# Using Real-World Data for Coverage and Payment Decisions: The ISPOR Real-World Data Task Force Report

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#### ABSTRACT \_

**Objectives:** Health decision-makers involved with coverage and payment policies are increasingly developing policies that seek information on "real-world" (RW) outcomes. Motivated by these initiatives, the International Society for Pharmacoeconomics and Outcomes Research (ISPOR) created a Task Force on Real-World Data to develop a framework to assist health-care decision-makers in dealing with RW data, especially related to coverage and payment decisions.

Methods: Task Force cochairs were selected by the ISPOR Board of Directors. Cochairs selected chairs for four working groups on: clinical outcomes, economic outcomes, patientreported outcomes, and evidence hierarchies. Task Force members included representatives from academia, the pharmaceutical industry, and health insurers. The Task Force met on several occasions, conducted frequent correspondence and exchanges of drafts, and solicited comments on three drafts from a core group of external reviewers and from the ISPOR membership.

**Results:** We defined RW data as data used for decisionmaking that are not collected in conventional randomized controlled trials (RCTs). We considered several characterizations: by type of outcome (clinical, economic, and patientreported), by hierarchies of evidence (which rank evidence according to the strength of research design), and by type of data source (supplementary data collection alongside RCTs, large simple trials, patient registries, administrative claims database, surveys, and medical records). Our report discusses eight key issues: 1) the importance of RW data; 2) limitations of RW data; 3) the fact that the level of evidence required depends on the circumstance; 4) the need for good research practices for collecting and reporting RW data; 5) the need for good process in using RW data in coverage and reimbursement decisions; 6) the need to consider costs and benefits of data collection; 7) the ongoing need for modeling; and 8) the need for continued stakeholder dialogue on these topics.

**Conclusions:** Real-world data are essential for sound coverage and reimbursement decisions. The types and applications of such data are varied, and context matters greatly in determining the value of a particular type in any circumstance. It is critical that policymakers recognize the benefits, limitations, and methodological challenges in using RW data, and the need to consider carefully the costs and benefits of different forms of data collection in different situations.

*Keywords:* methodology, outcomes research, real-world data, research design.

# Why a Real-World Data Task Force?

# Growing Use of Evidence Syntheses and Outcomes Research

Health decision-makers involved with coverage and payment policies are increasingly seeking information on "real-world" (RW) outcomes on which to base their decisions. Many of them are developing policies that integrate evidence from different sources. These policies recognize the importance of evidence that goes beyond information collected during clinical development in randomized controlled trials (RCTs) required

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by regulatory authorities for marketing approval. It is broadly acknowledged that while RCTs provide a "gold standard" in the sense that they provide solid evidence of product efficacy under carefully controlled conditions, RCTs are carried out using selected populations under idealized conditions. In addition, they are expensive to conduct. Other sources of data can contribute in important ways to the evidence base (e.g., demonstrating how a drug works in populations or under conditions not studied in the trial, or relative to another drug not included in the study).

#### Policy Developments

Recent policy initiatives highlight payers' attempts to collect and use such data. The Medicare Modernization Act (MMA) of 2003 illustrates the US government's

attempt to bolster the evidence base on which private health plans participating in the new Medicare drug benefit can base their coverage decisions. The MMA contains a provision (Section 1013) calling on the Agency for Healthcare Research and Quality (AHRQ) to conduct research on the "outcomes, comparative clinical effectiveness, and appropriateness of health care, including prescription drugs" [1]. The AHRQ has recently launched the Effective Health Care Program to synthesize, generate, and translate knowledge to aid stakeholders in grappling with the often difficult decisions they must make [2]. The AHRQ has also announced that it is developing a "how-to" reference guide to help health-care organizations in creating patient registries to track the outcomes of medical treatments, including drugs [3]. The US Centers for Medicare and Medicaid Services (CMS) has also recently issued a revised Coverage with Evidence Development Guidance document that focuses on the need for RW data to help inform national coverage decisions for new technology [4]. Many private payers are adopting the Academy of Managed Care Pharmacy Format, which calls for health plans to request formally that drug companies present a standardized "dossier," containing detailed information not only on the drug's efficacy and safety, but also on its projected effectiveness and economic value relative to alternative therapies [5,6].

