

Name:	Mary Regina Boland
Affiliation:	University of Pennsylvania
Email:	bolandm@mail.med.upenn.edu
Presentation type (select one):	Lightning talk

## Uncovering Exposures Responsible for Birth Season – Disease Effects: A Global Study

Mary Regina Boland<sup>1-5,16</sup>, Pradipta Parhi<sup>6</sup>, Li Li<sup>7-8</sup>, Riccardo Miotto<sup>7-8</sup>, Robert Carroll<sup>9</sup>,  
Usman Iqbal<sup>11,13,16</sup>, Phung-Anh (Alex) Nguyen<sup>11,12,16</sup>, Martijn Schuemie<sup>14,16</sup>, Seng Chan  
You<sup>15-16</sup>, Donahue Smith<sup>17</sup>, Sean Mooney<sup>17</sup>, Patrick Ryan<sup>5,14,16</sup>, Yu-Chuan (Jack) Li<sup>12,13,16</sup>,  
Rae Woong Park<sup>15-16</sup>, Josh Denny<sup>9-10</sup>, Joel T Dudley<sup>7-8</sup>, George Hripcsak<sup>5,16</sup>, Pierre  
Gentine<sup>6</sup>, Nicholas P Tatonetti<sup>5,16</sup>

<sup>1</sup>Department of Biostatistics, Epidemiology and Informatics, University of Pennsylvania

<sup>2</sup>Institute for Biomedical Informatics, University of Pennsylvania

<sup>3</sup>Center for Excellence in Environmental Toxicology, University of Pennsylvania

<sup>4</sup>Department of Biomedical and Health Informatics, Children’s Hospital of Philadelphia

<sup>5</sup>Department of Biomedical Informatics, Columbia University

<sup>6</sup>Department of Earth and Environmental Engineering, Columbia University

<sup>7</sup>Department of Genetics and Genomic Sciences, Icahn School of Medicine at Mount Sinai

<sup>8</sup>Institute for Next Generation Healthcare, Icahn School of Medicine at Mount Sinai

<sup>9</sup>Department of Biomedical Informatics, Vanderbilt University Medical Center

<sup>10</sup>Department of Medicine, Vanderbilt University Medical Center

<sup>11</sup>Masters Program in Global Health & Development Department, College of Public  
Health, Taipei Medical University, Taiwan

<sup>12</sup>International Center for Health Information Technology, Taipei Medical University,  
Taiwan

<sup>13</sup>College of Medical Science and Technology, Taipei Medical University, Taiwan

<sup>14</sup>Janssen Research and Development

<sup>15</sup>Department of Biomedical Informatics, Ajou University School of Medicine

<sup>16</sup>Observational Health Data Sciences and Informatics, Columbia University

<sup>17</sup>Department of Biomedical Informatics, University of Washington

### Abstract

*Birth month and climate impact lifetime disease risk while the underlying exposures remain largely elusive. We seek to uncover distal risk factors underlying these relationships by probing the relationship between global exposure variance and disease risk variance by birth season. This study utilizes Electronic Health Record data from six sites representing ten and a half million individuals and three countries (USA, South Korea and Taiwan). Three of these sites are OHDSI collaborators. We obtained birth month – disease risk curves from each site in a case-control manner. Next, we correlated each birth month – disease risk curve with each exposure. A meta-analysis was then performed of correlations across sites. This allowed us to identify the most significant birth month – exposure relationships supported by all six sites while adjusting for multiplicity. We also successfully distinguish relative age effects (a cultural effect) from environmental exposures. Attention Deficit Hyperactivity Disorder was the only identified relative age association. Our methods identified several culprit exposures that correspond well with the literature in the field. We will discuss these findings at our talk.*

### Introduction

The relationship between seasonality, climate, and disease has been studied for millennia. Geographic location alters our exposure to climate factors generally [1], but also our exposure to a plethora of environmental factors. We previously constructed an algorithm, called SeaWAS for Season-Wide Association Study, to systematically

investigate birth month - disease dependencies across all diseases having sufficient prevalence in Electronic Health Records (EHRs) [2]. In all of our analyses, birth month serves as a proxy for birth seasonality. We conducted our initial SeaWAS study using data from the New York City (NYC) climate. Novel cardiovascular disease findings were then subsequently replicated at Mount Sinai Hospital [3].

