

Factors associated with the successful operation and participation of researchers in scientific networks of medical and health sciences in Colombia

Factores asociados al funcionamiento y participación exitosos de investigadores en redes científicas de ciencias médicas y de la salud en Colombia

Carmen Murillo-Aceituno^{1,2}  José Felipe Antonio Gaitán-Guerrero³  José Molero-Zayas² 

¹ Hospital Universitario de Fuenlabrada - Financial Management and Economic Control Area - Madrid - Spain.

² Universidad Complutense de Madrid - Complutense Institute for International Studies - Madrid - Spain.

³ Universidad de Antioquia - Faculty of Medicine - Medellín - Colombia.

Corresponding author: Carmen Murillo-Aceituno. Hospital Área de Control de Gestión y Económico Financiero, Universitario de Fuenlabrada. Madrid. España. Email: carmen.murillo@salud.madrid.org.

Abstract

Introduction: Scientific research in medical and health sciences is becoming increasingly complex. In this sense, research and innovation networks can be a key element for researchers to obtain up-to-date and useful knowledge.

Objective: To analyze the participation in research networks of Colombian researchers working in medical and health sciences, as well as their characteristics and the factors associated with more involvement in said networks and better research and innovation achievements.

Materials and methods: Descriptive and observational study conducted in two phases: the first, in 2016, consisted of sending a virtual survey on participation in and operation of these networks to the representatives of the 714 research groups in medical and health sciences officially recognized in Colombia, and the second, in 2017, consisted of sending a second survey to the 232 representatives who completed the first one. Relative frequencies were used for data analysis and description. Differences between participating in the networks and the characteristics of the researchers were determined using the chi-square test. A multivariate analysis (logistic regression model) was performed to determine the association between aspects of the network operation and the results obtained.

Results: Of the 714 groups, only 232 representatives completed the first survey, and of these, only 82 (35.34%) participated in research networks. Significant differences were observed between participating in research networks and developing innovation products ($p < 0.01$) and appearing in publication rankings ($p = 0.02$). Regarding the network operation, there were three key elements: strategy, consensus, and funding; the first two correlate with obtaining results.

Conclusions: Knowledge and innovation networks are important for generating more knowledge and research in the country. Therefore, the competent authorities should promote the creation of new research networks and encourage researchers from lagging regions in the country to participate in them.

Keywords: Information Networks; Knowledge; Research; Diffusion of Innovation (MeSH).

Murillo-Aceituno C, Gaitán-Guerrero JFA, Molero-Zayas J. Factors associated with the successful operation and participation of researchers in scientific networks of medical and health sciences in Colombia. *Rev. Fac. Med.* 2021;69(3):e83300. English. doi: <https://doi.org/10.15446/revfacmed.v69n3.83300>.

Resumen

Introducción. La investigación científica en ciencias médicas y de la salud es cada vez más compleja. En este sentido, las redes de investigación e innovación pueden ser un elemento clave para adquirir conocimiento actualizado y de utilidad para los investigadores.

Objetivo. Analizar la actividad de investigadores colombianos del área de ciencias médicas y de la salud en redes de investigación, así como sus características y los factores asociados con una mayor participación y con mejores resultados en términos de investigación e innovación.

Materiales y métodos. Estudio observacional descriptivo realizado en dos fases: la primera consistió en el envío de una encuesta virtual en 2016 sobre participación y funcionamiento de estas redes a los representantes de los 714 grupos de investigación en ciencias médicas y de la salud reconocidos oficialmente en Colombia, y la segunda, en 2017, en el envío de una segunda encuesta a los 232 representantes que respondieron la primera. Para el análisis y descripción de los datos se emplearon frecuencias relativas. Las diferencias entre la participación en redes y las características de los investigadores se determinaron mediante la prueba de chi-cuadrado. Se realizó un análisis multivariante (modelo de regresión logística) para determinar la asociación entre aspectos del funcionamiento de la red con los resultados obtenidos.

Resultados. De los 714 grupos, solo contestaron representantes de 232, y, de estos, solo 82 (35.34%) participaban en redes de investigación. Se observaron diferencias significativas entre participar en redes y el desarrollo de productos de innovación ($p < 0.01$) y aparecer en rankings de publicaciones ($p = 0.02$). Respecto al funcionamiento de la red, hay tres elementos clave: estrategia, consenso y financiación; los dos primeros se correlacionan con la obtención de resultados.

Conclusiones. Las redes de conocimiento e innovación son importantes para generar más conocimiento e investigación en el país; por tanto, las autoridades competentes debieran fomentar la creación de nuevas redes de investigación e incentivar a los investigadores de las regiones más rezagadas del país a participar en ellas.

Palabras clave: Redes de Información de Ciencia y Tecnología; Conocimiento; Investigación; Innovación (DeCS).

Murillo-Aceituno C, Gaitán-Guerrero JFA, Molero-Zayas J. [Factores asociados al funcionamiento y participación exitosos de investigadores en redes científicas de ciencias médicas y de la salud en Colombia]. *Rev. Fac. Med.* 2021;69(3):e83300. English. doi: <https://doi.org/10.15446/revfacmed.v69n3.83300>.

Introduction

At present, knowledge is the basis for the growth of countries because its accumulation determines their capacity for innovation.¹ Therefore, boosting knowledge through national innovation systems is critical to every nation's economic progress.²⁻⁵

In this sense, Colombia, whose economic growth depended on the commercialization of raw commodities in the past, must now consider shifting the focus of production toward knowledge generation and innovation,⁶ both of which are critical determinants for the development of lagging economies. Research and innovation networks can be useful tools to achieve this goal; however, their effectiveness must be measured in order to establish the factors that facilitate knowledge generation and make it possible to share it among scientists.⁷

In the present study, network refers to a group of researchers or research groups (entities) created based on the structure proposed by the Colombian Ministry of Sciences (Minciencias, formerly Colciencias) and consisting of four types of individuals: researchers, researchers in training, undergraduate students, and associated members. Also, a node is understood as a group of research groups; each of these nodes can be from the same country or from several countries, but most belong to international networks.