Other efforts to review evidence systematically have also gained momentum, including those by private and public health plans. A notable initiative in the United States is the Drug Effectiveness Review Project (DERP), an alliance of 15 state Medicaid programs and two nonprofit organizations, to synthesize and judge clinical evidence for drug class reviews [7]. Around the globe, national reimbursement authorities and the organizations that assist them, such as the National Institute for Health and Clinical Excellence (NICE), and the German Institut für Qualität und Wirtschaftlichkeit im Gesundheitswesen (IQWiG), are struggling with similar issues [8,9]. Both DERP and IQWiG emphasize RCTs for clinical evidence as opposed to synthetic modeling approaches, such as those used by NICE to project RW effectiveness.

#### **Task Force Objectives and Scope**

#### Objectives

Motivated by the MMA and other efforts, and recognizing the lack of a framework for considering RW data in coverage and reimbursement decisions, the International Society for Pharmacoeconomics and Outcomes Research (ISPOR) created a Task Force on Real-World Data. The mission of the Task Force was to develop a framework to assist health-care decisionmakers in dealing with RW data and information in RW health-care decision-making, especially related to coverage and payment decisions.

## Scope

*Defining RW data.* From the outset, the Task Force grappled with the definition and appropriate characterization of RW data. It seemed self-evident that RW outcomes data should come from RW situations. Part of the Task Force's charge was to consider uses and limitations of evidence not obtained from RCTs. On the other hand, it was also clear that decision-making is a highly integrative process of synthesizing information from different sources—both "laboratory" and real-world.

Some Task Force members questioned the appropriateness of the term "RW data" in the first place. In the end, we decided to adhere to the term, not only because it reflected the charge from the ISPOR Board, but also because the term has gained currency in some policy circles.

We settled on a definition that reflects data used for decision-making that are not collected in conventional RCTs. This is not to say that data from RCTs are irrelevant or not used by decision-makers; indeed, they remain the critical foundation for almost all initial coverage and payment decisions. For if there is not a belief in the plausibility of the underlying biological mechanism or hypothesis, why should anyone seek further evidence of effectiveness or cost impact in the real world? Yet, efficacy evidence in a particular group or subgroup is typically insufficient to project the size of the effectiveness impact in the population that would actually use a product. Decision-makers therefore seek additional types and sources of data.

*Data versus evidence*. Our Task Force also deliberated distinctions between the terms "real-world data" and "real-world evidence." Some in our group favored the latter term, or at least raised questions about whether we meant evidence when we employed the term data. The notion was that "data" conjures the idea of simple factual information, whereas "evidence" connotes the organization of the information to inform a conclusion or judgment. Evidence is generated according to a research plan and interpreted accordingly, whereas data is but one component of the research plan. Evidence is shaped, while data simply are raw materials and alone are noninformative.

In the end, we adhered to the term "real-world data" for reasons noted above. Nevertheless, we try to remain sensitive to the distinctions throughout, and emphasize that thorough knowledge of the quality of the data source is necessary when deciding whether a specific set of data can be used to answer a research question or shed light on a decision. Focus on coverage and payment decisions. We focus our report on coverage and payment (i.e., both pricing and reimbursement) decisions. This sets it apart from other contexts, such as direct patient care or regulatory approval for marketing.

We recognize the tension that sometimes arises between what is good for an individual patient and what is good for the population at large. Evidencebased medicine (EBM) has been defined as "the conscientious, explicit and judicious use of current best evidence in making decisions about the care of individual patients" [10]. While physicians retain a pivotal role in patient care decisions, other bodies such as pharmacy and therapeutic (P&T) committees and national reimbursement bodies (e.g., in Canada, Australia, and most European countries) are taking on greater importance in medical decision-making.

*Drugs versus other interventions.* While most of our examples are drawn from the world of prescription drugs, our report has implications for all types of interventions, including drugs, devices, procedures, and health programs.

US versus global focus. The motivation for the Task Force came largely from the MMA and US policy arena, but debates about types and sources of data are, of course, present around the world—as suggested in the different approaches taken, for example, by NICE and IQWiG. Although many of our examples are taken from US contexts, our findings are global in reach.

