

# Exposome, Health and Biomedical Informatics

## *An Emerging Discipline and Its Interaction with Current Biomedical Informatics*

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**Abstract:** In the last decade we have witnessed the raising of the exposome (the set of a life-long individual exposures) as an increasingly interesting area and discipline due to its relationship with health. These new approaches rely heavily in the use of different informatics related methods and are generating new data types that in the future should be handled by biomedical informatics. This position paper refers to some of the challenges that are related with these new approaches from a biomedical informatics perspective, describing the interactions with related disciplines such as bioinformatics, public health informatics and others. We discuss as well the role of the exposome in bringing new data types that might be handled by biomedical informatics in the context of Big and small data generated in this approaches and its relationship with the participatory medicine and how they could influence future health information systems. Finally, we consider that the current situation of the exposome resembles the early years of genomics, when it was clear that genomic information had a great potential for health and drove a discussion about how to better integrate and analyse the most relevant pieces of information for health purposes.

## 1 INTRODUCTION

Biomedical informatics is a very dynamic discipline that is being influenced by advances in many other areas and scientific disciplines. In the last couple of decades, the revolution in molecular biology, the advances in the understanding and use of genomic information and other technological advances, such as those related with imaging techniques, have driven major changes in the discipline and have even shaped subdisciplines such as translational bioinformatics or imaging informatics.

The relevance of environmental factors for health has been known since the early dawn of medicine but it has been more recently when scientists have had the opportunity to explore and manage these data in a more comprehensive way. It has been this capacity of gathering large amounts of personalised individual exposures what led to the advent of the concept of the exposome.

The exposome concept was coined almost a decade ago (CP Wild, 2005) and it was defined as the life-time set of environmental exposures of an individual. Therefore the exposome comprises any environmental exposure of an individual and it

complements the genome in configuring the final phenotype of an individual and its health status.

The application of the exposome concepts and studies for health purposes makes it automatically an area of interest for biomedical informatics. Despite of the growing interest and relevance of the exposome in the recent years and the importance of some of the informatics associated components it has just recently reached the interest of the biomedical informatics community. Thus it is necessary to identify what areas of exposome informatics are already covered by the current practice of biomedical informatics and what are the new challenges that these approaches are posing for the biomedical informaticians.

In many aspects, from a biomedical informatics perspective, the exposome could be considered in the same situation as genomics were a couple of decades ago, when it started to reach the attention for its potential health applications and it was necessary to identify the new challenges that its integration could pose to develop effective solutions for medicine.

## 2 THE EXPOSOME: AN INTERSECTION FOR DIFFERENT DISCIPLINES

The exposome represents a multidisciplinary challenge involving different scientific disciplines ranging from the design of new sensors and devices (engineering) and development of new data analysis and integration tools (Information Technologies) to public health studies (Medicine). It is therefore an area of convergence where different approaches, methodologies and techniques are combined. An example of aspects covered could be represented by the variety of journals where “exposome” related articles are published (figure 1).

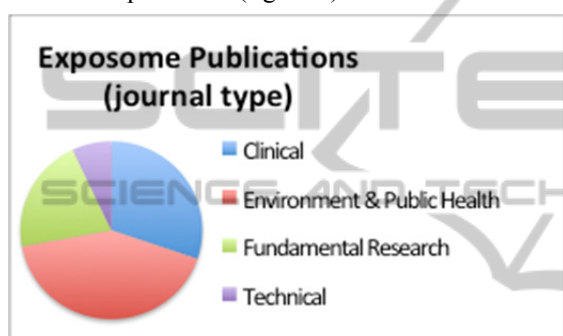


Figure 1: Representation of the orientation of the journals identified in a Pubmed query (October 2014) using the term “EXPOSOME”. The majority of them are related with public health and environment (42%) followed by clinical journals (30%), Fundamental research (covering from biology to chemistry) (21%) and finally Technical Journals (informatics and statistics) (7%).

The exposome serves as well as a good example for the convergence of the different trends in medicine that have been defined in the last years such as molecular, personalised and participatory medicine but also with other more traditional approaches such as public health and epidemiology.

Molecular and personalised medicine have a strong connection with the exposome. Both the exposome and the personalised medicine approaches are based in subject’s individual characteristics and conditions from their very definition and take into account the individual genomic information. In the case of molecular medicine, the relationship is based in the methodologies applied in the studies. Exposome analyses and methods are strongly influenced at the molecular level by toxicogenomics, a discipline related with the study of genomics effects and responses to toxic substances (Nuwaysir EF et al. 1999), and make extensive use of “omics” based techniques and approaches. Probably one of

the best examples are the epigenetic studies that are supported in the major international activities around the exposome.