To understand the conventional dynamics of the networks, the present study looked in the literature for classic points of view on the form and operation of networks⁸⁻¹¹ and also incorporated some additional perspectives.

Proximity

As mentioned above, a research network is the set of entities (people, institutions, teams, etc.) that are connected to each other to facilitate material and intangible interactions among its members. In this way, each member has information on who knows what, how, where and when by analyzing shared knowledge and experiences.¹² This allows knowledge to flow and research findings to improve.

At first glance, the ubiquity of research networks should ensure that outcomes are not influenced; however, it should be noted that innovation activities may be conditioned by processes spurred by geographic, social, and cultural proximity factors in collaborative contexts.¹³ In this regard, Marshall¹⁴, in his treatise on economics, emphasizes the necessity of physical proximity for the exchange of valuable knowledge in the production of economic resources.

Direct interaction or, in other words, face-to-face interaction, builds confidence; therefore, good coordination, in which physical meetings are encouraged, fosters collaboration and therefore productivity in a research network.¹⁵ However, some researchers claim that networks based solely on confidence would not be as operational as may be expected based on their findings.^{16,17} In this regard, Granovetter¹⁸ argues that relationships in networks are influenced by strong and weak ties of professional collaboration.

Thus, given the importance of physical proximity, the mobility of researchers could be an enhancer of the interactions mentioned above in open knowledge environments.¹⁹ Consequently, the present study aims to

delve into the operation and results of research networks based on the capabilities acquired through research.

In order to evaluate the aforementioned capacities, the present research studies what has been called *cognitive proximity*, which refers to the exchange of knowledge acquired in the networks to the economic or social environment of the researcher. On the other hand, from a country perspective, knowledge absorptive capacity is usually measured using different indicators, such as the degree of digitization, the level of knowledge of the researchers, gross domestic expenditure on R&D (GERD), or patents (discarded in the present study because of its little relevance in Colombia).²⁰

Information is generated in a network, which in turn allows for innovation; moreover, it produces what is known as creative destruction,²¹ a process in which obsolete schemes are replaced by new ones that derive precisely from innovation. It is important to note that for these innovations to be rooted at the social or economic level, knowledge absorptive capacity is necessary, and their superior value and fit in the demands of the country must be validated before they are made public.

Structure and operation

The "science of complexity" is one of the focal points for the study of networks in general. It emerges from basic sciences, comprises many areas of study —such as network science—, and allows to extrapolate its scientific findings for use in interdisciplinary research in fields as diverse as biology, computer science, etc.²²

Another approach to research collaboration is known as "team science", which studies the interactions of scientific teams from a functional perspective utilizing useful day-to-day operating tools.²³ In this regard, the advantages of information and communication technologies (ICTs)²⁴ in remote collaboration should be highlighted, as they allow for the fluid and automatic distribution of information between research nodes, which, in turn, allows them to share knowledge and experiences. At this point, it is important to stress the relevance of the coordinator, who must keep the network active by providing and receiving knowledge through ICTs.²⁵

On the other hand, it is essential to bear in mind that networks may have problems in their operation, which can result from social, economic, or academic interaction, and even from disagreements or incompatibilities among participants.²⁶

Network results

The determinants of network success may be in conflict because of the subjectivity of researchers and the fact that there are sometimes very diverse opinions among them that are far removed from reality.²⁷

Contrary to what is expected, the use of ICTs may not reduce costs or increase network productivity due to the lack of these tools in developing regions.²⁸ In this regard, Uribe-Zirene & Cuadros-Mejía²⁹ state that some of the difficulties encountered in the networks are associated with the lack of funding for projects and activities, lack of time to implement activities, problems of communication and coordination, and access to ICTs.

Similarly, Hagedoorn *et al.*,³⁰ in an article summarizing academic, professional and policy literature on research partnerships focused on technology policy,

found that there are a variety of important reasons why firms participate in research associations and a number of reasons why governments encourage them. The authors concluded that technology policy authorities should be aware of these reasons and, therefore, be cautious when comparing the benefits and downside effects associated with collaboration.

On the other hand, Borondo *et al.*³¹ state that the interactions between nodes according to their position in the network is decisive for obtaining results if a meritocratic model is followed (if the compensation and power available to individuals are determined by their abilities and merits) or a topocratic one (if the compensation and power available to an individual is primarily determined by their position in the network). Thus, the structure of the networks represents a fundamental constraint as a perfectly meritocratic model for fully connected networks becomes topocratic for sparse networks, such as those of society.

Given this scenario, the objective of this study was to analyze the activity of Colombian researchers in the area of medical and health sciences in research networks, as well as its characteristics and the factors associated with greater participation in these networks and better results in areas of research and innovation. This study also describes the academic profile of the researchers and demonstrates how physical and cognitive proximity generate confidence in research networks, as they impact knowledge absorptive capacity and operation, influencing the results.

Materials and methods

Descriptive observational study conducted based on two surveys aimed at research groups in the area of medical and health sciences in Colombia. Information regarding the groups was collected from the Mincencias website and the research was carried out in two phases:

The first phase took place in July 2016 and consisted of sending, via email, a virtual survey on the participation and operation of research networks (Annex 1) to the representatives of the 714 officially recognized medical and health science research groups in Colombia; it was also possible to identify the nodes through this instrument. It should be noted that the groups that did not answer the survey the first time received another email in November 2016.