# Task Force Participation

Task Force cochairs were selected by the ISPOR Board of Directors. Cochairs selected chairs for four working groups on: clinical outcomes, economic outcomes, patient-reported outcomes (PROs), and evidence hierarchies. The first three groups correspond to the three major areas of outcomes research that contribute to the studies of comparative effectiveness and economic evaluation sought by decision-makers. The working group on evidence hierarchies addresses the cross-cutting, foundational issue of the quality of evidence. This paper reflects an integration of the various working group reports.

Task Force members included representatives from academia, the pharmaceutical industry, and health insurance plans, and brought varied experiences in using RW data. An outline and draft report developed by the panel were presented at the 2005 International and European ISPOR Meetings. The manuscript was then submitted to a reference group of interested ISPOR members for review and comment. The Task Force met on several occasions, conducted frequent correspondence and exchanges of drafts by electronic mail, and solicited comments on three drafts from a core group of external reviewers and more broadly from the membership of ISPOR.

# Types and Sources of RW Data

#### Characterizing RW Data

There are several ways in which one might characterize RW data. One is by type of outcome: clinical, economic, and patient-reported outcomes (the focus of three of our working groups). An advantage of this approach is that it corresponds to the way in which many decision-makers conceive of data. A downside is that it provides broad categories, each of which combines many types and sources of evidence.

A second characterization involves traditional hierarchies of evidence (the focus of our fourth working group), which rank evidence according to the strength of the research design. Typically, data from RCTs sit atop the hierarchy followed by data from nonrandomized intervention studies, followed by epidemiological studies and so forth [11]. Evidence hierarchies provide a useful ranking based on the rigor of the research design; however, they do not provide a complete picture of RW data. The results from many RCTs are not generalizable to a broader population. Conversely, a well-conducted observational study may prove highly useful in certain situations provided that potential biases have been adequately addressed. Indeed, some would argue that observational data can often provide more relevant evidence regarding patient outcomes in actual clinical practice than can a registration RCT.

Finally, one might consider RW data by types of data sources. The value of this classification is that it identifies tangible sources of information. A potential drawback is that it represents a simplification that does not capture important design issues within each source of evidence.

Each of the three characterizations provides a different perspective on RW data. Collectively, we believe they provide a useful portrait of the strengths, weaknesses, and complexities inherent in the topic.

# Types of Outcomes

*Clinical outcomes.* Clinical outcomes include biological measures of morbidity (e.g., blood pressure, cholesterol level, symptoms, and side effects) and mortality. Clinical outcomes include both surrogate (intermediate) and long-term measures. For purposes of this discussion, we differentiate clinical outcomes from health outcomes and especially PROs and health-related quality of life (HRQoL).

Much of the data collected in phase III registration trials involves clinical outcomes. Clinical outcome data are also found in many other sources, such as patient registries or observational databases. A key issue, discussed in greater detail in Section 3.4, involves the validity of clinical data from such sources.

*Economic outcomes.* "Economic outcomes" are narrowly defined here to include estimates of medical and nonmedical resource utilization and their associated costs. Such data are used to project the expected cost of an intervention in the real world—e.g., in the numerator of a cost-effectiveness ratio. As discussed below, many sources of RW data are useful in providing use and cost information. Of course, we recognize that the term economic outcomes can be more broadly construed since economic evaluations consider both benefits and costs, but keep this narrow definition in the interest of continuity with the original charter of the Task Force.

Patient-reported outcomes/quality of life. Patientreported outcome is the term adopted by the Food and Drug Administration (FDA) and internationally to encompass any report coming directly from patients about a health condition and its treatment, including symptoms, functional status, HRQoL, treatment satisfaction, preference, and adherence. Researchers have long recognized that self-reports of outcomes related to disease, injury, treatment or policy are important because they provide the only direct voice that an individual has in the health decision-making process. This information has been widely used for decisionmaking in the United States since the mid-1950s with the establishment of the annual national health surveys; other countries have subsequently developed similar data collection mechanisms. The CMS adoption of the Medicare Health Outcome Survey is recognition of the importance of PRO data for understanding outcomes of the Medicare program. As people live longer with chronic conditions, PROs have become increasingly important to pharmaceutical manufacturers in assessing the impact of emerging chronic treatments and in communicating the benefits of these drug treatments in label and promotional claims.

