## Reproducibility and Replication Issues in Science: Quantitative Analysis of Biases in Epidemiology and its Role in Risk Assessment

September 13, 2018, 1-3 PM

USDA South Building, Washington DC

## Background

There is increasing interest and concern in the scientific community on the "replication crisis" in science. Specifically, scientists are finding that the results from scientific experiments can be difficult to reliably replicate on subsequent investigations. Some have gone so far as to assert—and provide rational support for—that most published research findings are false (Ioannidis, 2005). Others have pointed out that even the more modest goal of reproducing previous research -- demonstrating that others can calculate the same results using the same data and methods -- is frequently difficult or impossible (ASA, 2017).

A number of theories have been advanced with respect to the reasons for this increased difficulty in replicating scientific results. These have included publication bias, increased pressures to publish, "vibrational" effects which come from the multitude of choices in the way data are analyzed, the prevalence of and emphasis in research on null hypothesis significance testing, and low power studies and the consequent "truth inflation" associated with significant effect sizes and any 'discovered effects'. Several researchers, directly or indirectly, have at least partially ascribed the current replication issues in science in general—and epidemiology in particular—to a combination of an emphasis in research on testing of novel hypotheses, on a lack of power in the studies that are done, and on an over-emphasis on the part of researchers and publishers on p-values and "achieving (statistical) significance". In addition, there tends to be an under-appreciation of the role and potential magnitude of biases, an over-reliance on the epidemiological mantra that non-differential misclassification leads to biases toward the null, and an under-recognition that confidence intervals around epidemiological effect size estimates rely on the unlikely probability that all errors are random and none are systematic. One consequence of this is that statistically significant epidemiological studies appearing in the literature can be over-interpreted and their estimated error bounds can be under-estimated.

To address these challenges, various analytic approaches and corresponding tools have been deployed (e.g., sensitivity analyses and quantitative bias analyses) and a more holistic weight-of-evidence approach has been taken that more fully considers the Bradford Hill criteria. Researchers have also been encouraged to improve the transparency of their work by providing their underlying

data and analysis code, whenever possible. The relevance of this topic to IRAC is to further enhance the rigor of risk assessments and decision-making by increasing awareness of approaches that address issues of reproducibility, biases, and interpretation of the underlying science.

## **Preliminary List of Participating Agencies**

(developed based on outreach to IRAC membership)

Agency	Representative(s)
Food and Drug Administration, Center for Biologics Evaluation and	Richard Forshee*,
Research (CBER)	Yun Lu, Hussein
	Ezzeldin
Food and Drug Administration, Center for Food Safety and Applied	Michael Bazaco
Nutrition (CFSAN)	
Environmental Protection Agency, Office of Pesticide Programs (OPP)	David Miller*, Aaron
	Niman
U.S. Department of Agriculture, Food Safety and Inspection Service (FSIS)	Janell Kause,
	Berhanu Tameru
U.S. Department of Agriculture, Office of Pest Management Policy	Alex Domesle
U.S. Department of Agriculture, APHIS/PPQ	Sunil Kumar
U.S. Department of Agriculture, AMS/S&T/MPD	Shanker P. Reddy
Food and Drug Administration, Center for Veterinary Medicine	Craig Lewis
Food and Drug Administration, Office of Foods and Veterinary Medicine	Mike Batz
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\*Lead/leads identified

## Agenda

Time	Speaker name	Title
1:00-1:20 PM	Richard Forshee (FDA/CBER)	Issues in Reproducing and Replicating in Science
1:20-1:25 PM		Q & A
1:25-1:45 PM	David Miller (EPA)	Effect Size Magnification for Underpowered Studies: The role of the "Winner's Curse" in reproducibility issues
1:45- 1:50 PM		Q & A
1:50-2:10 PM	Yun Lu (FDA/CBER)	Quantitative Bias Analysis (QBA) for Observational Studies
2:10-2:15 PM		Q & A
2:15-2:35 PM	Hussein Ezzeldin (FDA/CBER)	Reproducibility and Replication of Research: Benefits and Challenges

Time	Speaker name	Title
2:35-2:40 PM		Q & A
2:40-2:50 PM		General Q & A
2:50-3:00 PM		Closing Remarks (Richard Forshee)
3:00 PM		Adjourn