The survey submitted during the first phase evaluated 7 thematic sections (network characteristics, researchers' characteristics, impressions on network operation, funding, knowledge results, innovation results and overall results) through 54 questions: 6 on the description of the network, 4 on the description of its scope, 20 on its operation, and 24 on the results. This survey data was complemented with public academic and research data on the scholars, and it was integrated with information from the ranking of researchers from Colombian institutions.³²

This first survey was created using the parameters for the design and validation of questionnaires proposed by Martín-Arribas³³ and García de Yébenes-Prous *et al.*³⁴ A pre-test was conducted to select the questions, which were then evaluated by 10 specialists from various fields, most of whom were network coordinators, some in the health area and others in survey formats. A local expert in scientific networks was also included to assess the

comprehension of the questions from the perspective of the language used in the country; this expert also had experience in research networks and node interactions. All experts accepted most of the questions and provided others with which the survey was completed.

During a second round of instrument review, the survey with the recommended changes was sent back to the experts so that they could respond to it and validate the final result. The following are the technical features of the first survey:

Study population: Research groups officially recognized in Colombia through Call 737 of 2015 and whose details were available in the Minciencias database on March 11, 2016 (n=714).

Area: Medical and Health sciences.

Profile of the respondent: Managers of the research groups.

Response Rate: 32.49%.

Number of responses received: 232.

Sample error: 5.3%. ($p=0.5$; $q=0.5$) for a 95% confidence interval ($Z=1.96$).

The second phase took place in August 2017 and also consisted of sending an email survey. Only the 232 representatives who completed the first survey received the second (Annex 2). It was filled by 37 researchers (15.94%) and contained two questions, the first of which asked if they had achieved knowledge results through their own network of contacts, and the second of which asked if they had physically shared working time with the people with whom they had obtained those research results.

This second survey was also validated by different experts in a process similar to the first, and the purpose of its administration was to analyze whether researchers need these formal networks to achieve results or if they achieve the same results through informal contacts, in order to verify the usefulness of the networks. Furthermore, in terms of physical proximity, it was intended to determine whether not physically knowing someone can make collaboration more difficult. The technical aspects of the second survey are presented below:

Study population: research groups that responded to the initial survey (n=232).

Area: medical and health sciences.

Profile of the respondent: research group managers.

Response rate: 16%.

Number of responses received: 37.

Sample error: 14.8%. ($p=0.5$; $q=0.5$) for a 95% confidence interval ($Z=1.96$).

Network participants: 17 (45.94 %).

Non-network participants: 20 (54.05 %).

Statistical analysis

Relative frequencies were used for data description and analysis. Differences between network participation and the characteristics of the researchers were determined using the chi-square test. Similarly, a factor analysis was performed with the responses on the operation of the network, and based on the results, a multivariate analysis was carried out (logistic regression model) to determine the association between aspects of their operation and the results obtained by the researchers. All

statistical analyzes were carried out with the R software and a significance level of $p < 0.05$ was considered for all.

Ethical considerations

The study took into account the ethical principles for medical research involving human subjects established by the Declaration of Helsinki.³⁵ The research was approved by the Ethics Committee of the Hospital Universitario de Fuenlabrada in Madrid, Spain, according to Minutes No. APR 19/58 of December 18, 2019.

Participants voluntarily agreed to participate in the study, for which they signed an informed consent.

Results

Overall results

Only representatives from 232 of the 714 officially recognized medical and health science research groups in Colombia responded to the initial survey, and of these,

only 82 (35.34%) participated in research networks (Figure 1). Most researchers in these 82 groups were engaged in Applied Research (64.63%), followed by Applied Research plus Basic Research (19.51%), and Basic Research (15.85%) (Figure 2). For its part, the type of knowledge in most of these groups (95.12%) was analytical scientific and came from areas where scientific knowledge based on cognitive and rational processes abounds or from formal models (codified, rational, and verifiable knowledge). In the other groups (4.87%), knowledge was synthetic (applied or problem-related knowledge) or related to engineering^{36,37} (Figure 3).

Characteristics of researchers based on their participation in research networks

Significant differences were observed between researchers involved in networking and those who were not regarding the development of innovation products ($p < 0.01$) and appearance in publication rankings ($p = 0.02$) (Table 1).

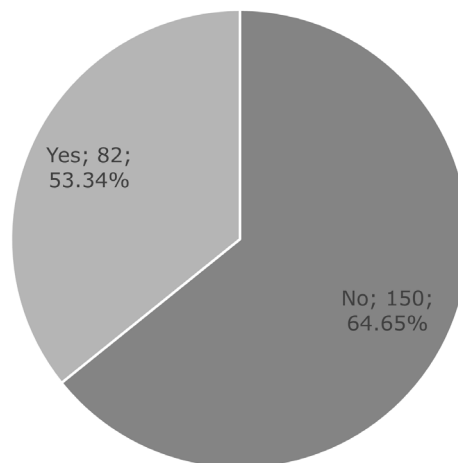


Figure 1. Participation in formal networks of the research groups in medical and health sciences included in the study. Source: Own elaboration.

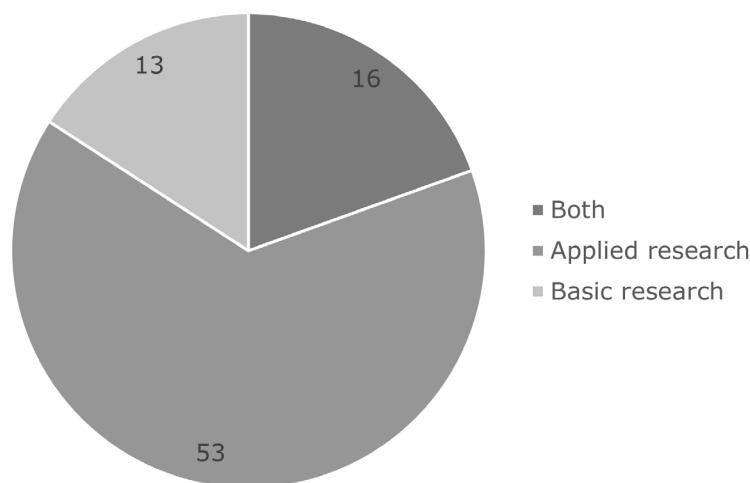


Figure 2. Type of research performed by the medical and health science research groups that participated in the study. Source: Own elaboration.

