

# Reproducible Research Case Study

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# What Causes PM to be Toxic?

- ▶ PM is composed of many different chemical elements
- ▶ Some components of PM may be more harmful than others
- ▶ Some sources of PM may be more dangerous than others
- ▶ Identifying harmful chemical constituents may lead us to strategies for controlling sources of PM

# NMMAPS

- ▶ The National Morbidity, Mortality, and Air Pollution Study (NMMAPS) was a national study of the short-term health effects of ambient air pollution
- ▶ Focused primarily on particulate matter ( $PM_{10}$ ) and ozone ( $O_3$ )
- ▶ Health outcomes included mortality from all causes and hospitalizations for cardiovascular and respiratory diseases
- ▶ Key publications
  - ▶ <http://www.ncbi.nlm.nih.gov/pubmed/11098531>
  - ▶ <http://www.ncbi.nlm.nih.gov/pubmed/11354823>
- ▶ Funded by the Health Effects Institute
- ▶ Roger Peng currently serves on the Health Effects Institute Health Review Committee

# NMMAAPS and Reproducibility

- ▶ Data made available at the Internet-based Health and Air Pollution Surveillance System (<http://www.ihapss.jhsph.edu>)
- ▶ Research results and software also available at iHAPSS
- ▶ Many studies (over 67 published) have been conducted based on the public data  
<http://www.ncbi.nlm.nih.gov/pubmed/22475833>
- ▶ Has served as an important test bed for methodological development

# What Causes Particulate Matter to be Toxic?

## Research

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### Cardiovascular Effects of Nickel in Ambient Air

**Morton Lippmann,<sup>1\*</sup> Kazuhiko Ito,<sup>1</sup> Jing-Shiang Hwang,<sup>2</sup> Polina Maciejczyk,<sup>1</sup> and Lung-Chi Chen<sup>1\*</sup>**

<sup>1</sup>New York University School of Medicine, Nelson Institute of Environmental Medicine, Tuxedo, New York, USA; <sup>2</sup>Institute of Science, Academia Sinica, Taipei, Taiwan

<http://www.ncbi.nlm.nih.gov/pmc/articles/PMC1665439/>

- ▶ Lippmann *et al.* found strong evidence that Ni modified the short-term effect of  $PM_{10}$  across 60 US communities
- ▶ No other PM chemical constituent seemed to have the same modifying effect
- ▶ Too simple to be true?

# A Reanalysis of the Lippmann *et al.* Study

Research

## Does the Effect of PM<sub>10</sub> on Mortality Depend on PM Nickel and Vanadium Content? A Reanalysis of the NMMAPS Data

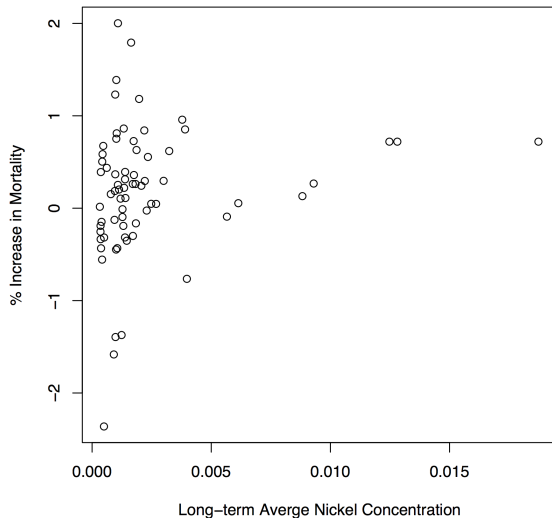
*Francesca Dominici,<sup>1</sup> Roger D. Peng,<sup>1</sup> Keita Ebisu,<sup>2</sup> Scott L. Zeger,<sup>1</sup> Jonathan M. Samet,<sup>3</sup> and Michelle L. Bell<sup>2</sup>*

<sup>1</sup>Department of Biostatistics, Johns Hopkins Bloomberg School of Public Health, Baltimore, Maryland, USA; <sup>2</sup>School of Forestry and Environmental Studies, Yale University, New Haven, Connecticut, USA; <sup>3</sup>Department of Epidemiology, Johns Hopkins Bloomberg School of Public Health, Baltimore, Maryland, USA

