A narrative on the fabrication of results in science

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Data fabrication is an act of scientific misconduct that affects its transparency and veracity. In this study we identify the main data fabrication problems in scientific research and suggest prevention methodologies. This article is a narrative review of the major articles in fabrication of results in science. The results of this review provide the knowledge that fabrication cases come from most diverse scientific fields. Currently, there is more pressure on scientists to publish. As a result, several studies now report on data fabrication in research. State laws and research ethics committees strengthen relationships to criminalize this type of misconduct that usurps state funds. This study discusses the controversies and complexities of data fabrication in scientific research. Ethics committees must continue their efforts to prevent data fabrication, thus contributing to scientific transparency.

Keywords: Criminalization, data fabrication, scientific misconduct, transparency.

SCIENTIFIC misconduct does not stop with a decline in morality and increase in competition in obtaining research funds. Instead, very well structured, accusations of scientific misconduct, stand in the history of science itself from ancient Greece to the present day¹. Although the respective federal agencies nuclearize the concept of scientific conduct to review and disseminate research, experts have a more popular view². According to the Council of Scientific Editors (CSE), scientific misconduct is 'the behaviour of a researcher, whether intentional or not, which falls short of a good ethical and scientific standard'³.

Currently, there is pressure on researchers to publish frequently and in high-impact journals⁴. Bibliometric assessment is used to enhance productivity and distribution of resources⁵⁻⁸. However, in another way, the financial resources available for such efforts are clearly inadequate. Therefore, competition for these limited funds has created a hostile environment and is highly favourable to the appearance of scientific misconduct.

The competitive level in science is changing and concerns that this may alter scientific knowledge are being debated⁹⁻¹¹. The findings of published research are sometimes refuted by subsequent evidence, resulting in confusion and disappointment¹². Between 2000 and 2017, 15,000 articles were published on research misconduct¹³.

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Current data show that, the success rate of eligible proposals in the Universities for the year 2015 was only 14%; as governments decrease funding, the pressure on universities to obtain funding from other sources increases, including the UE and the private sector¹³.

Data fraud can have four types of external effects¹⁴. It can damage the career of colleagues and students, who unknowingly co-write articles with a fraudulent researcher. In clinical cases, patients may suffer due to lack of information about the effectiveness of different treatment options. Fraud can slow down scientific progress, because researchers waste precious resources (funds as well as time) trying to follow the clues from dubious research. Finally, notes on scientific fraud damage the image of the field in which the fraud was committed and reduce the confidence of science. Scientists involved in fraudulent research can face adverse social, financial and legal consequences¹⁵. Recently, a study of 10,500 articles retracted until 2016 showed that 0.04% was retracted; the annual retraction rate was around 1000. The rate of increase is slowing down since 2012, and 43% of the 946 articles retracted in 2014 were due to FFP (fabrication, falsification and plagiarism)¹⁶.

Literature on ethics in scientific research shows the frequency of production of results, increasing society's lack of trust in the scientific community. Thus, the present study reviews the results of data fabrication in science.

Methodology

We began with a narrative review of the literature to analyse data fabrication in science, followed by a synthesis

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of the results, combined with a reflective perspective from the authors. The study was carried during November–December 2020 using the databases PubMed and Google Scholar. The inclusion criteria were (1) complete articles and (2) English or Portuguese language. The articles focused on data fabrication in science, on authors and their responsibilities on the fabrication and misconduct in scientific research and the ways of preventing them. Exclusion criteria were: (1) abstracts, (2) conference proceedings, (3) general science misconduct articles and (4) books. The search resulted in 56 articles from a diversified list of scientific fields. We then synthesized the main concepts on data fabrication.

Data fabrication

Data fabrication is a large concept in society and it is essential to distinguish it in the context of the ethical problems of scientific research. In this context fabrication is the report of a set, total or partial, of data that does not exist and were invented. For this, the way to obtain them is forged, or includes the description of experiences that have never been carried out^{17,18}. As the opposite of telling the truth, the quintessential form of conduct of unethical research, but when the scientific baggage is removed, fabrication represents the activity of combining, shaping and/or organizing the elements as a whole for a specific purpose¹⁹.

During studies, misunderstandings between fabrication (presentation of facts or unproven data) and falsification (alteration or selection of certain data to obtain the desired results) should be strictly avoided²⁰. Particularly in the scientific community in the United States, fabrication is considered a form of research misconduct, often associated with the term 'falsification'¹⁹.