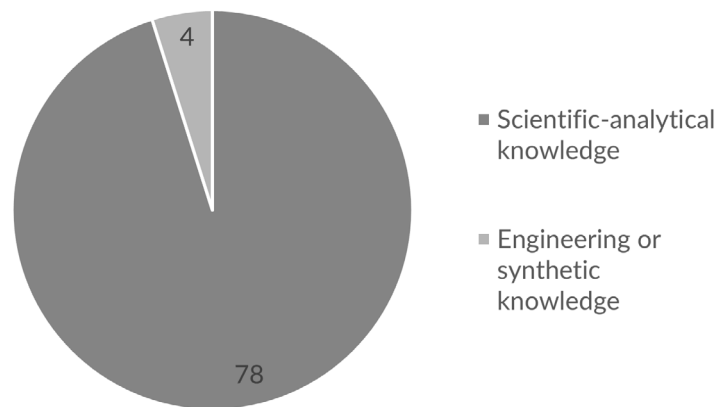


Figure 3. Type of knowledge of the medical and health science research groups that participated in the study.
Source: Own elaboration based on Asheim *et al.*³⁶ and Asheim *et al.*³⁷

Table 1. Characteristics of the researchers who participated in the study.

Characteristics		Participation in networks		p-value*		Total
		No	Yes	n	%	
Training abroad †	No data	2	1.33%	-	-	2
	No	88	56.66%	49	59.75%	137
	Yes	60	40%	33	40.24%	93
	Total	150	100%	82	100	1
Formal training	Ph. D.	61	41.21%	36	43.90%	97
	Medical specialty	27	18.24%	6	7.31%	33
	Master's degree	50	33.78%	37	45.12%	87
	Postdoctoral	10	6.75%	3	3.65%	13
	Total	148	100%	82	100	0.08
Development of innovation products	Yes	31	20.94%	36	43.90%	67
	No	117	79.05%	46	56.09%	163
	Total	148	100%	82	100	<0.01
Publication ranking	Yes	4	2.66%	9	10.97%	13
	No	146	97.33%	73	89.02%	219
	Total	150	100%	82	100	0.02

* The p-value was established using the chi-square test.

† Whether participants had earned a degree abroad was considered.

Source: Own elaboration.

Geographic proximity

Although the networks exist in a virtual space, it is clear that the physical distribution of researchers is influenced by economic and commercial activity, as they are concentrated in locations where these activities are more prevalent. Thus, the most economically powerful regions are also the most powerful in terms of research and networking, which helps them maintain and even improve their economic position. In this regard, two significant examples are provided below:

First, it was found that Antioquia has 122 officially recognized medical and health science research groups, which accounts for 17.08% of the 714 groups in the country; of these, 11 participate in networks. When comparing these groups with the national population

volume, it was found that they equal 107.22% in relation to that population, and when analyzing this information and looking at it from an economic perspective, it was established that the GDP of this region alone was equivalent to 14.66% of the country's GDP for 2015.

Secondly, in the central region of Bogotá, it was established that there are 319 officially recognized medical and health science research groups, which accounts for 44.67% of the total number of groups in the country; of these, 25 are active in networks. When comparing these groups with Colombia's total population, it was found that they account for 229.43% in relation to said population, and when analyzing this information, it was established that the percentage of GDP of the region was 26.91% with respect to the whole country for 2015, a very high percentage compared to other regions.

Affective and physical proximity: comparison of results

Affective and physical proximity were assessed based on the results of the second survey. To this end, the responses from representatives of groups that participated in networks and those that did not were considered to determine whether it is necessary to be part of a formal network to improve the results of collaboration, as this sample allowed for a comparison of both types of groups and their results.

As mentioned above, only 37 of the 232 researchers responded to the second survey, with 29 citing the relevance of interaction and stating that even though it is not essential, it does inspire confidence; therefore, they also use virtual communication systems. Furthermore, of these 37 researchers, 17 stated that they were also able to achieve results through informal contacts, while out of the remaining 20, 8 said they were unable to achieve results in knowledge and research through informal contacts.

Both non-networking and networking groups had concrete results in terms of publications and participation in meetings. Similarly, groups that participate in networks produce more results, with the exception of publishing, which is more related to interactions with informal contacts.

Cognitive proximity

This concept focuses on a country's knowledge or innovation absorptive capacity that is useful to itself; in this sense, it is understood that networks should be used to collect transferable knowledge. The following are some of the indicators associated with the absorptive capacity of countries:

The first indicator is R&D expenditure with respect to the GDP, which in Colombia was 0.27% in 2016 according to World Bank.³⁸ In countries like South Korea this percentage reaches 4.23%,³⁸ making it one of the most important nations in terms of innovation and knowledge results.

The second indicator is the number of researchers per million inhabitants, which is 57 in Colombia. This figure contrasts dramatically with South Korea, where there are 6 856 researchers for every million inhabitants, a figure that is even more striking when one considers that South Korea has a far smaller population than Colombia.³⁹

The third and final indicator presented by Ríos-Flores *et al.*⁴⁰ relates to knowledge absorptive capacity associated with different factors. It has the objective of estimating the effect of technological capabilities on economic growth by differentiating between high- and low-income countries, adjusted for their absorptive capacities in a non-linear function. According to their study, Colombia is a country that is classified as a lower-middle income country and has a knowledge absorptive capacity of 0.3864, which is low compared to the world average of 0.6014, with the highest values being those of Ireland (1.25), Belgium (0.97), and the Netherlands (0.81).⁴⁰

It should be noted that Ríos-Flores *et al.*⁴⁰ used 3 parameters to calculate knowledge absorptive capacity: GDP per worker, increase in R&D expenditure per worker, and technological capacity per worker. According to the results, the authors concluded that more work in this area is necessary, as has been done in other countries such as Chile, where the knowledge absorptive capacity is 0.59.⁴⁰

Operational relations and results: network coherence

To identify the factors that contribute to network operation, a factor analysis was performed with 17 questions from the first survey, which aimed at assessing success factors.¹¹ Each question was posed considering 5 possible levels of agreement, with 1 being no agreement and 5 being complete agreement.