Interested parties have actively debated diverse conceptual and methodological issues related to all types of PROs, resulting in the publication of various "best practices" documents [12,13]. The level of understanding of both the scientific rigor and its application to the reporting of these subjective measures has improved. Like any science, however, questions remain. FDA and regulatory agencies globally have recently developed statements to guide the development and use of these measures, especially by the pharmaceutical industry in the drug approval process [14,15].

# Evidence Hierarchies

Historically, evidence hierarchies have been linked to "evidence-based medicine." The thrust of the EBM movement is to ground clinical practice in rigorous research. EBM proponents emphasize that traditional medical practice incorporated local practices and expert opinion that were not tested in controlled studies [11]. They stress the need for clinical researchers to document all study protocols, utilize appropriate analytical techniques, and strive for internal consistency [16]. Studies are to be considered externally valid when findings are generalizable beyond local clinical practices. A scientific body of evidence became reliable and generalizable when similar results were reported by different researchers across a range of study designs and patient populations. For these reasons, RCTs were placed at the top of the evidence hierarchy.

Decision-makers, however, quickly recognized the impracticality of basing all of medicine on RCTs. For one thing, RCTs are expensive. For another, even the best RCT reflects a limited controlled experiment that may not generalize to populations, settings, or conditions not reflected in the trial. The need for non-RCT information became apparent, raising the question of how to grade information that by definition was of "poorer quality."

A number of groups have developed evidence hierarchies over the years that reflect the primacy of data from RCTs, and grade other types of evidence by the rigor of the research design. For example, the hierarchy adopted by AHRQ grades evidence in order from most to least rigorous as follows [17]: 1) systematic reviews and meta-analyses of RCTs; 2) nonrandomized intervention studies; 3) observational studies; 4) nonexperimental studies; and 5) expert opinion.

The U.S. Preventive Services Task Force (USPSTF) took the approach a step further recognizing that decision-makers require information not only on the rigor of the research design but also on the magnitude of the net benefit in support of a particular technology or health service [18]. Recent work developed by the Scottish Intercollegiate Guidelines Network and the Oxford Center for Evidence-Based Medicine also recognized limitations of traditional grading systems [19]. Strict use of evidence hierarchies may not account for the methodological quality of studies or may fail to reflect the overall strength of the evidence base. Users may misinterpret the grade of recommendation or they may fail to properly weigh lower-grade recommendations [20]. Other groups maintain their own evidence grading and classification systems that combine judgments about evidence quality with judgments about the usefulness of the intervention [21].

#### Sources of RW Data

Real-world data can also be categorized by type of data source. Our Task Force defined six such sources: 1) supplements to traditional registration RCTs; 2) large simple trials (also called practical clinical trials);

3) registries; 4) administrative data; 5) health surveys; and 6) electronic health records (EHRs) and medical chart reviews.

*Supplements to RCTs.* To provide additional data alongside standard clinically focused RCTs, researchers often gather information on variables such as PROs, medical resource use, and costs. Such efforts can add valuable evidence on treatment patterns for common events, e.g., such as the doses of drugs used to treat rejection in kidney transplantation [22].

Limitations to such data are also well-known: their primary aim is to measure a key clinical efficacy end point in a carefully limited population and clinical setting. Furthermore, trials are not usually powered statistically to measure precisely the probability of rare adverse or other events and hence are of limited use in measuring the associated resource utilization and costs. RCTs are generally conducted over a shorter time frame than what is relevant for determining the overall clinical and economic impact of an intervention, and resource use is often protocol-driven.

Large simple trials. Large simple trials (also called practical or pragmatic clinical trials) involve prospective, randomized assignment but aimed at larger more diverse RW population [23]. Large simple trials have the important strength of randomization, which minimizes bias in the estimation of treatment effects. These trials are by design larger than conventional RCTs. For this reason, they are more likely to have sufficient power to capture significant differences in key outcomes of interest, such as hospitalizations.