Fabrication, falsification and plagiarism

Despite the causes and estimates of misconduct in scientific research, the problem remains diverse. The literature suggests that scientific misconduct, namely fabrication, falsification and plagiarism in research, continues to damage public health and confidence in science. Thus, it should be relevant to establish the concepts and the consequent differences.

During studies, misunderstandings between fabrication (presentation of facts or unproven data) and falsification (alteration or selection of certain data to obtain the desired results) should be strictly avoided²⁰. Some of the great scientists of the past such as Galileo, Newton, Dalton, Mendel, Millikan and Einstein have been accused of fabricating, falsifying and plagiarizing data^{21,22}. Both fabrication and falsification are ways of lying about the data reported in an article²³. Forgery is manipulating materi-

als, equipment or research processes, or altering or omitting data or results so that the research is not accurately represented in the search log.

Plagiarism is qualitatively different from the other two because it does not distort scientific knowledge, although it has important consequences on the career of those involved and, therefore, on the entire scientific community²⁴.

The frequency of fabrication in science

There is a notion that fabricated results tend to be uncovered due to the self-regulatory mechanism of research regulation²⁵. This is certainly far from the truth, leading many scientists to believe that no action on their part is necessary.

According to a survey of 549 students at the University of California, 15% admitted that they would be willing to select, omit, or fabricate data to win a grant or publish a paper²⁶. In a similar survey, 7% of postdocs at the University of California, San Francisco, said they were willing to select or omit data to improve their results²⁷.

Judith Swazey and her colleagues, covering undergraduate students and professors at 99 universities, found that 44% of students and 50% of the faculty were aware of two or more types of misconduct, and approximately 10% observed or had direct knowledge in the manufacture of data²⁸. The American Association for the Advancement of Science surveyed a random sample of its members and 27% of respondents said they admitted that they found or witnessed research that was fabricated, falsified or plagiarized in the past 10 years²⁹.

A meta-analysis of published research was done that asked scientists whether they or their peers had already committed acts of scientific misconduct. Approximately 2% of respondents admitted to having committed scientific misconduct and 14% reported knowledge of such behaviour by their peers³⁰. In the same context, it is suggested that there is evidence consistent with the 'deliberate fraud' hypothesis; the results suggest that articles based on manufactured or falsified data represent a calculated effort to deceive, inferring that obviousness is not naive, irresponsible or inadvertent³¹.

The case of Diederik Stapel, that published more than 50 influential studies, including subjects that indicate dirty environments encourage racism, that eating meat makes people selfish and that power undermines morality. Some of these studies elevated his academic career, before some of his students denounced him³².

In the last four decades, there has been a tenfold increase in retractions for fraud or suspected fraud since 1975 (ref. 33). The respective rates have varied between high levels in academic disciplines, such as cell biology and oncology and low levels such as in sociology and political science³⁴. This fact reflects that in terms of criteria

they are more objective and the respective medical consequences are more serious in the area of health than in other social sciences; comparatively in the case of psychology it was an intermediate rate³⁴.

The fabrication of data is not restricted to just a laboratory or university. It can be an act with external ramifications³⁵.

In a study in the field of social psychology and personality, the authors found that in their sample, researchers had the feeling that the authors presented themselves as 'the field as a whole can be very rotten', In the field of psychology, over three decades, more than half of the data contained inconsistencies in the report of *P*-values that often led to false conclusions about statistical significance³⁷.

Data fabrication in scientific research is not limited to the social sciences, but also in the business world and in the industry.

A study showed that Google secretly paid US\$ 5000–400,000 to academics to help prevent changes to the market regulations that maintain the company's dominance³⁸. Cases in the food industry have also shown that scientific research financed by certain brands that produce foods whose effects need to be tested, led to results that helped omit or cover up the real harmful consequences on consumers' health³⁸. Another case more specifically in the automotive industry was one carried out by a team from West Virginia University, USA, which unmasked Volkswagen's fraudulent and environmental pollution practices regarding its diesel cars³⁹.

Criminalization in data fabrication

The phenomenon of research misconduct is an international concern. In the 1980s, highly publicized cases of misconduct in Government-funded research in the US, alerted scientists and lawmakers to the importance of the problem. Such misconduct scandals have occurred in many other countries since then, covering Canada, China, Denmark, Germany, Italy, Japan, The Netherlands, South Korea and the United Kingdom^{40,41}.