The usefulness and suitability of factor analysis is established by means of the Kaiser-Meyer-Olkin (KMO) test and Bartlett's sphericity test, for which a value >0.5 and <0.05, respectively (significance level 5%), indicate that such an analysis can be performed. The results obtained with these tests for the instrument used in the present study were 0.88361 and <0.05, respectively, so it was determined that the factor analysis could be continued.⁴¹ Then, the KMO test established that the number of factors to extract was 3.

These three essential factors identified for the proper functioning of the network were called by the R statistical software according to the relationship with the grouping of results with the following concepts: MR1: "Strategy," MR3: "Consensus" and MR2: "Funding", thus summarizing the essence of the factors most associated with each of them (Table 2).

Table 2. Factorization of operating components.

	Result	MR1	MR3	MR2
Strategy	Is there an action plan with task description and assignment?	0.89	-0.19	0.11
	Does it have well-defined objectives?	0.69	0.02	0.11
	Do you think the network is ideal?	0.46	0.35	0.00
	Is the level of communication good?	0.47	0.37	0.05
	Do you achieve the expected results?	0.53	0.19	0.17
	Did you select participants appropriately in relation to the objectives?	0.57	0.36	-0.04
	Did you consider possible conflicts related to the capabilities of the members?	0.67	0.12	-0.03
	Are there agreements on the active participation of members?	0.53	0.22	0.09
Consensus	Are there any agreements on the use of results?	0.50	0.37	-0.07
	Do members who are more experienced in the subject matter help in the training of those with less expertise?	-0.11	0.61	0.34
	Is there a willingness to embrace cultural differences?	0.05	0.65	-0.03
	Do network participants meet the commitments?	0.02	0.73	0.16
Funding	Is there participation and consensus among members?	0.08	0.80	-0.03
	Is there efficient network coordination?	0.33	0.52	0.10
	Is there a network funding scheme in place?	0.14	-0.04	0.75
	Is the financial endowment sufficient for its maintenance?	-0.06	0.09	0.96
	Do you have enough funds for the maintenance of administrative staff?	0.12	-0.07	0.78
Proportion of variance explained		0.25	0.21	0.15

Source: Own elaboration.

Multivariate analysis using logistic regression on obtained results

The results of the factor analysis were combined with the responses on the actual results of network participation from the first survey, and it was found that "cohesion

of the scientific community", "identifying priority and collaborative lines", "publications" and "books" were significantly associated with the factor "strategy" (Table 3).

Table 3. Logistic regression associating the results obtained with the descriptive factors of the research network operation.

Result	MR1: Strategy		MR2: Funding		MR3: Agreement	
	Log (OR)	Standard error	Log (OR)	Standard error	Log (OR)	Standard error
Cohesion of the scientific community	0.57	0.02 *	-0.33	0.19	-0.21	0.44
Creating a space for interaction among researchers	0.08	0.77	-0.26	0.38	0.41	0.21
Promoting spaces for multidisciplinary interaction	0.04	0.86	-0.11	0.65	0.68	0.03 *
Generating a culture of cooperation	0.16	0.49	-0.29	0.24	0.32	0.25
Identifying priority and collaborative lines	0.49	0.05 *	-0.32	0.21	0.17	0.54
Identifying and strengthening leadership	-0.09	0.73	-0.00	0.99	-0.10	0.70
New biomarkers	0.61	0.13	-0.41	0.30	-0.17	0.73
Meetings	-0.01	0.98	0.13	0.57	-0.28	0.29
New drugs	2.60	0.49	2.59	0.47	-3.10	0.45
Publications	0.91	0,001 *	-0.26	0.31	-0.05	0.85
Infrastructure exchange	-0.05	0.86	0.21	0.52	0.44	0.22
Training courses, seminars, workshops	0.22	0.33	-0.28	0.23	0.21	0.42
Patents.	0.48	0.44	0.52	0.46	-0.35	0.66
Products	0.44	0.19	0.22	0.52	-0.15	0.70
Books	0.84	0.02 *	-0.25	0.47	-0.56	0.19
Guidelines or new disease treatment procedures	0.37	0.29	-0.66	0.05	0.35	0.39

* Statistical significance.

Source: Own elaboration.

Discussion

The distribution and acquisition of knowledge through research networks nodes is an efficient, quick, and low-cost method of acquiring new knowledge and achieving optimal results in research and innovation.³¹

The present study demonstrated how network participation enables researchers to gain knowledge different from that obtained through national sources, with this knowledge being scientific analytical in most cases (95.12%).³⁶ However, while virtual interaction was found to be relevant and effective in knowledge appropriation and generation, physical proximity and cognitive proximity were also found to be important in these processes.

In this sense, it has been reported that there is knowledge that requires physical interaction in order to be gained more quickly and effectively, because it is possible to know more than one can express in many cases;⁴² for example, face-to-face contact is very important in tacit knowledge.³⁷ Therefore, even though much knowledge is preserved, an aspect such as the mobility of scientists would be key to network collaboration.⁴³ In the same vein, and based on the findings of the second survey, the researchers emphasized on the need of physically knowing each other, as it would increase confidence when collaborating. This would confirm that physical interaction with people who are not members of their

families or close friends (weak ties) is an important support for collaboration in networks among researchers.⁴⁴

Another aspect of proximity identified in the present study and confirmed by other authors^{45,46} regarding network dynamics is that geographical location influences research activity because it relates to the economic competition of the regions. As for cognitive proximity, it was found that Colombia falls far short of several relevant indicators when it comes to promoting innovation and absorbing knowledge to build new innovations. Thus, according to Rios-Flores *et al.*⁴⁰ Colombia had an average knowledge absorptive capacity indicator of 0.3864 between 2000 and 2010, a very low figure when compared to the value for innovating countries, which is approximately 1. This is critical because, as Saxenian points out,⁴⁷ countries focused on innovation in global networks can project their economies.

