



A New Era of Pharmacovigilance: Future Challenges and Opportunities

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Keywords: pharmacovigilance, pharmacoepidemiology, real-world data, drug safety, regulatory science

INTRODUCTION

Medicines safety monitoring is a continuous and dynamic process throughout all the phases of the life cycle of a drug. During the drug development, safety is investigated in different phases. In pre-clinical studies, the primary goal of safety evaluation is the identification of a safe dose in humans and of safety parameters for clinical monitoring. In clinical phase, phase I studies are designed to estimate the tolerability of the dose range expected to be needed for later clinical studies in healthy volunteers; phase II studies are focused on determining appropriate range of drug doses in patients with a disease or condition of interest, while phase III clinical trials are the most important studies to refine understanding of benefit-risk profile of the drug and to identify less common adverse drug reactions. Although drug safety evaluation is very rigorous and thorough, pre-marketing clinical trials have however intrinsic limitations that do not allow to exhaustively evaluate drug safety profile (Singh and Loke, 2012). These studies are conducted on limited numbers of patients that are selected based on strict eligibility criteria and not fully representing real-world populations and have limited duration, thus preventing detection of rare and long-term adverse reactions.

Therefore, the post-marketing assessment of medicines plays a key role for better defining drugs' safety profile in real-world setting and filling the evidence gap of pre-marketing studies.

In the field of drug safety and regulation, a number of challenges have to be faced in the near future. First of all, COVID-19 pandemic highlighted how relevant pharmacovigilance and proper risk communication during public health emergency are. Second, the development of advanced methodologies including machine learning techniques and the availability of large amount of electronic healthcare data offer opportunity for optimizing drug benefit-risk profile evaluation in real world setting. Finally, innovative therapeutics, such as advanced therapy medicinal products, digital therapeutics, vaccines developed based on advanced technologies, requiring special pharmacovigilance monitoring have been increasingly marketed in recent years, often upon accelerated pathway approval. Some of the challenges and future opportunities in this field are briefly discussed below.

OPEN ACCESS

Edited and reviewed by:

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Received: 31 January 2022

Accepted: 10 February 2022

Published: 25 February 2022

Citation:

Trifirò G and Crisafulli S (2022) A New Era of Pharmacovigilance: Future Challenges and Opportunities. *Front. Drug Saf. Regul.* 2:866898. doi: 10.3389/fdsfr.2022.866898

PHARMACOVIGILANCE IN HEALTHCARE EMERGENCY

During the first waves of the pandemic, the absence of vaccines and drugs for treatment/prevention of COVID-19 led to a rush to repurpose drugs already approved for other indications. As a consequence, a large number of drugs (e.g., hydroxychloroquine, ivermectin and azithromycin) has been off-label used for the treatment of COVID-19 patients, even if underlying scientific evidence on benefits was of low quality and mostly based on *in vitro* studies (Sultana et al., 2020a).

Pharmacovigilance monitoring in this context has been crucial for identifying the risks associated to drugs off-label used, thus reminding the “do not harm first” principle, especially if no or weak

evidence on benefits is available. This is the case of azithromycin, a macrolide antibiotic that has been widely used, for the treatment of COVID-19 patients (Crisafulli et al., 2021). Its known proarrhythmogenic activity, which can be exacerbated when used in combination with other drugs proposed for COVID-19 treatment (e.g., hydroxychloroquine), led regulatory agencies to issue warnings against the use of this drug, unless in case of bacterial superinfection occurrence (Sultana et al., 2020b).

Accelerated approvals of drugs and vaccines to tackle the COVID-19 pandemic emphasized also the need to expedite safety data in post-marketing setting by identifying and preventing serious risks and ultimately ensuring patients' safety.

Another lesson learned from COVID-19 pandemic is the importance of drug- and vaccine-related risk communication to healthcare providers as well as patients for informed therapeutic choice and ease of appropriate use of medicines/vaccines. On the contrary, failure to effectively communicate to public and healthcare professionals can lead to a loss of trust and reputation of regulators and other stakeholders, as well as loss of lives (World Health Organization, 2020). It is the case of hydroxychloroquine, one of the drugs that gained much attention to be repurposed for COVID-19 treatment. Despite its efficacy was not proven, it has been praised by numerous public figures, such as the United States past President Donald J. Trump. As a consequence, several observational studies documented a substantial increase in purchases and internet searches for hydroxychloroquine and chloroquine after being promoted by Donald J Trump (Liu et al., 2020; Niburski and Niburski, 2020), showing how misleading information, especially if coming from individuals in positions of power, may increase inappropriate drug use and the risk of serious adverse reactions.