On the opposite side of the spectra from the molecular and individual approaches we could find the population health perspective of the exposome where it makes use of “traditional” environmental data sources and it is interested on linking exposures and environmental factors to disease burden. The aim of this approach is to identify and make sense of the most relevant exposure factors that are relevant at the individual level. Similarly to what happened in genomics and personalised medicine where the definition of those genomic variants and biomarkers relevant to a certain disease required from population studies and genome wide association studies (GWAS), the exposome requires as well of these approaches and analogously has developed and uses the environmental wide association studies (EWAS) (PM Lind et al. 2013, CJ Patel et al. 2010, SM Rappaport. 2012).

Finally, the exposome also represents a link with the increasingly popular movement of participatory medicine. For a long time exposure data have been gathered from “general” environmental data collection tools, such as environmental stations, public surveys or in a more refined way through occupational health risks surveys and assessments. Nowadays the ubiquity of GPS systems in a multitude of consumer devices has facilitated the linkage between the individual location and the exposure in those non-personal environmental data repositories. Even more, the continuous advances in technology are developing and creating new miniaturised devices that can be used to monitor an increasing range of exposures. Thus the availability and affordability of these sensors is facilitating its inclusion in many portable and wearable devices such as mobile phones (GJ Stahler et al. 2013, MJ Nieuwenhuijsen et al. 2014) and therefore facilitated its use by the general public out of the laboratories. It is therefore, this portability of the new sensors what has enabled the possibility of capturing some real time, exposome data that could be then specifically linked to people’s own health data and could be use for health management purposes.

## 3 EXPOSOME RELATED INFORMATICS

As in many other disciplines informatics has become a key element for its development, taking advantage

of some of the disciplines it is related with. As it was discussed previously, the close relationship between the exposome and toxicogenomics brought the use of different “omics” technologies and with them as well a high relevance of bioinformatics approaches and solutions for data analysis and management. Additionally, exposome approaches are taking advantage of the latest advances in systems biology methodologies and are incorporating and making extensive use of them. This intensive use of bioinformatics serves as a link between the exposome and biomedical informatics. This is so because bioinformatics approaches related with health are considered under the umbrella of biomedical informatics nowadays and due to the increasing interest in the role of the exposome in health, the role of bioinformatics applications in this area should be considered as well. An example of the high relevance of informatics for the exposome approaches can be found in the existence of one or several work packages exclusively devoted to informatics related aspects in the four major international exposome projects. (Table 1).

Table 1: Major international projects involving the study of the Exposome and containing significant informatics work packages.

Project Name
HELIX - The Human Early Life Exposome. It is a European funded project focused in the development of new tools to integrate exposome and childrens' health data <a href="http://www.projecthelix.eu/">http://www.projecthelix.eu/</a>
EXPOSOMICS. It is a European funded projects aiming to predict individual risk related to the environment. <a href="http://www.exposomicsproject.eu/">http://www.exposomicsproject.eu/</a>
HEALS – Health and Environment-wide Associations based on Large population Surveys. It is a European funded project. <a href="http://www.heals-eu.eu/">http://www.heals-eu.eu/</a>
HERCULES – Health and Exposome Research Center: Understanding Lifetime Exposures. It is an US funded project. <a href="http://emoryhercules.com/">http://emoryhercules.com/</a>

### 3.1 The Exposome, Big Data and Small Data

As it has been previously described one of the most relevant characteristics of the exposome is that it is an area where several scientific disciplines converge and intersect with each other. From a data and information point of view, this convergence of multiple disciplines could be translated into a large diversity of data types and sources of interest that

must be dealt with in the analysis of the exposome. The different data types that are involved in the analysis of the exposome range from molecular data associated either with genomic or pollutant data to geographical locations. Additionally large data sets are used in the analysis, coming from a broad variety of sources (again using as an example the integration of population scale “omics” studies and large environmental data sets) that need to be combined. This combination of large volumes and a large variety of data types confers exposome data the category of big data which could be generally characterised by the four “V’s” (Volume, Variety, Velocity and Veracity) (A. McAfee et al. 2012) Even though as it has been discussed before the exposome is a life-long set of exposures (data) implying that this is a temporal data collection, The third V from the big data definition (Velocity) could be arguably considered as well as part of the exposome data characteristics due to the continuity of the measurements that are made during with many of the devices.

On the other hand the individual and participatory component of the exposome related with another increasingly popular topic from an informatics perspective that is “Small Data”. In contrast with Big Data, small data come from the individual digital traces that are created or left continuously in the use of technology (D. Estrin. 2014). These “Small data” are generated as a consequence of the use of the portable devices and self-monitoring practices that could be used to quantify the individual exposures.

Therefore the exposome represents a multilevel challenge for the current biomedical informatics discipline. On one hand the inclusion and development of exposome data as another element of biomedical informatics means an extension of an already existing problem in terms of the needs and requirements to work in “Big Data” environments for data analysis and management. In this regard, the current solutions and approaches would need to be extended to incorporate these new data sources, and many of the solutions already in place would just need to be expanded to accommodate exposome data.