Because the focus is on obtaining policy-relevant outcomes, costs and cost-effectiveness are more likely to be central end points, and the results can be more readily generalized to the relevant treatment population than those obtained from conventional RCTs: costs are less likely to reflect protocol-driven healthcare use; well-documented variations in resource use across various ethnic, racial, age groups, and sexes can be better captured by opening the trial to a more diverse population; people more at risk for adverse events are less likely to be excluded from the trial, and the related economic effects are more likely to be captured; and resource use and costs are more likely to reflect those observed in community-based settings where most people obtain their care, especially since study drugs in phase III trials are generally provided for free.

Nevertheless, the large size of a practical clinical trial increases the cost of data collection and raises some concerns about the quality of data collected. Costs are increased not only because a larger number of patients are enrolled, but also because a larger number of settings are involved. Some of the issues raised by economic data collection within practical clinical trials are: identification of where subjects receive care may be more difficult (less in a closed system); data collection systems of community-based settings may be less sophisticated than those of academic settings (e.g., more likely to use paper rather than electronic records, thus increasing the likelihood of data entry errors); there is more likely to be a lack of standardization in financial and billing systems across different settings of care; and more study coordinators will be involved in the data collection effort.

*Registries*. Registries are prospective, observational cohort studies of patients who have a particular disease and/or are receiving a particular treatment or intervention. They can be used for understanding natural history, assessing or monitoring RW safety and effectiveness, assessing quality of care and provider performance, and assessing cost-effectiveness [24].

Registries involve prospective data collection of clinical, economic, and PRO information, and are increasingly relying on real-time data capture. They typically include a larger and more diverse group of patients than what is generally studied in phase III RCTs; therefore, they better reflect RW patients, management practices, and outcomes. Patients are often followed over a longer time frame, allowing for an assessment of longer-term outcomes. Most registries have very few, if any, required visits, evaluations, or procedures; therefore, the treatment patterns reflect the everyday clinical decision-making that is most relevant to providers and payers. Disease registries enable providers and payers to gain insight into the most cost-effective treatment approaches.

Because registries do not involve random assignment to treatment, care must be taken in analyzing and interpreting the results due to the inherent limitations of observational studies. There is no guarantee that patient groupings are comparable; therefore, registries may not be suitable to test hypotheses, but are useful to generate them. Furthermore, there are limitations in terms of the amount of data that can be collected, and because visit schedules are not required, data cannot necessarily be obtained at fixed intervals. Registries sometimes include study sites that are not experienced in conducting research, and without appropriate oversight, data integrity could be in question. Nevertheless, the use of real-time data capture is likely to improve data monitoring and integrity. Registries are, in some cases, established to collect postmarketing safety data, either in response to specific safety concerns or to fulfill regulatory obligations established as a condition of marketing approval.

Administrative data. Administrative data (typically retrospective or real-time, if possible) are collected primarily for reimbursement, but contain some clinical diagnosis and procedure use with detailed information on charges. Claims databases lend themselves to retrospective longitudinal and cross-sectional analyses of clinical and economic outcomes at patient, group, or population levels. Such analyses can be performed at low overall cost and in a short period of time. Given the sheer size of claims databases, researchers can identify outcomes of patients with rare events more easily, assess economic impact of various interventions, and gain insight into possible association between interventions and outcomes.

Administrative claims databases can prove very useful in measuring resource use and costs, provided some basic principles are met. A clear research question needs to be defined and addressed by an appropriate design from a well-defined perspective. Available statistical tools can be used to help control for some of the potential biases. Methods and results should be reported in a clear and transparent fashion, so that other researchers are able to understand and reproduce the analyses.

It is worth noting that with appropriate Institutional Review Board (IRB) approvals and patient consent, some health plan databases can be linked with PROs, lab results, medical records, and physician surveys—effectively becoming a blend of traditional registries and claims data.

Beyond challenges posed by privacy issues, the validity of retrospective claims database analyses has been challenged on several fronts: data quality (missing data, coding errors-whether random or "intended"-and the lack of comprehensive data across health-care settings); the lack of or very limited clinical information on inpatient stays, health outcomes, health status, and symptoms; limited validation; absence of a population denominator; and the lack of distinction between costs and charges. Of course, the large size of these databases may be able to overcome the issue of missing data if they are missing at random. If data quality can be ascertained and privacy issues addressed, then treatment selection bias in the sample is the most common and challenging methodological issue. Estimates of the effects and costs can be biased because of a correlation between unobserved factors associated with treatment selection and outcomes, such as baseline health status.