A nation's capacity to absorb knowledge is built through the improvement of its basic education levels, its technological infrastructure,⁴⁸ and its productive systems. In this sense, for knowledge transfer and innovation to be viable, academia must collaborate with businesses in a circular ecosystem to transfer information to the country's productive sources and build cumulative learning.^{49,50}

In Latin America, several countries behave similarly to Colombia in terms of using knowledge networks. For example, according to the presentation of the Ibero-

American Program of Science and Technology for Development (CYTED),⁵¹ between 2015 and 2018, more than 3 600 experts took part in the program's Academy-Business Forums, which are meetings between Ibero-American entrepreneurs and researchers that address specialized topics around a specific technology sector to promote innovation, transfer, and technological cooperation projects. During the same presentation, it was reported that over 5 000 researchers from 1 070 R&D groups and 180 companies from the 21 countries that signed the program participated in the 73 current actions of the program in 2018.

Similarly, from a corporate point of view, it is observed that innovation coming from emerging countries is driven mainly by contributions from foreign companies, which suggests that international links are a compensatory mechanism for the initially lower technological capabilities of some nations, rather than a complementary source of knowledge.⁵²

It is important to highlight the factor analysis of network operation, in which the results stressed the need for a good strategy and a consensus-based participation model to achieve better results. In turn, funding is highly relevant, although, according to the findings of this study, it has no effect on concrete results or confidence relationships, which is consistent with what has been reported in the literature.^{11,17}

With respect to concrete results, the factor analysis showed relationships between the network operation and the results, with an increase in the number of publications and in multidisciplinary work when the network functioned properly.

Based on the results of both surveys, it is possible to conclude that formal relationships are not required for joint publications, but they are quite useful for other products (advanced knowledge, patents, etc.). In this sense, it is necessary to ask whether these collaborations also contribute to novelty in the results, as some studies have found negative differences in novelty in international collaborations.⁵³

The main limitation of the present study was that it was cross-sectional, therefore, no time sequences were performed to compare the results, thus new studies are necessary to analyze this aspect.

Conclusions

The results show that participation in knowledge and innovation networks in the medical and health area in Colombia is rather low, with just 36% of the researchers surveyed reporting involvement in these networks. Research carried out by the networks would be mostly applied with incremental innovation. Most researchers involved in these networks have more advanced training than those with specialties, namely master's and doctoral degrees, and they develop more innovation products and have higher academic production than those who do not.

There was also a strong association between, on the one hand, participation in research networks and the number of researchers and, on the other, economic capacity in the regions, which can be explained by the fact that economic growth and human talent are concentrated in prosperous regions.

The factor analysis of questions about network operation found that strategy, consensus, and funding are key elements. Thus, based on the logistic regression, it was determined that strategy and consensus are related to the achievement of actual results in publications and books, because the former influences scientific community cohesion and the latter has an impact on the achievement of multidisciplinary interaction spaces. By the same token, the recommendation is focused on working with tools to increase network consensus. Some examples of the application of these tools include the creation of practice communities, thematic workshops, shared learning platforms, among others. The challenge lies in identifying the models that facilitate the management of information and knowledge flow for all participants.

Finally, it is clear that knowledge and innovation networks are critical for generating more knowledge and research in the country; therefore, the competent authorities should promote the creation of new research networks and encourage researchers from the country's lagging regions to participate in them.

This work derives from the doctoral thesis entitled *Factores asociados al éxito en el funcionamiento y participación de investigadores en Redes Científicas de Ciencias Médicas en Colombia* (Factors associated with the successful operation and participation of researchers in Medical Science Scientific Networks in Colombia).⁵⁴

Conflicts of interest

None stated by the authors.

Funding

None stated by the authors.

Acknowledgments

To Maux de Vicente Oliva for his advice on statistics, to Stefan Walter for his assistance in the search for key results, and to Cristina Chaminade, Florentino Borondo and Santiago Peláez for their advice and their unconditional support in Colombia.

References

1. Boisier S. Sociedad del conocimiento, conocimiento social y gestión territorial. *Interações. Revista Internacional de Desenvolvimento Local*. 2001;2(3):9-28.
2. Chaminade C, Edquist C. From theory to practice: the use of the systems of innovation approach in innovation policy. In: Marius Meeus JH, editor. *Innovation, Science, and Institutional Change A Research Handbook*. Oxford: Oxford University Press; 2006. p. 141-163.
3. Freeman C. *Technology policy and economic performance Lessons from Japan*. Great Britain: Pinter Publishers; 1989.
4. Lundvall BA. National systems of innovation: towards a theory of innovation and interactive learning. In: *The Learning Economy and the Economics of Hope*. New York: Anthem Press; 2016. p. 85-106.
5. Nelson RR, Rosenberg N. Technical innovation and national systems. In: Nelson RR, editor. *National innovation systems: a comparative analysis*. Oxford: Oxford University Press; 1993. p. 1-18.

