Is Modern Science Evolving in the Wrong Direction?

Jaffe K
Simon Bolivar University, Caracas, Venezuela

Keywords: International collaboration; National; Science; Humanities; Policy

Abstract

The present politically correct consensus is that increased exchange of scientific insight, knowledge, practitioners and skills at the global level brings significant benefits to all. The quantifiable scientometric changes during the last decade, however, suggest that many areas of knowledge are evolving in the opposite direction. Despite an increase during the last decade of the numbers of journals and academic articles published, increases in the number of citations the published articles receive, and increases in the number of countries participating; important parts of the academic activity are becoming more nationalistic. In addition, international collaboration is decreasing in several subject areas, and in several geographic regions. For example, countries in Asia are becoming scientifically more isolated; and academics working in the humanities in all the regions of the world are very nationalistic and are becoming more so. The precise consequences of this dynamics are difficult to predict, but it certainly will have reverberations beyond academia. The tendency of the humanities to become more provincial will certainly not help in reducing international conflicts arising from poor understanding of cultural differences and of diverging sociopolitical world views. Happily, these tendencies seem to be slowing and even reverting from 2011 to 2015.

More and better data on these trends should give us a better understanding for eventually improving academic policies worldwide.

Introduction

The emergence of empirical science was the foundation for the revolution in technological expertise that triggered the industrial revolution, which marked the world economy during the last few centuries [1]. From its beginnings, science was based on international collaboration. Yet science has changed since the days of Galileo, Newton and the foundation of the Academia dei Lincey in 1603 and the Royal Society in 1660. The way we value and promote the different sciences affects our economies [2]. Knowing how modern sciences are changing and how they will look in future is essential if we want to understand and manage future economic developments.

Different sciences and scientific disciplines cultivate different values and attitudes and show differences in quantifiable characteristics [3-6]. We also know that the development of different scientific disciplines has different effects on economic growth. For example, the subject areas with the largest relative number of publication in wealthy countries today are neuroscience and psychology; investment in these areas however does not produce economic growth in less developed countries. In contrast, middle income countries that give more value to basic natural science in each time period show faster economic growth in the following years [7], showing that the structure of the national scientific ecosystem affects society. Additionally, countries whose researchers are less provincial and cite more works from countries different to theirs (have fewer country self-citations) are also those whose scientists produce relatively lower numbers of author self-citations. These countries are the ones producing scientific papers with higher overall citation impact [8].

A recent report by the Royal Society of London [9], stresses that international collaboration improves the quality of the scientific papers produced, that Science is increasingly global and multipolar; that the scientific world is becoming increasingly interconnected, with international collaboration on the rise forming networks that span the globe. The report emphasizes a future for exchange of scientific insight, knowledge and skills, with a change of focus of science from the national to the global level that will bring significant benefits to all.

The question posed in the present paper is if modern academia is evolving in this direction. Improving our understanding of the changing patterns of science, scientific institutions and academic collaboration, is essential to identify the opportunities and benefits of international collaboration, to consider how they can best be realized, and how they can be harnessed to tackle global problems more effectively.

Methods

To answer these questions, changes in available quantitative scientometric variables were computed from 21135 journals, for 20 different subject areas, grouped by Scopus, and reported by SCImago [10] on April 2014 and 2017. Only data from 1999 to 2015 were available (some journal issues appear years after their listed publication year). Data on international collaboration was only available until 2012. The variables analyzed are summarized in Table 1.

Results

The results from this analysis revealed various features that differ between subject areas. For example, different subject areas vary in the number of papers their journal publishes. During the 12-year period studied, all subject areas increased the number of their journals, the average number of papers published in these journals, and the number
of citation per article published. The relative difference between subject areas in the number of journals and average number of papers per journal changed little during this period (Figure 1).

This analysis shows that in the two different time periods studied, the number of journals in each subject area correlated with the number of countries in which the scientist publishing the papers came from.

| IC | International Collaboration: Proportion of document with affiliations from more than one country |
| Journals | Number of Journals tracked by Scopus in a given subject category |
| Doc/Jour | Number of citable documents per journal in a given subject category |
| Countries | Number of countries reported in the addresses of the authors of the papers in that subject category |
| Ref/Doc | Number of references in the papers published in that subject category |
| Cit/Doc | Number of citations received during the following 3 years after publication by papers in that subject category |
| CSC | Level of provinciality or degree of country-self citation measured as the proportion of citations from the same country as the source paper. Country self-citations include author-self citations |

Table 1: Quantitative variables used

That is, the more journals the subject areas possessed, the more diverse the countries that had active scientists in the subject category. Another visible trend is that the citation impact (Cit/Doc) was proportional to the number of documents published per journal (Doc/Jour), but not to the number of journals in each subject area (Journals). In addition, subject areas with journals with high number of publications (Pub/Journals), published papers with relatively lower country-self-citation rates (CSC). That is, subject areas with high average citation rates published more papers per journal, and those papers had relatively lower country-self-citations.