Public policies and scientific ethics committees must guarantee the integrity of science so that discoveries made in a fraudulent manner are not integrated into the body of scientific knowledge. In addition to the administrative performance of the committees, there should be civil law penalty. The use of federal or state funds resulting from false or fraudulent publications can lead to civil penalties.

The general public must expect the punishment for fabrication by scientists to be equivalent to that of other sectors of our society⁴².

Data fraud leads to wasting millions of dollars of Government funds^{43–45} and also poses substantial risks to society and public health⁴⁶, being responsible for thou-

sands of deaths⁴⁷. There is widespread agreement among scientists that such behaviour is morally wrong and must be sanctioned^{44,48,49}.

In the past three decades, criminalization has been witnessed in scientific research; however, only 39 scientists from seven countries were subject to criminal sanctions between 1979 and 2015 (ref. 48).

One such case is that of Eric Poehlman, a medical scientist at the University of Vermont, USA, who published 10 articles containing fabricated data to support his study of metabolic changes in women. His studies cost the government US\$ 2.9 million and was the first US scientist to be arrested for scientific fraud⁵⁰. Also in the United States, on 1 July 2015, a judge passed a 4.5-year prison sentence and US\$ 7.2 million fine to scientist Dong-Pyou Han for tampering with HIV research data⁵¹.

Data fabrication in medical research can lead to two major problems. First there will be an erosion of confidence in the general validity of scientific discoveries, which may imply a slowdown in the pace of research, as researchers spend more time trying to confirm the work of others. Secondly, fraud or deception can cause a patient's treatment to be based on less firm scientific evidence, and therefore may not have the expected benefit and possibly cause damage to patients¹⁸.

In the case of sports science also data fabrication is considered a harmful practice, as it affects the reliability of the data and reduces the validity of research in the long term⁵².

Trends for the future

Given the current situation, Merton's⁵³ concept that scientific ethos is the search for knowledge, which would be produced in compliance with the principles of a scientist's disinterest, the spirit of community and the sharing of knowledge among peers is not valid is out of the question

The objective of research should be to increase knowledge and develop new ideas with important consequences to the whole society. Due to its crucial role, the importance of integrity in research cannot be overestimated⁵⁴. It seems evident that policies of scientific misconduct are not just a good idea, but a need⁵⁵.

Investigating and prosecuting allegations of misconduct related to international collaborations can be difficult since different countries have different laws, regulations and policies in relation to research misconduct⁵⁶. Some organizations and academics have requested the global research community to develop international guidelines to harmonize conflicting rules of misconduct^{15,56,57}.

The incorruptibility of scientific records, and their precision, dominance and value in the final analysis impact the health and well-being of society. Thus, scientists must use the highest possible standards while proposing, conducting, reviewing and reporting research, or when educating and mentoring new researchers⁵⁸. Prevention methods should be emphasized, especially by observers and juries with experience in various stages of research, with regard to academic misconduct.

In the literature and political disputes at the international level on the integrity of research, the focus is on research institutions on a daily basis, with a strong drive to encourage them to strengthen standardized policies, guidelines and operational procedures⁵⁹. However, as analysis demonstrated, that department heads did not seem to use organizational policies in their sense making around research integrity⁶⁰. Science now needs to strengthen relations with economic and political stakeholders^{61,62}.

Members of the scientific community draw an ethical distinction between data fraud and selective reporting, but consider both behaviours as immoral and deserving of punishment⁶³. In the same vein, several statistical methods are available to evaluate whether the data are likely to be manufactured or not⁶⁴.

Conclusion

The responsibility for conducting research is the basis for sound scientific practice. Over the past few decades, the scientific community and the respective ethics committees have gained knowledge for improvement in achieving clarity about the results produced, as well as the claims and sanctions associated with this type of practice.

Fabrication is a phenomenon that scientific system has faced since its creation and it is considered a problem that causes losses, and the numbers of its incidences cannot be easily verified by qualitative or quantitative methods.

It is unlikely that a global organization will criminalize this act, but efforts are made to ensure that there are structures for the same. Nevertheless, this type of misconduct will always be associated with scientific research, being not a symbiosis, but a virus. The digital age has opened the doors to a massive amount of data that are simple and easy to access. It also provides tools for the interpretation of data and analysis of scientific discoveries; however, it can increase cases of plagiarism.

Universities, research institutions, Government organizations and other stakeholders must join efforts to elucidate the effects of fabrication on scientific research.

After all, science is the search for truth.

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