*Health surveys*. Health surveys are designed to collect descriptions of health status and well-being, health-care utilization, treatment patterns, and health-care expenditures from patients, providers, or individuals in the general population. Health surveys typically collect information on representative individuals in the target population, whether patients, physicians or general population, and are methodologically rigorous, for example, relying on complex sample survey designs. With these designs, surveys can provide information about all members of the target population,

The major limitation of health survey data for initial coverage and reimbursement decisions is the lack on relevant data on specific products. Survey data are also subject to issues of subjectivity and recall bias.

#### Electronic health records and medical chart review.

Finally, we note that EHRs (and other technologies capturing real-time clinical treatment and outcomes) are important sources for RW data for a wide range of clinical settings throughout the world. The expansion of electronic data capture is essentially lowering the cost of the medical chart reviews that have been widely used in the past to produce specific information on the RW use of specific tests or drugs for particular conditions. EHRs-such as the UK General Practice Research Database-contain more detailed, longitudinal information including disease-specific symptoms at the personal level and should greatly expand the use of this type of information. Nevertheless, transforming the information for research purposes requires high-end statistical analysis tools and remains a challenge.

# **Key Findings**

#### Recognizing the Importance of RW Data

We conclude with a strong affirmation of the need for RW data. As we have emphasized, RCTs have many advantages: their prospective design, prespecified welldefined end points, randomization and control groups, and blinding all work to provide unbiased measures of impact in the trial population; however, this strong internal validity can limit their external validity and generalizability about which interventions work best when implemented in different settings.

Decision-makers rely on multiple sources of RW data that must be integrated or synthesized in some fashion. While RCTs remain the gold standard for demonstrating clinical efficacy in restricted trial settings, other designs contribute to the evidence base. In some situations, RW data may provide clear advantage for understanding outcomes of treatment, for example, for patients excluded from trials, patients in actual clinical practice settings (vs. research settings), and patients whose treatment is not determined by trial protocol or practice guidelines.

Among the benefits of RW data is that they can provide:

• Estimates of effectiveness rather than efficacy in a variety of typical practice settings;

- Comparison of multiple alternative interventions (e.g., older vs. newer drugs) or clinical strategies to inform optimal therapy choices beyond placebo comparators;
- Estimates of the evolving risk-benefit profile of a new intervention, including long-term (and rare) clinical benefits and harms;
- Examination of clinical outcomes in a diverse study population that reflects the range and distribution of patients observed in clinical practice;
- Results on a broader range of outcomes (e.g., PROs, HRQoL, and symptoms) than have traditionally been collected in RCTs (i.e., major morbidity and short-term mortality);
- Data on resource use for the costing of health-care services and economic evaluation;
- Information on how a product is dosed and applied in clinical practice and on levels of compliance and adherence to therapy;
- Data in situations where it is not possible to conduct an RCT (e.g., narcotic abuse);
- Substantiation of data collected in more controlled settings;
- Data in circumstances where there is an urgency to provide reimbursement for some therapies because it is the only therapy available and may be life-saving;
- Interim evidence—in the absence of RCT data—upon which preliminary decisions can be made; and
- Data on the net clinical, economic, and PRO impacts following implementation of coverage or payment policies or other health management programs (e.g., the kind of data CMS expects to collect under its coverage with evidence development policy) [25].

# Recognizing the Limitations of RW Data

We also recognize important limitations of RW data. For all nonrandomized data, the most significant concern is the potential for bias. Retrospective or prospective observational or database studies do not meet the methodological rigor of RCTs, despite the availability of sophisticated statistical approaches to adjust for selection bias in observational data (covariate adjustment, propensity scores, instrumental variables, etc.). Observational studies need to be evaluated rigorously to identify sources of bias and confounding, and adjusted for these before estimating the impact of interventions on health outcomes. Observational or database studies may also require substantial resources.

# The Level of Evidence Required Depends on the Circumstance

The complexity of data collection underscores the fact that the level of evidence required in any circumstance will relate to the question at hand. It is important to recognize the variable quality of all data (whether prospective or retrospective, or experimental or observational). The extent to which data provide good or bad evidence depends on the research design, the quality of the information collected, and how the data are used. The optimal solution will depend on the circumstances. Decisions typically rely on multiple sources, and are best thought of as conditional—to be revisited as additional evidence is generated.