A finer quantitative statistical analysis of the scientometric differences between the 20 subject areas studied is presented in Table 2.

| Variables | Journals | p | Doc/Jour | p |
|-----------|----------|---|----------|---|
| Countries 1999 | 0.68 | 0.001 | 0.04 | 0.9 |
| Countries 2011 | 0.69 | 0.001 | 0.12 | 0.6 |
| Ref/Doc 1999 | -0.02 | 0.9 | -0.37 | 0.1 |
| Ref/Doc 2011 | -0.08 | 0.7 | -0.13 | 0.6 |
2011 in most disciplines (Figure 2B), except for areas such as Multidisciplinary science seems to be particular in that it has few had the highest country-self-citations, together with Iran, in 1999. o 1999 is 0.68) that decreased its CSC. journals, maintains a high impact factor and was the only subject area in scientific activities (Figure 1), they also increased their CSC (Figure 2A), except in multidisciplinary sciences (with a low CSC). The arts and humanities with one of the highest CSC, slightly increased CSC further although. That is, all academic subject areas, except multidisciplinary science, are becoming more nationalistic or provincial. Multidisciplinary science seems to be particular in that it has few journals, maintains a high impact factor and was the only subject area that decreased its CSC. This trend decelerated and even reverted after 2011 in most disciplines (Figure 2B), except for areas such as Computer Science, Veterinary medicine, Mathematics, Health, Chemistry and Physics, which continued their trend towards provincialism. A separate analysis showed that the trend in International Collaboration (IC) was very heterogeneous between the geographical regions studied (Figure 3). The Pacific region had the third highest IC in 1996 and increased to first place in 2004. Western Europe and North America also increased their IC reaching second and fifth place respectively in 2012. But Latin America, Eastern Europe and the Asian Region reduced their IC between 2004 and 2012. The Asian Region had the worst IC in all years. In Figure 4 we compare the region with the second highest rate of IC, Western Europe, with Asia showing the lowest IC. In both regions, Humanities had the lowest IC whereas Multidisciplinary Sciences and Physics in Western Europe, and Economics and Psychology in Asia, were the subject areas with the highest IC.

| Ratio                | Ratio Country | Ratio Cit/Doc | Ratio Ref/Doc | Ratio CSC |
|----------------------|---------------|---------------|---------------|-----------|
| Country              | 0.65*         | -0.38         | -0.54*        | -0.23     | 0.15      |
| Cit/Doc              | L             | -0.46*        | -0.05         | -0.38     | -0.11     |
| Ref/Doc              | L             | 0.02          | 0.78*         | 0.57*     |           |
| CSC                  | L             |               | 0.01          | -0.08     |           |
| Doc/Jour             | L             |               |               | 0.63*     |           |

Table 2: Correlation coefficients of the relationship between different bibliometric measures taken in the same year for the different subject areas. (For example, the correlation between the number of countries reported in the publications and the number of journals in that subject area in 1999 is 0.68)

If we focus on the change during the 12-year period, we detect a pattern of statistically significant correlations (Table 3) that shows that increases in journal numbers (Journals) correlated with increases in the number of countries participating (Countries), but negatively with number of articles in the reference list of these papers (Ref/Doc). It also showed that the change in citation impact (Cit/Doc) correlated negatively with the expansion in number of countries participating (Countries), but positively with the change in the degree of country-self-citation (CSC) and with number of documents published per journals (Doc/Jour). Increases in country-self-citations (CSC) correlated with increases in citation impact (Cit/Doc) and with increases in number of documents per journal (Doc/Jour). That is, subject areas with many new journals, publishing articles with fewer references per paper, and had higher country-self-citations. Ratio Doc/ Jour. These changes in time are presented graphically in Figure 2 which shows that, except for multidisciplinary sciences and art and humanities, all subject areas increased their citation impact (Cit/Doc 2011/Cit/Doc1999), and to a lower degree, also their country-self-citations (CSC2011/CSC1999). The subject areas with the largest increase in citations and the ones with the largest increase in country-self-citations were the ones which had the lowest citation impact in 1999.

Table 3: Correlation coefficients comparing the changes in bibliometric variables of the subject areas from 1999 to 2011, expressed as the ratio of the variable for 2011/1999. * indicate correlations with p<0.05 and ** p<0.01.

These trends were similar for world wide data and data for the USA only, the country with the largest scientific activity in the world (19.5% of the total in 2011). The USA however showed some remarkable differences in some subject areas. For example in Computer Science, the increase in country-self-citations was much larger in the rest of the world compared to the USA, but that was due to the fact that the USA had the highest country-self-citations, together with Iran, in 1999.

The data then shows that although all subject areas increased their scientific activity (Figure 1), they also increased their CSC (Figure 2A), except in multidisciplinary sciences (with a low CSC). The arts and humanities with one of the highest CSC, slightly increased CSC further although. That is, all academic subject areas, except multidisciplinary science, are becoming more nationalistic or provincial. Multidisciplinary science seems to be particular in that it has few journals, maintains a high impact factor and was the only subject area that decreased its CSC. This trend decelerated and even reverted after 2011 in most disciplines (Figure 2B), except for areas such as...
Figure 2: Left: Changes in country self-citation rates (CSC) between 1999 and the year 2011 plotted against changes in citation impact (Cit/Doc) during the same time period. The size of bubbles is proportional to Cit/Doc in 1999. The line shows the linear regression. Right: the same plot comparing data from 2011 and 2015. Line indicates ratios = 1. Ratios > 1 show increases from 2011 to 2015.