DATABASE NETWORKS FOR POST-MARKETING SURVEILLANCE FOR VACCINES AND MEDICINES

The increased access to large scale distributed database networks provides new ways and opportunities to monitor the post-marketing safety of vaccines and medicines and to generate real-world evidence to support decision-making. With this aim, in May 2008 the FDA launched the Sentinel Initiative, an infrastructure analyzing electronic healthcare data to assess the safety of approved medical products. To date, Sentinel has developed one of the largest distributed database networks for the assessment of medical product safety, comprising the Sentinel System, which uses common data models and analytic tools to analyze pre-existing real-world data, and the FDA-Catalyst, which uses routine queries, interventions and interactions with health plan members and/or providers (Food and Drug Administration, 2019).

Conducting pharmacoepidemiological studies combining multiple databases is particularly useful when outcomes or exposure of interest are rare, or when evidence is needed from different countries, to generate evidence rapidly and with stronger external validity (Gini et al., 2020). The combination of several claims databases may provide the

statistical power needed to investigate the association between clinically relevant safety outcomes and specific drug exposure. In this regard, the Italian VALORE project is a good example of how the creation of a distributed network of administrative databases can have a great potential for conducting post-marketing surveillance of biological drugs, including biosimilars, in Italian patients affected by immune-mediated inflammatory diseases (Trifirò et al., 2021).

One of the lessons learned from COVID-19 is that the potential of distributed networks of administrative databases to promptly generate robust real-world evidence is particularly high in conditions of public health emergency. This is the example of the ITA-COVID19 network, an Italian multiregional network established for the conduction of pharmacoepidemiological studies to evaluate the association between drugs, vaccines and COVID-19 through the linkage of claims databases to COVID-19 registries (Spila-Alegiani et al., 2021; Trifirò et al., 2020). Other examples of distributed networks of real-world data sources being widely used to support COVID-19 research are OpenSAFELY, an English analytics platform for analysis of electronic health records data (Williamson et al., 2020) and the Observational Health Data Sciences and Informatics (OHDSI) program, an interdisciplinary collaborative aiming at generating real-world evidence through large-scale analytics (Lane et al., 2020).

ARTIFICIAL INTELLIGENCE IN PHARMACOVIGILANCE

The availability of healthcare data has been tremendously increasing over the last years and will further increase in the near future thanks to massive marketing of digital tools collecting patient-derived data.

Huge amounts of electronic data present an opportunity to apply artificial intelligence (AI) techniques to improve drug safety assessment. Information extraction, using natural language processing (NLP) techniques and text mining to gather relevant insights from available, largely unstructured sources, has been gaining importance within the field of clinical research. As regards pharmacovigilance, text mining and NLP methods can be very useful to gather information on adverse drug reactions (ADRs) and drug-drug interactions from various textual sources, supporting researchers and clinicians in monitoring drug safety (Wong et al., 2018). Indeed, both public and private entities are currently trying to develop AI tools that can allow to automatically process ADRs (Basile et al., 2019).

Artificial intelligence and machine learning may also be useful in pharmacovigilance for 1) the automatic execution of tasks associated with case report entry and processing, 2) the identification of clusters of adverse events representing symptoms of syndromes, 3) the conduction of pharmacoepidemiological studies, 4) data linkage, through the conduction of probabilistic matching within datasets and 5) the prediction and prevention of adverse events through specific models using real-world data (Bate and Hobbiger, 2021).

SAFETY MONITORING OF DIGITAL THERAPEUTICS

Digital therapeutics (DTx) one of the most recent frontiers of medicine and can be defined as “technologies that deliver medical interventions directly to patients using evidence-based, clinically evaluated software to treat, manage, and prevent a broad spectrum of diseases and disorders” (Digital Therapeutics Alliance, 2021).