Ongoing work in evidence hierarchies recognizes this complexity. As noted, new approaches for grading evidence depend on the quality of the evidence and the magnitude of the net benefit. The approaches are more explicit about which studies provide stronger evidence in support of the use of a particular health service or drug.

In all likelihood, we need clinical trials that are more practical and "RW data" that are more statistically rigorous from a design and analysis standpoint [26]. For the collection of economic data alongside RCTs, this suggests that data collection efforts focus on "big ticket" items, rather then trying to capture a complete picture of resource use. To ensure that the data collected in these trials are of high quality, a greater emphasis is needed on centralized training of study coordinators and records abstractors and on the centralized quality control mechanisms.

The high cost associated with data collection may further necessitate linkage of trial data to claims data, which requires collection of sensitive patient identifiers such as Social Security numbers. This may raise additional patient confidentiality concerns with Institutional Review Boards and may require collaboration and cooperation of a government agency, or private insurers to ensure patient-level claims can be made available.

# The Need for Good Research Practices for Collecting and Reporting RW Data

Our review underscores the need for good practices for collecting and reporting RW data. In terms of data collection, it is important that efforts follow wellestablished research practices. These include posing well-defined questions, specifying time frames for the duration of data collection, conducting periodic monitoring to ensure quality and responsiveness to research questions, and limiting sample sizes to the minimum necessary. These good practices should also ensure that informed consent and human subject protections are in place.

Registries, for example, should be carefully planned, beginning with clear and achievable objectives and extensive clinical input. A protocol or study plan should guide the conduct of the registry and the data analysis. Data collection tools should be carefully designed and tested, and site coordinators thoroughly trained to ensure data quality. Quality control mechanisms should be in place to identify and resolve study issues. There is also a need to balance research needs with privacy concerns as it becomes easier to link data across multiple sources.

Researchers should draw inferences from observational data with caution. For example, a widely recognized challenge with the analysis of RW data is the need to correct for sample selection bias-defined as the bias introduced by unobserved variables that are correlated with both treatment selection and patient outcomes (e.g., unobserved illness severity). On the other hand, it is less well-recognized that selection bias is just one of a variety of factors including missing variables, measurement error, incorrect functional form and two-way causation ("structural simultaneity") that can introduce bias into treatment estimates. All of these problems have the common statistical result of introducing a correlation between the treatment variable and the error term, which is the source of the bias. Overcoming this "endogeneity bias" is the most common and vexing challenge that arises in the analysis of RW data. Statistical tests for endogeneity bias exist, along with methods for its correction although operationalizing these methods is often a significant challenge: in many circumstances, our ability to minimize this bias is limited by the lack of exogenous variation in the available data [27,28].

# Good Process in Using RW Data in Coverage and Reimbursement Decisions

We also recognize the importance of the processes implemented by decision-makers in using RW data in coverage and reimbursement. Observers point to several conditions for establishing good process, including transparency (the decision and the rationale for making them must be publicly accessible) and relevance (there must be a reasonable explanation for a decision's rationale) [29]. They should also be fair in the sense that RW data will be used in similar fashion across technologies, or if situations demand a different rationale, the circumstances or principles would be known. Decisions should not be "bureaucratically arbitrary," or based on reasons that people do not view as meaningful or just.

Typically, the amount of RW data available for the initial coverage and reimbursement decision is very limited: instead, effectiveness projections are modeled from efficacy data. Good process would encourage the subsequent gathering of RW data, in part by updating coverage and reimbursement decisions based on those data.

Processes should also allow opportunity for stakeholder participation. Different stakeholders (physicians, patients, family caregivers, payers, hospitals, regulatory agencies, employers, manufacturers, and researchers) may have different perspectives on the use and value of RW data. Ideally, there will be a mechanism for challenge and change, which contributes to democratic governance.

# The Need to Consider the Costs and Benefits of Data Collection

Two critical questions are how much RW data should be collected and who should pay for it. Evidence costs money. Inevitably, there are questions about whether resources devoted to the endeavor are worthwhile. There is a need to prioritize decisions about RW data such that the benefits of collecting additional information are expected to outweigh the costs.

