What Can We Learn From Large Databases? Lessons From Autoimmunity

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ABSTRACT: The increasing use of computerized medical records has made the clinical data of the entire population available for epidemiological research. The resultant accessibility to this information mandates careful adaptations of ethical guidelines regarding the handling of clinical data. At the same time it grants a unique opportunity to explore the clinical nature of health and disease in large populations across all of society's strata, socioeconomic levels, ethnicities, and geographic locations regardless of their vicinity or distance to tertiary care centers. Analysis of large databases allows us to learn the public's behavior towards medical services and to investigate how medical interventions affect outcomes over time. Moreover, the interaction between different co-morbidities can be better understood by large population studies. The huge numbers of patients involved in these studies provide a good model of multivariate analysis, a statistical tool that by following proper population adjustments underlines the true independent associations between different conditions. Nevertheless, the limitations of these studies should be borne in mind, such as in-built imprecision of diagnoses, incompleteness of the medical data, and the fact that these databases were initially planned for clinical and not investigational use.

KEY WORDS: medical records, randomized controlled studies, meta-analysis, case series, databases

In this short paper, using several examples, I will present the advantages of "big data" analysis derived from clinical records of the largest health maintenance organizations in Israel compared to the commonly used methodologies we accepted as optimal from our earliest years in the medical profession.

PITFALLS OF COMMONLY USED METHODOLOGIES

Although randomized trials are the most robust critical method, poorly designed studies are susceptible to different forms of bias. A randomized double-blinded study is considered the ultimate desired method for evaluating any medical intervention; it is believed to be the optimal assessment tool for any medical intervention, whether a new medication, a surgical procedure, or a novel device that has been developed. Nevertheless, despite scrupulous study design, the interests of the pharma industry often obfuscate the basic concepts behind proper medical research. Such approaches may create prevailing medical concepts, eventually biasing clinical studies toward achievements that result in more tangible and profitable study outcomes.

To illustrate I will use an example in my area of specialization, rheumatology. I have deliberately chosen a well-designed study that was published in one of the leading medical journals, the Lancet. The Adacta study drew much attention several years ago when it overturned barriers that many pharmaceutical companies had erected to evade the need for direct head-to-head comparisons between different biological agents. Such hesitations evolved over the years due to the heavy economic implications of such costly studies and to the concern that a certain product will not be found superior to the comparator. In this study two excellent biological agents commonly used as part of the therapeutic armamentarium for patients with rheumatoid arthritis (RA) were compared [7]. Both medications, tocilizumab (Actemra®, manufactured by Roche) and adalimumab (Humira®, manufactured by AbbVie) were shown in previous studies to provide clinical and radiological efficacy [8,9]. However, tocilizumab was found to have a significant suppressive effect on acute-phase reactants such as C-reactive protein (CRP) and erythrocyte sedimentation rate, both routinely used as significant components of the composite primary outcome of the study (DAS-28) [7]. Moreover, studies prior to the Adacta demonstrated that tocilizumab is different from other biologic agents due to its relative independence of concomitant metho-
tretxate use. In comparing tocilizumab to adalimumab, head to head without the important contribution of the background methotrexate, the results were determined in advance prior to the beginning of the study, as were the outcomes.

Another method whereby prospective clinical studies affect outcomes is by generating selective patient groups in a way that will not impair the results. Safety is often the major concern of the pharma industry. Inclusion and exclusion criteria usually do not attract the attention of the medical readership, yet these parameters often have a strong impact on the study outcomes, rendering them more favorable when certain individuals are not enrolled in the study. Such measures obviously bias the results, making them less applicable to the general patient population that usually does not comply with all the stringent study recruitment definitions [10]. In their analysis of psychiatric outpatients with major depressive disorder, Zimmerman et al. [11] found that randomized controlled studies would have excluded 86% of them due to their having co-morbid anxiety or substance use disorders, insufficient depressive symptoms, and/or current suicidal ideation.

Another methodology that is currently much used is the meta-analysis. Although the main advantage of this method is the large number of subjects included in the final report, meta-analyses have inborn faults. Pooled analyses should only be performed when study methodologies share similarities. Since many studies use dissimilar parameters such as different inclusion and exclusion criteria, duration of treatment and primary outcomes, the data cannot be easily pooled. Often the demographics of the subjects in the study differ in age, ethnicity, and disease duration and severity, making the data outcomes questionable and uninterpretable. Almost always, meta-analyses researchers suffice with the published data since pharmaceutical companies are reluctant to provide free accessibility to their original crude data. Above all, positive results are published more frequently, and studies with less favorable outcomes are omitted from the final analysis.

