communication in nanotubes (only 93 of 840 documents titles in the journal contain the word “nanotube(s)”).

For the semantic codification of meaning in time, while “carbon-nanotubes” constitute a dyadic relation for all the time-differentiated sets of fullerene documents, “fullerene” has weak patterns of association in the sets of nanotube documents. Relations among words were different in each of the sets. While for fullerenes, the network became denser with more complex clusters; in nanotubes the semantic codifications in time did not acquire more complexity. This seems to prove that there are underlying processes that generate structures in the communication: some provide variation and others are more functionally oriented to create structure in the communication.

Although there were some differences in the codifications at different domains, the most frequent words were similar in scientific and patent documents. The hype in patenting fullerene and nanotube related processes can affect the semantic codification of its commercial applications.

The citation relations showed that “fullerene” documents are among the most cited documents in the development of nanotube research. A deeper analysis of references and most cited documents of the set must be done to make further remarks about the constitution of fullerene research as the intellectual base of the nanotube research front. For the case of fullerenes, the most frequently cited articles are not the more recent ones as could be expected of a nanoscience field of research

The different network analysis seems to converge in the conclusion that even though fullerene and nanotube research are related, nanotube research has acquired its own dynamics soon after its discovery and has been disconnected from fullerene research. This is confirmed by the fact that there is a different distribution of authoring countries in each of the sets of documents. United States and Japan have an important input in both fronts, but actors such as Switzerland, Taiwan and South Korea have stronger participation in research in nanotubes than in fullerenes; and countries like China, Germany, England, France and Italy have a relevant participation in the production of fullerene documents, but not significant for the case of nanotubes.

One of the possible reason why fullerenes and nanotubes research drift and constitute each its own dynamics and institutions is that although they are both nanometer carbon structures, the exceptionality of the molecular nature of the nanotubes in terms of their high length-to-width aspect ratio has captured the attention of further research as specialized and large-scale applications are growing constantly (COLBERT, 2003).

### **Further work**

Knowledge has become increasingly central to the progress of society and our daily lives. Industrial economies are targeting to become more knowledge-based. This justifies the importance of finding ways to operationalize the knowledge-base, to observe and measure the fluxes of information that form its foundations, to understand issues concerning the processes behind the production and application of knowledge.

Our purpose in this paper has been to understand the emergence of knowledge as a consequence of new discoveries and its disrupting effects in the structures of scientific communications; for this, we have concentrated on the relations among the codes of communication, and the changes of meaning codification in relation to time and domain. Our first assumption has been that knowledge is socially constructed through communication.

We consider time as crucial in the process of knowledge construction and application. New discoveries constitute new information that acts as a source of variation in the communication, but this can only be observed as time-dependent variation. New information can become knowledge with the introduction of time as a further degree of freedom through which the disrupted communication re-organizes.

Different properties and measures of the networks could give some hindsight into the state of development of scientific disciplines, topics of research and research fronts, and the integration of knowledge to existing knowledge bases.

In this study we have worked with the codification of two concepts related to nanoscience, an emerging field of the sciences. The analysis has been to understand the changes in scientific communication. Further steps will consider knowledge-based innovation to measure their scientific base and analyze codification processes at the interfaces as well as concepts related to medicine and the social sciences.