On the other hand dealing with “Small Data” represents a new challenge that its starting to be tackled by biomedical informatics experts. It means a mutual interest area and therefore it represents a common area of development where exposome data should be considered as another source of health related data and therefore should be incorporated into future health information systems. The

challenge in this case is not only developing new methods and ways to capture, manage and analyse these new data sources but also the need to think about the new data sources and new data types that are being captured in these projects. An important and significant difference in this case is that when dealing with exposome “Small Data” we are talking in many cases about data that is being generated by a broad range of devices, that may use or no other standards than those usually used in biomedical informatics. Another challenging characteristic of these new exposome “Small Data” is that they are captured in a continuous way rather than the traditional more or less static (snapshots) data capture processes that have been considered in the development of health information systems.

#### 4 EXPOSOME, INFORMATION LEVELS AND PRECISION MEDICINE

A way to represent the current view of biomedical informatics is based in the analysis of the different information levels covered, going from molecule to population (F Martin-Sanchez et al. 2002). In that model some of the environmental factors and elements that are part of the exposome were scattered across the individual and population levels

but they were not explicitly formulated nor addressed. With the advent and development of the exposome, it is possible to develop an additional vertical layer vertical layer to that model representing the exposome, interacting with all the other layers.

The inclusion of this additional layer to the information and complexity model will create a more comprehensive model facilitating the path for the development of biomedical informatics tools and methods required for precision medicine. Precision medicine has been defined as the outcome of a refined and more accurate definition of the disease based in the integration of different data sources, coming from improved diagnostics tests (that could be molecular or genomic) and personal exposure (exposome), rather than relying on symptoms and other physical signs (Nat. Acad. Sci. 2011). The actual implementation of this precision medicine approach relies heavily in the whole and most comprehensive body of biomedical informatics as a discipline that uses biomedical and health data, information and knowledge.

The actual situation of the exposome informatics presents some similarities with the situation found a decade ago when the first genomic approaches were being developed and there was a need to establish links between bioinformatics and genomics with health informatics. Nowadays, the possibility of

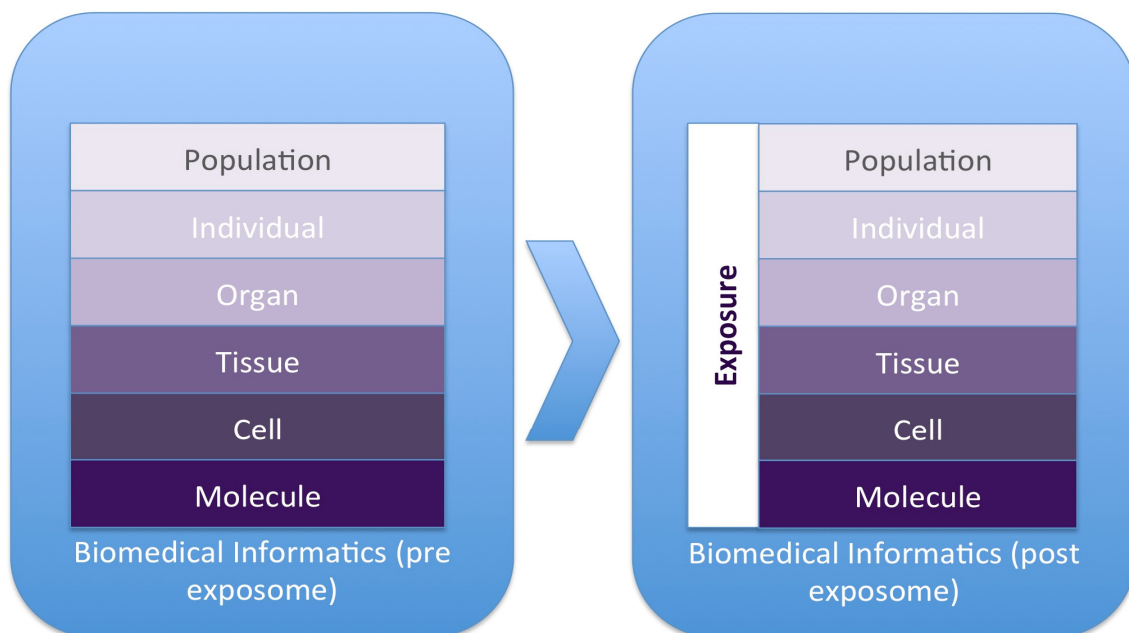


Figure 2: Representation of the expanded health information levels that are covered by biomedical informatics where the new exposure data should be considered as another layer additional to those previously covered by health and biomedical informatics.

effectively capturing and exploiting exposure information is promising for a better classification and understanding of the pathological processes and therefore it requires a response from the biomedical informatics to effectively incorporate this data, information and knowledge with the aim of improving human health and clinical practice.

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