In this study, we investigate the relationship between developmental stages (first, second, third trimester, perinatal or pregnancy-wide) and seasonal environmental exposures (climate, pollution, flu) for birth month – disease relationships. We also delineate birth month – disease relationships due to differences in school cutoff dates across sites indicating the effect of relative age on human health and disease. Because of the diversity of diseases associated with birth month or season, different mechanisms and exposures are likely to be involved depending on the particular disease implicated. We present results obtained using data from six distinct institutions, over three countries, spanning five cities, and four distinct climates. We identify risk factors involved in birth season associations.

### **Methods**

Our birth season – disease (SeaWAS: Season-Wide Association Study) algorithm conforms to the Common Data Model (CDM) adopted by the Observational Health Data Sciences and Informatics (OHDSI) consortium [4]. We provided the SeaWAS code to each of our collaborators, who ran it locally on their EHRs using OHDSI-formatted R scripts. Permission was obtained from each institution's local Institutional Review Board (IRB).

#### *Culture vs. Climate/Pollution Effects*

Importantly, two different types of effects can manifest themselves in variance in disease risk by birth month. The first is cultural/sociological related to the timing of school start-dates and the second is related to variance in pollution, climate factors (e.g., sunlight) that vary seasonally. These two types of birth month effects are important as both can result in changes in disease risk. For cultural effects of birth month, we investigate relative age effects [5]. We define relative age as an individual's age relative to the individual's peers in the same school grade. Relative age in school provides a competitive advantage for certain children with regards to sports performance [5]. This can result in changes in disease risk as children involved in sports are likely to experience more physical trauma (e.g., head trauma in football). Also children younger than their peers are more likely to be victims of bullying, which can alter neurological development via direct trauma (e.g., concussion) or indirect trauma (e.g., depression). It is important to separate and distinguish these cultural effects from other climate/pollution driven birth season effects.

### **Conclusion**

This comprehensive study of factors involved in birth month – disease risk used data from over 10 million patients, three countries, two continents, and five climates. We were able to distinguish the cultural effect of relative age from seasonal environmental exposures that both affect birth month – disease dependencies. We were also able to identify both the seasonal environmental exposure and the stage that resulted in increased disease risk. Several important findings were noted and will be discussed at the talk.

### **Acknowledgments**

We would like to thank Dr. Andrew Gelman, Department of Statistics, Columbia University for his tremendous help, support, and guidance during this project. Support for this research was provided through the following mechanisms. MRB is supported by generous funding by the Perelman School of Medicine, University of Pennsylvania. MRB was supported by the National Library of Medicine training grant T15 LM00707 (MRB) from Jul 2014 – Jun. 2016. MRB was supported by the NCATS, NIH, through TL1 TR000082, formerly the NCRN, TL1 RR024158 from Jul. 2016 – Jun. 2017. MRB and NPT were both supported by R01 GM107145. DS was supported by the National Library of Medicine training grant at the University of Washington T15 LM007442. SM was supported by the National Center for Advancing Translational Sciences (NCATS), NIH, through UL1 TR000423. SCY, RWP were supported by a grant of the Korea Health Technology R&D Project through the Korea Health Industry Development Institute (KHIDI), funded by the Ministry of Health & Welfare, Republic of Korea (grant number: HI16C0992).

### **References**

1. Boland MR, Parhi P, Gentile P, Tatonetti NP. Climate Classification is an Important Factor in Assessing Quality-of-Care Across Hospitals. *Scientific Reports*. 2017;7.
2. Boland MR, Shah Z, Madigan D, Hripcsak G, Tatonetti NP. Birth Month Affects Lifetime Disease Risk: A Phenome-Wide Method. *Journal of the American Medical Informatics Association : JAMIA*. 2015;22:1042-53.
3. Li L, Boland MR, Miotto R, Tatonetti NP, Dudley JT. Replicating cardiovascular condition-birth month associations. *Scientific reports*. 2016;6.
4. Overhage JM, Ryan PB, Reich CG, Hartzema AG, Stang PE. Validation of a common data model for active safety surveillance research. *Journal of the American Medical Informatics Association*. 2012;19(1):54-60.
5. Musch J, Grondin S. Unequal Competition as an Impediment to Personal Development: A Review of the Relative Age Effect in Sport. *Developmental Review*. 2001;21(2):147-67.