6. Lema R, Rabelotti R, Sampath PG. Innovation trajectories in developing countries: Co-evolution of Global Value Chains and innovation systems. *Eur J Dev Res*. 2018;30(3):345-63. <https://doi.org/gpsf>.
7. Cuadros A, Martínez Á, Torres F. Determinantes de éxito en la participación de los grupos de investigación latinoamericanos en programas de cooperación científica internacional. *INCI*. 2008;33(11)8.
8. Chompalov I, Genuth J, Shrum W. The organization of scientific collaborations. *Research Policy*. 2002;31(5):749-67. <https://doi.org/c2kc88>.
9. Luna-Ledesma M. Itinerarios del conocimiento: formas, dinámicas y contenido: un enfoque de redes. *Anthropos Editorial*; 2003.
10. Sebastián J. Análisis de las redes de investigación de América Latina con la Unión Europea. *Revista de Ciencia e Tecnología*. 1999;3(2):308-21.
11. Sebastián J. Las redes de cooperación como modelo organizativo y funcional para la I+ D. *Redes*. 2000;7(15):87-111.
12. Dubii-Bondi T, Flores MA. La gestión comunicacional en el trabajo de investigación en red. *Observatorio Laboral Revista Venezolana*. 2014;7(13):41-55.
13. Asheim BT, Isaksen A. Regional innovation systems: the integration of local 'sticky' and global 'ubiquitous' knowledge. *The Journal of Technology Transfer*. 2002;27(1):77-86.
14. Marshall A. *Principles of Economics*. 8th ed. London: MacMillan and Co; 1920.
15. Cummings JN, Kiesler S. Collaborative research across disciplinary and organizational boundaries. *Social Studies of Science*. 2005;35(5):703-22. <https://doi.org/bkv69w>.
16. Albornoz M, Alfaraz C. Redes de conocimiento: construcción, dinámica y gestión. Buenos Aires: Redes, Centro de Estudios sobre Ciencia, Desarrollo y Educación Superior; 2006.
17. Shrum W, Chompalov I, Genuth J. Trust, conflict and performance in scientific collaborations. *Social Studies of Science*. 2001;31(5):681-730. <https://doi.org/c55cbm>.
18. Granovetter MS. The strength of weak ties. In: Leinhardt S, editor. *Social networks. A Developing Paradigm*. Part IV. Academic Press; 1977. p. 347-367. <https://doi.org/gg9zrp>.
19. Organization for Economic Co-operation and Development (OECD). *Open Innovation in global networks*. Paris: OECD publications; 2008 [cited 2021 Jul 26]. Available from: <https://bit.ly/3l6eHma>.
20. Layani B, Molero J, Fernández-Crehuet JM. The Digital Basic Capacities in the Innovation Union Scoreboard: Exploring Key But Yet Directly Missing Inputs. *Journal of Business and Economics*. 2018;9(2):167-84.
21. Schumpeter JA. *Capitalism, Socialism and Democracy*. New York: Harper and Row; 1942.
22. Luján-Villar JD, Luján-Villar RC. Complejidad y ciencia de sistemas: aproximación a su impacto actual en el mundo. *CienciAmérica: Revista de Divulgación Científica de la Universidad Tecnológica Indoamérica*. 2019;8(2):103-22.
23. Bozeman B, Boardman C. *Research collaboration and team science: A state-of-the-art review and agenda*. London: Springer; 2014.
24. Lins-Ribeiro GL. El precio de la palabra: la hegemonía del capitalismo electrónico-informático y el *googleísmo*. *Desacatos*. 2018;56:16-33.
25. Ynalvez MA, Shrum WM. Professional networks, scientific collaboration, and publication productivity in resource-constrained research institutions in a developing country. *Research Policy*. 2011;40(2):204-16. <https://doi.org/ddvx4x>.
26. Wellman B, Gulia M. Net-surfers don't ride alone: Virtual communities as communities. In Wellman B, editor. *Networks in the global village*. New York: Routledge; 1999. p. 331-366.
27. Bozeman B, Youtie J. *The strength in numbers: the new science of team science*. New Jersey: Princeton University Press; 2017.
28. Duque RB, Ynalvez M, Sooryamoorthy R, Mbatia P, Dzorogbo DBS, Shrum W. Collaboration paradox: Scientific productivity, the Internet, and problems of research in developing areas. *Social Studies of Science*. 2005;35(5):755-85. <https://doi.org/b46796>.
29. Uribe-Zirene JdD, Cuadros-Mejía A. Caracterización de las Redes Científicas Interinstitucionales Universidad Pontificia Bolivariana Sede Medellín-Colombia. *Journal of Technology Management & Innovation*. 2013;8(Suppl 1):44. <https://doi.org/gpv8>.
30. Hagedoorn J, Link AN, Vonortas NS. Research partnerships. *Research policy*. 2000;29(4-5):567-86. <https://doi.org/b85vrb>.
31. Borondo J, Borondo F, Rodríguez-Sickert C, Hidalgo CA. To each according to its degree: The meritocracy and topocracy of embedded markets. *Sci Rep*. 2014;4:3784. <https://doi.org/gpwh>.
32. Ranking of researchers in Colombian Institutions according to their Google Scholar Citations public profiles. *Ranking Web de Universidades*; 2017 [cited 2017 feb 20]. Available from: <https://bit.ly/3BMB7Pk>.
33. Martín-Arribas MC. Diseño y validación de cuestionarios. *Matronas Profesión*. 2004;5(17):23-9.
34. García de Yébenes-Prous MJ, Rodríguez-Salvanés F, Carmona-Ortells L. Validación de cuestionarios. *Reumatol Clin*. 2009;5(4):171-7. <https://doi.org/bgkw84>.
35. World Medical Association (WMA). *WMA Declaration of Helsinki – Ethical principles for medical research involving human subjects*. Fortaleza: 64th WMA General Assembly; 2013.
36. Asheim B, Coenen L, Moodysson J, Vang J. Regional innovation system policy: A knowledge-based approach. *Papers in Innovation Studies 2005/13*. Lund: CIRCLE -Centre for Innovation, Research and Competence in the Learning Economy; 2005.
37. Asheim B, Coenen L, Vang J. Face-to-face, buzz, and knowledge bases: sociospatial implications for learning, innovation, and innovation policy. *Environment and Planning C: Government and Policy*. 2007;25(5):655670. <https://doi.org/c26sgt>.
38. The World Bank. *Research and Development Expenditure (% Of GDP)*. Washington: The World Bank [cited 2019 May 25]. Available from: <https://bit.ly/3C2yb0g>.
39. The World Bank. *Researchers in R&D (per million people)*. Washington: The World Bank [cited 2019 May 25]. Available from: <https://bit.ly/2YJwOoW>.
40. Ríos-Flores JA, Castillo-Arce ML, Alonso-Bajo R. Efectos de la capacidad de absorción tecnológica en el crecimiento económico. *Revista Iberoamericana de Ciencia, Tecnología y Sociedad-CTS-*. 2017;12(34):197-222.
41. Batista-Fogueta JM, Coenders G, Alonso J. Análisis factorial confirmatorio. Su utilidad en la validación de cuestionarios relacionados con la salud. *Medicina Clínica*. 2004;122(1):21-7.
42. Polanyi M. *The Tacit Dimension*. Chicago: University of Chicago Press 1966.
43. Gaillard J, Arvanitis R. Science and technology collaboration between Europe and Latin America: Towards a more equal partnership. In: Gaillard J, Arvanitis R, editors. *Research collaboration between Europe and Latin America: Mapping and understanding partnership*. Paris: Éditions des archives contemporaines; 2013. p. 1-22.
44. Cruz-Gómez I, Miquel-Verd J. La fuerza de los lazos: una exploración teórica y empírica de sus múltiples significados. *Empiria. Revista De metodología De Ciencias Sociales*. 2013;(26):149-74. <https://doi.org/gqbr>.
45. Chaminade C. Regiones competitivas en una economía global: análisis de los vínculos entre variedad regional y modos