Figure 3: Percentage of papers with coauthors from different counties (IC) for seven different geographical regions from 1999 to 2012.

The different subject areas showed large variations in their rate of change in IC during the 12 years studied (Figure 5). IC in Arts & Humanities decreased in 2011 compared to 1999 in all four geographical regions, even considering that IC in this subject area was the lowest in 1999. IC among engineers and computer scientists increased in all four regions in that period. In Asia, IC in Business, Medicine and Chemistry increased the most, whereas in Western Europe it was IC in Engineering, Medicine and Psychology. In general, the pattern for North America was similar to that of Western Europe (see SM supplementaries information). Subject areas that showed large IC in North America and Western Europe in 1999, where the ones with the smallest further expansion in IC in Western Europe as assessed in 2011, except Arts & Humanities (Figure 5).

Discussion

The results show that bibliometric trends, reported some decades ago [11-13], continue to be valid. That is, the more basic the field of knowledge, the greater the proportion of international collaboration; and the larger the national scientific enterprise, the smaller the proportion of international collaboration.

Figure 4: Percentage of International Collaboration (IC) in different subjected areas in Asia plotted against IC in Western Europe. The size of the bubbles is proportional to the citation impact (Cit/Doc) in of the subject area in 2011.

The data reflect the many new online journals started by scientists in an increasing number of countries during the last decade, increasing the overall number of journals and the number of countries participating in the scientific activity of the different subject areas. Some subject areas, such as Multidisciplinary Science, have fewer journals publishing more articles, whereas others, such as Medicine, have many journals, each one publishing fewer articles. This difference was maintained during the period studied. Thus, some characteristics of subject areas seem to be resilient to change despite the large increment in journals.
The surprising result of this study is the tendency in the last decade for several areas to increase their country self-citations and to decrease their International Collaborations.

That is, several subject areas and several geographic areas are become more provincial, where some disciplines and countries become more isolated respect to scientific activity, a trend completely opposite to that recommended by the Royal Society [9]. This policy document concluded that international "collaboration brings significant benefits, both measurable (such as increased citation impact and access to new markets), and less easily quantifiable outputs, such as broadening research horizons. The facilitation of collaboration, therefore, has a positive impact not only on the science conducted, but on the broader objectives for any science system (be that enhancing domestic prosperity or addressing specific challenges)."

International Collaboration was highest and continued to expand faster in subject areas related to basic natural science, and was lower and increased less in areas of applied sciences and the humanities. This trend is consistent with the advice of some politically influential economists [14,15] for example who recommend nations to focus on applied research relevant to their specific national problems. They advise countries to plan their scientific activity to achieve practical. It is thus very interesting to observe the economic success of countries not following this recommendation, but that invest relatively more in basic natural science [7].

The present analysis favors the view that focusing on fomenting basic research might foment more international collaborations, because we know that applied research foments less international collaboration than basic research in natural sciences [11].

International Collaboration in basic research spills over other areas, strengthening competitive advantages developed through international competition, unleashing synergies that stimulate economic growth [16]. Politicians and humanists in general believe in the unbound capabilities of our mind to plan our future. Basic science though acknowledges that the future is often unpredictable, and works fomenting synergies and favoring creative serendipity.

Clearly, the health of all parts of the present international academic system is not robust. Several subject areas have become less international, and several countries are becoming academically more isolated. Happily, this trend seemed to decelerate during 2011-2015, possibly due to important facilitation of international cooperation offered by cloud IT, such as Research Gate, Mendelev, Google Scholar and many others. The consequence of this dynamics is difficult to predict, but it will have reverberations beyond science, and thus should be studied more carefully. The tendency of the humanities to become more isolated will certainly not help in reducing international conflicts arising from poor understanding of cultural differences and of diverging sociopolitical world views. More and better data on these trends should give us a better understanding for eventually improving policies fomenting knowledge in general and science and humanities in particular worldwide.

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Supplementary material

**Figure SM 1:** Ratio of change in International Collaboration. Subject areas are ranked according to the percentage of papers with International Collaborators in North America in 1999, from the highest: physics 37.1%, to the lowest: Social Science 7.8%. Ratios above 1 indicate growth; ratios below 1 indicate reduction in international collaboration.

**Figure SM 2:** Rate of change in International Collaboration (IC) expressed as IC in 2011/IC in 1999. This rate for different subjected areas in North America is plotted against that in the same subject areas Western Europe.

**Figure SM 3:** Percentage of International Collaboration (IC) in different subjected areas in Asia plotted against IC in Western Europe for 1999 and 2011. The size of the bubbles is proportional to CSC in North America.