Case series and case reports have mainly educational importance; they are often prepared by young students and physicians at the dawn of their academic career. These publications present interesting clinical material which by nature is biased; the authors’ contribution is to underline interesting clinical findings or promising interventions. In these publications there is no concern or intention to control these observations. Of course, parallel negative findings will not find their way to print.

**THE ADVANTAGES OF ANALYSIS OF “REAL-LIFE DATA”**

Using real-life data provides multiple assets to medical research. In contrast to the randomized controlled studies, there is no need to select a “representative” sample if the entire population can be investigated. The validity of real-life data versus small cohorts is reflected in the following example. Novack and co-authors [12] reported a strong predominance of males (63/91) among offspring born to 42 mothers with systemic lupus erythematosus (SLE), a finding perhaps indicating that the female genotypic expression itself elicits an immune response, which leads to premature termination in utero of the development of female fetuses. To further challenge this intriguing observation, we studied the population of all females aged 16 to 46 who were members of the Maccabi Health Services during the period 2000–2011 and had at least one pregnancy. From a total of 182,073 women who had at least one indication of pregnancy during the study period, 270 were diagnosed with SLE. The proportion (95% confidence intervals) of male offspring born to lupus mothers in our study was 51.8% (95% confidence interval 46.6–57.0%), rendering Novack’s interesting hypothesis invalid [13].

Due to the concurrent availability of logistic information, such drug-dispensing real-life data analysis may also shed light on the medical behavior of the population, such as adherence and persistence, and on duration of therapy. An example for such a study evolved from an enigma that troubled me for years, why patients with gout develop recurrent acute gouty attacks despite effective therapy with urate-lowering medications? In our study we analyzed data derived from the Maccabi Health Services database regarding patients with the diagnosis of gout who were treated with allopurinol over a 7 year period (2002–2008). They were all assessed for their degree of adherence and persistence regarding allopurinol prescriptions provided by their family physicians. A total of 7644 patients were identified, predominantly men (72%). Interestingly, only 1331 (17%) of these patients were compliant with allopurinol therapy, 36% complied partially, and 47% complied poorly. The average time to discontinuation of therapy in men compared to women was 358 and 379 days respectively. By using logistic regression we identified a high risk group for non-compliance, namely, women aged 45–65 years. In contrast, compliance was achieved among those with chronic illnesses, particularly cardiovascular disease. Such data have much importance for directing educational and financial resources in order to improve poor clinical outcomes. This information is of particular interest since it reflects the socioeconomic strata, ethnicities and geographic distribution of the entire Israeli population [14].

Since medical computerized records incorporate all the clinical and logistic information of patients over years, they can be utilized for a comprehensive analysis of certain interventions on disease development years before its emergence. An example of such an attempt is demonstrated in our study [17] showing the anti-inflammatory potential of statins in preventing the future development of RA. Statins have only a modest beneficial effect in patients with RA when added to standard therapy. This observation was reported in small randomized clinical trials showing only a marginal beneficial effect on disease activity and CRP levels [15,16]. In our study [17] we used the computerized medical databases of the Maccabi Health Services database and identified RA cases among adults who began statin therapy between...
1998 and 2007. A total of 211,627 individuals were eligible for the RA cohort analysis. During the study follow-up there were 2578 incident RA cases (3.07 per 1000 person-years). The crude incidence density rate of RA among non-adherent patients was 51% higher compared to patients who were covered with statins for at least 80% of the follow-up period. Larger differences were observed in younger patients and in patients initiating treatment with high efficacy statins [17]. These data demonstrated the potency of large-scale studies to underline different aspects of medical interventions carried over years, a format almost impossible for other methods of analysis.

An additional advantage of database analysis is its validity in studying coexisting co-morbidities, since covering all population subgroups provides an accurate assessment of such issues. Since these patients are often exempted from randomized clinical studies, no other tools can reliably provide such an understanding of disease associations. In recent studies we have been able to decipher such linkages with data from Clalit Health Services (the largest of the four health funds in Israel). We found coexistence between SLE and hyperthyroidism, rheumatoid arthritis and chronic obstructive lung disease, and RA and bipolar disease [18-20].

One cannot deny the drawbacks of this methodology; the data analysis is not always performed initially for research purposes; the patients are classified by experts; and classification criteria and the data are often incomplete, sometimes lacking important elements. Nevertheless, given the huge number of individuals included in such studies there is much to be learned from "real-life" data analysis. Many national databases are changing our comprehension of disease and therapy and it is anticipated that they will continue to do so.

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References

“The ideals which have lighted my way, and time after time have given me new courage to face life cheerfully, have been Kindness, Beauty, and Truth”
Albert Einstein (1879-1955), German theoretical physicist and Nobel laureate

“I worked my way up from nothing to a state of extreme poverty”
Groucho Marx (1890-1977), American comedian and film and television star, known as a master of quick wit and regarded widely as one of the best comedians of the modern era.