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### References

- AMSTERDAMSKA, O., LEYDESDORFF, L. (1989). Citations: Indicators of significance? *Scientometrics*, 15 : 449–471.
- BRAUN, T., SCHUBERT, A., ZSINDELY, S. (1997). Nanoscience and nanotechnology on the balance, *Scientometrics*, 38 : 321–325.
- BURT, R. S. (1982). *Toward a Structural Theory of Action*. Academic Press, New York, etc.
- CALLON, M., LAW, J., RIP, A. (Eds) (1986). *Mapping the Dynamics of Science and Technology*. Macmillan, London.
- CHEN, C. (2006). CiteSpace II: Detecting and visualizing emerging trends and transient patterns in scientific literature, *Journal of the American Society for Information Science and Technology*, 57 (3) : 359–377.
- COBERT, D. (2003). Single-wall nanotubes: a new option for conductive plastics and engineering polymers. *Plastics, Additives & Compounding*: January/February 2003.
- COZZENS, S. (1985). Comparing the sciences: Citation context analysis of papers from Neuropharmacology and the Sociology of Science, *Social Studies of Science*, 15 (1) : 127–153.
- COZZENS, S. E., LEYDESDORFF, L. (1993). Journal systems as macro-indicators of structural change in the sciences. In: A. F. J. VAN RAAN, R. E. DE BRUIN, H. F. MOED, A. J. NEDERHOF, R. W. J. TIJSSSEN (Eds), *Science and Technology in a Policy Context*. DSWO/Leiden University, Leiden, pp. 219–233.
- EBBESEN, T. W., AJAYAN, P. M. (1992). Large scale synthesis of carbon nanotubese. *Nature*, 368 : 220–222.
- FUJIGAKI, Y. (1998). Filling the gap between the discussion on science and scientist’s everyday’s activity: applying the autopoiesis system theory to scientific knowledge, *Social Science Information* 37 (1) : 5–22.
- GARFIELD, E. (1973). Historiographs, librarianship, and the history of science. *Essays of an Information Scientist*, 2 : 134–135.
- GARFIELD, E. PUDOVKIN A. I., ISTOMIN V. S. (2005). Algorithm citation linked histography –Mapping the literature of science, *Proceedings of the American Society for Information Science and Technology*, 38 (1) : 14–24.
- GUO, T., NIKOLAEV, P., RINZLER, A., TOMÁNEK, D., COLBER, D., SMALLEY, R. (1995). ‘Self-assembly of tubular fullerenes, *Journal of Physical Chemistry*, 99 : 10694–10697
- HE, C., PAO, M. L. (1986). A discipline-specific journal selection algorithm. *Information Processing & Management*, 22(5) : 405–416.
- HESSE, M. (1980). *Revolutions and Reconstructions in the Philosophy of Science*. Harvester Press, London.
- IJIMA, S. (2002). The carbon nanotube a product of nanotechnology. *Aichi Voice* 15; at: [http://www2.aiaa.pref.aichi.jp/voice/no15/15\\_cutting\\_edge.html](http://www2.aiaa.pref.aichi.jp/voice/no15/15_cutting_edge.html)

- KAMADA, T., KAWAI, S. (1989). An algorithm for drawing general undirected graphs. *Information Processing Letters*, 31 (1) : 7–15.
- KROTO, H. (1987). The stability of the fullerenes C-24, C-28, C-32, C-36, C-50, C-60 and C-70. *Nature*, 329 (6139) : 529–531.
- LEYDESDORFF, L. (1991). The static and dynamic analysis of network data using information theory. *Social Networks*, 13 : 301–345.
- LEYDESDORFF, L. (1995). *The Challenge of Scientometrics: The Development, Measurement, and Self-Organization of Scientific Communications*. DSWO Press/Leiden University, Leiden; at <http://www.upublish.com/books/leydesdorff-sci.htm>.
- LEYDESDORFF, L. (2002). Some epistemological implications of semiosis in the social domain. *Semiotics, Evolution, Energy, and Development (SEED) Journal*, 2 (3) : 60–83.
- LEYDESDORFF, L. (2007). Scientific communication and cognitive codification: social systems theory and the sociology of scientific knowledge, *European Journal of Social Theory*, 10 (3), in print.
- LEYDESDORFF, L., COZZENS, S. E. (1993). The delineations of specialities in terms of journals using the dynamic journal set of the SCI, *Scientometrics*, 26 : 133–154.
- LEYDESDORFF, L., COZZENS, S., VAN DEN BESSELAAR, P. (1994). Tracking areas of strategic importance using scientometric journal mappings, *Research Policy*, 23 : 217–229.
- LEYDESDORFF, L., HELLSTEN, I. (2005). Metaphors and diaphors in science communication: Mapping the case of ‘stem-cell research’. *Science Communication*, 27 (1) : 64–99.
- Lux Research Report* (2005) Nanotechnology gold rush yields crowded, entangled patents; at: <http://www.luxresearchinc.com/>.
- MEYER, M., PERSSON, O. (1998). Nanotechnology: interdisciplinarity, patterns of collaboration and differences in application, *Scientometrics*, 47 : 195–205.
- SALTON, G., MCGILL M. J. (1983). *Introduction to Modern Information Retrieval*. Auckland, etc.: McGraw-Hill.
- SCHMOCH, U. (1997). Indicators and the relations between science and technology. *Scientometrics*, 38 (1) : 103–116.
- SCHUMMER, J. (2004). Multidisciplinarity, interdisciplinarity, and patterns of research collaboration in nanoscience and nanotechnology, *Scientometrics*, 59 : 425–465.
- TEIL, G., LATOUR, B. (1995), The Hume machine. Can association networks do more than formal rules? *Stanford Electronic Humanities Review* 4 (2), at <http://www.stanford.edu/group/SHR/4-2/text/teil-latour.html>.