As for conventional medicines, with the increasing uptake of DTx into clinical practice, a proper post-marketing surveillance of DTx has to be implemented to rapidly identify potential safety signals and establish the safety profile of these technologies. Side effects associated with DTx may be generally less severe and easier to manage than those caused by conventional drugs. However, based on findings from pivotal trials, adverse effects of DTx may still occur to a greater extent than in respective control arms, thus requiring careful post-marketing monitoring.

Another important aspect of DTx is that they allow to collect a massive quantity of post-marketing patient-level data that can be harnessed to re-assess their safety and effectiveness in real-world setting. However, the increase in individual patient-related data poses concerns about data privacy and quality, thus highlighting the need to define a legal framework that allows on the one hand to guarantee individual privacy and on the other hand to transparently share data for research purposes.

PHARMACOVIGILANCE OF ADVANCED THERAPY MEDICINAL PRODUCTS

Advanced therapy medicinal products (ATMPs) are medicines for human use that are based on genes, cells or tissue engineering (European Medicines Agency, 2021). ATMPs provide new opportunities to restore, correct or modify physiological functions or make a medical diagnosis. Due to their high innovativeness, these medicines usually benefit from accelerated assessment and accelerated approval pathways, thus highlighting the need to generate post-marketing evidence about their benefit-risk profile. However, uncertainties concerning the safety profile of new ATMPs cannot be ascribed only to regulatory pathways. As these medicines often target rare diseases, pre-marketing evidence is generally weak because of inherent limitations of clinical trials due to small number of recruited patients, use of surrogate endpoints and single-arm design (Augustine et al., 2013). Therefore, post-marketing studies play a key role in generating long term evidence about the safety of these medicines and to fill the knowledge gap of pre-marketing studies. The detection of safety issues should start early and continue throughout the development of the ATMP in order to prevent or minimize the risk when possible. In some cases, the use of ATMPs is expected to be a once in a life-time treatment, therefore the sustainability of efficacy over time is a question that can only be answered by long-term efficacy follow-up. The objectives of the

safety and efficacy follow-up will depend on the characteristics of the product (European Medicines Agency, 2018a). In the case of chimeric antigenic therapies (CAR-T) routine risk minimization measures have to be supplemented with additional risk minimization measures under relevant important risks (e.g., cytokine release syndrome, infections and serious neurological adverse reactions) (European Medicines Agency, 2018b; European Medicines Agency, 2018c).

ECOPHARMACOVIGILANCE

Ecopharmacovigilance is “the science and activities concerning detection, assessment, understanding and prevention of adverse effects or other problems related to the presence of pharmaceuticals in the environment, which affect both human and the other animal species” (Velo and Moretti, 2010), ecopharmacovigilance is a very important issue nowadays and it plays a crucial role to reduce the environmental risk of pharmaceutical pollutants. Indeed, pharmaceuticals are widespread environmental pollutants that may be excreted into the environment through different routes, such as the excretion by the patient as parent compound or active metabolites via the sewer system and the release into the waste waters by manufacturers or hospitals and the terrestrial depositions (Holm et al., 2013). Several studies documented the effects of pharmaceutical pollution on various animal species, such as vultures and fish (Wang et al., 2017). The role of ecopharmacovigilance is becoming more and more important to control and minimize the sources of pharmaceutical pollution through the detection, assessment and prevention of adverse effects related to the presence of pharmaceuticals in the environment.

Although the detected concentrations of pharmaceuticals in the environment were mainly low (ng/L to µg/L) potential direct and indirect risks for humans exist and should be carefully monitored. Indeed, it is known that sex hormones exert their pharmacological activity at very low concentrations and that exposure to antibiotics may contribute to bacterial resistance (Velo and Moretti, 2010). Furthermore, special populations like pregnant women, children and older patients may be more vulnerable also to low concentrations of medicines. Addressing issues related to pharmaceutical pollution is therefore one of the main current aims of pharmacovigilance.

At *Frontiers in Drug Safety and Regulation*, we are interested in promoting research concerning the disciplines of pharmacovigilance, pharmacoepidemiology, regulatory science and public health to elevate regulatory sciences with patient-oriented approaches addressing emerging issues concerning drug safety.

AUTHOR CONTRIBUTIONS

GT and SC conceived the study and wrote the paper.

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