The tool of "value-of-information (VOI) analysis" offers a formal approach to deciding when and what types of data to collect. Formal use of decision analysis and VOI analysis can help determine whether an intervention should be adopted, whether additional evidence to further inform that decision is worth gathering, and what kind of information is of greatest value [30].

The VOI analysis evaluates the extent to which new evidence might improve expected benefits by reducing the chance for error, and compares that improvement to the cost of the information. Evidentiary considerations will depend on the particular circumstances of a decision (the consequences of an error, what can be learned from additional evidence, how new knowledge will change and improve the option identified as optimal), rather than on predetermined specifications about the type of study design (e.g., RCT). Explicit consideration is given to the potential positive health outcomes forgone due to delays in coverage as well as the potential adverse consequences of too rapid uptake when the risk–benefit ratio is highly uncertain.

# The Need for Modeling

A previous ISPOR Task Force on modeling studies emphasized that the purpose of modeling is to "structure evidence on clinical and economic outcomes in a form that can help inform decisions" [31]. They stated: "Models synthesize evidence on health consequences and costs from many different sources, including data from clinical trials, observational studies, insurance claim databases, case registries, public health statistics, and preference surveys."

Our field has adopted bioclinical cost-effectiveness models as an integrative framework, incorporating biological, clinical outcomes, and economic data into a decision-making structure. Within this general structure, there are several different types of possible pharmacoeconomic evaluations, such as costconsequences, cost-utility, and cost-benefit analyses. Such models and analyses are the primary vehicle for combining RCT and RW data to support coverage and reimbursement decision-making. At the same time, expanded use of RW data in assessing postlaunch costeffectiveness is needed to update the modeling projections made to support initial coverage and reimbursement decisions.

In terms of good research practice, the previous Task Force emphasized the need for transparency of assumptions, including the point that "conclusions are conditional upon the assumptions and data on which the model is built."

### The Need for Ongoing Dialog

Finally, our review highlights the need for ongoing stakeholder dialog on all of these issues. Implicit in much of our discussion is a central policy question about the appropriate role of the public sector in producing and judging evidence. Who collects and evaluates RW data, which pays for these efforts, and what magnitude of resources is provided are key questions for policymakers worldwide. There is no general regulatory requirement for collecting RW data.

In the United States, CMS has called for data that reflect RW practice. In addition, FDA is requiring the implementation of mandatory registries in instances where there is any concern regarding long-term safety of a therapy. The opportunity for funding observational studies of therapy is limited compared with traditional epidemiological studies and therapeutic trials. It is critical that we have an intelligent and vigorous public discussion on these and other issues.

#### Conclusions

Real-world data are essential for sound coverage, payment, and reimbursement decisions. The types and applications of such are varied, and context matters greatly in determining the value of a particular type of evidence in any circumstance. Different study designs can provide useful information in different situations. RCTs remain the gold standard for demonstrating clinical efficacy in restricted trial setting, but other designs—such as observational registries, claims databases, and practical clinical trials—can contribute to the evidence base needed for coverage and payment decisions.

It is critical that policymakers recognize the benefits, limitations, and methodological challenges in using RW data, and the need to carefully consider the costs and benefits of different forms of data collection in different situations. In this report, we have attempted to identify the salient issues in developing and using RW data. We acknowledge many challenges ahead and view this effort as a starting point for future debates.

# Postscript

Prior to finalizing this report, we reviewed more than 70 comments from ISPOR members on our draft report, which are accessible at the ISPOR web-

http://www.ispor.org/workpaper/RWD\_TF/ site at MemberComments.pdf. One recurring theme was a perceived need for more guidance on precisely how decision-makers will actually use RW data after the launch of a product. Other themes included calls for more discussion of limitations of various aspects of RW data collection, calls for more attention to the uses of EHRs, and comments that our report could have used more emphasis on international data collection and on medical devices. Although we made numerous changes to this document in light of these comments, we still refer the interested reader to the comments on the ISPOR website, as several of the important broader themes and limitations they raise should help to define the agenda for the next steps in this continuing inquiry.

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