- de inserción en redes globales de innovación. ICE, Revista de economía. 2012;1(869):133-48.
46. Martin R, Moodysson J. Comparing knowledge bases: on the geography and organization of knowledge sourcing in the regional innovation system of Scania, Sweden. *European Urban and Regional Studies*. 2013;20(2):170-87. <https://doi.org/fz3764>.
47. Saxenian A. Transnational communities and the evolution of global production networks: the cases of Taiwan, China and India. *Industry and innovation*. 2002;9(3):183-202. <https://doi.org/bp3f57>.
48. Castellacci F, Archibugi D. The technology clubs: The distribution of knowledge across nations. *Research Policy*. 2008;37(10):1659-73. <https://doi.org/bkfz73>.
49. Cohen WM, Levinthal DA. Absorptive capacity: A new perspective on learning and innovation. *Administrative Science Quarterly*. 1990;35(1):128-52. <https://doi.org/bq7hw5>.
50. Andújar-Nagore I. La movilidad internacional de los investigadores Y sus redes científicas de colaboración: Dos dinámicas entrelazadas. Un estudio desde la Economía del Conocimiento [dissertation]. Madrid: Universidad Rey Juan Carlos; 2012.
51. Ogara M. Presentación Programa Iberoamericano De Ciencia Y Tecnología Para El Desarrollo. Programa CYTED. San Juan, Argentina: CYTED; 2019 [cited 2020 Mar 30]. Available from: <https://bit.ly/3yf1VFZ>.
52. Plechero M, Chaminade C. Spatial distribution of innovation networks, technological competencies and degree of novelty in emerging economy firms. *European Planning Studies*. 2016;24(6):1056-78. <https://doi.org/f9r6sf>.
53. Wagner CS, Whetsell TA, Mukherjee S. International research collaboration: Novelty, conventionality, and atypicality in knowledge recombination. *Research Policy*. 2019;48(5):1260-70. <https://doi.org/ghtk45>.
54. Murillo-Aceituno C. Factores asociados al éxito en el funcionamiento y participación, de investigadores en Redes Científicas de Ciencias Médicas en Colombia [dissertation]. Madrid: Facultad de Ciencias Económicas y empresariales, Universidad Complutense de Madrid; 2020.

Annex 1. First survey.

Network features	Please specify the geographical area to which it belongs
	No. of participating countries:
	No. of network nodes:
	Name of the network
	Start year
Characteristics of the researcher	Duration
	Please specify the research area to which you belong
	Time spent on research in your daily work
Impressions of network operation	Professional area in which you work
	Type of research you carry out
	Did you go through some kind of selection process to be able to participate in the network?
	If you went through a selection process, please describe it briefly
	Are you the network coordinator?
	Do you think the network is ideal?
	Is there an action plan with task description and assignment?
	Are the objectives well defined?
	Is the level of communication good?
	Do you achieve the expected results?
	Did you select participants appropriately in relation to the objectives?
	Did you consider possible conflicts related to the capabilities of the members?
	Do members who are more experienced in the subject matter help in the training of those with less expertise?
	Do network participants meet the commitments?
	Is there participation and consensus among members?
Is there efficient network coordination?	
Are there agreements on the active participation of members?	
Is there a willingness to embrace cultural differences?	
Are there any agreements on the use of results?	
Funding	Is there a network funding scheme in place?
	Is the financial endowment sufficient for its maintenance?
Knowledge results	Do you have enough funds for the maintenance of administrative staff?
	Type of knowledge that is most commonly used in network relationships:
	Do you think that participation in the network provides you with knowledge that is unavailable or difficult to obtain through your country's knowledge sources?
	Do you consider that the knowledge acquired is complementary to what you have learned from national sources?
Innovation results	If yes, please describe how you believe it complements national sources
	In case of generating innovations, what type of innovations?
	Please describe the results expected from participation in the network
Overall results	Please describe the results obtained from participation in the network
	Cohesion of the scientific community
	Creating a space for interaction among researchers
	Promoting spaces for multidisciplinary interaction
	Generating a culture of cooperation
	Identifying priority and collaborative lines
	Identifying and strengthening leadership
	New drugs
	New biomarkers
	Meetings
	Publications
	Training: courses, seminars, workshops
	Patents
	Products
	Books
Infrastructure exchange	
Guidelines or new disease treatment procedures	
Other (interoperation, multicenter studies, public policies, community interventions, mobility)	

Annex 2. Second survey

1. You have achieved knowledge results (publications, products, etc.) using your **own network of contacts.**
Describe the result:
2. You have **physically shared** working time with that person or people with whom you have obtained research results, stay in another country, joint works, etc. (You should be able to assess whether knowing each other physically creates stronger ties that encourage collaboration and knowledge exchange).