<http://www.ncbi.nlm.nih.gov/pmc/articles/PMC2137127/>

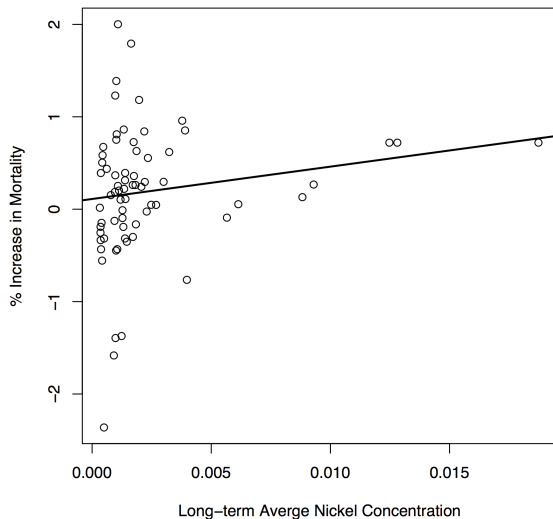
- ▶ Reexamine the data from NMMAPS and link with PM chemical constituent data
- ▶ Are the findings sensitive to levels of Nickel in New York City?

# Does Nickel Make PM Toxic?



- ▶ Long-term average nickel concentrations appear correlated with PM risk

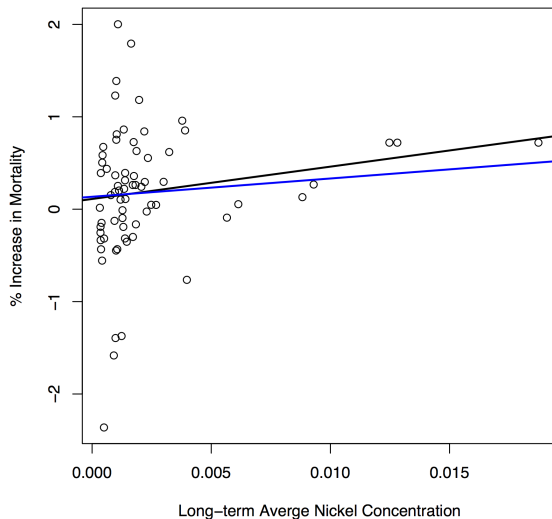
# Does Nickel Make PM Toxic?



- ▶ Regression line statistically significant ( $p < 0.01$ )

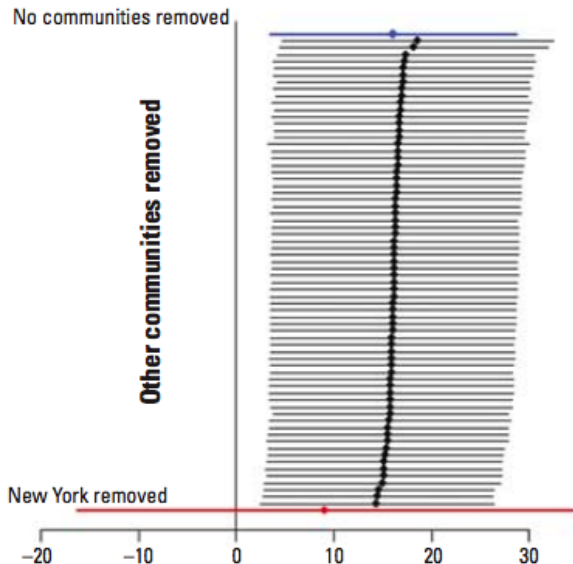


# Does Nickel Make PM Toxic?



- ▶ Adjusted regression line (blue) no longer statistically significant ( $p < 0.31$ )

# Does Nickel Make PM Toxic?



# What Have We Learned?

- ▶ New York does have very high levels of nickel and vanadium, much higher than any other US community
- ▶ There is evidence of a positive relationship between Ni concentrations and  $PM_{10}$  risk
- ▶ The strength of this relationship is highly sensitive to the observations from New York City
- ▶ Most of the information in the data is derived from just 3 observations

# Lessons Learned

- ▶ Reproducibility of NMMAPS allowed for a secondary analysis (and linking with PM chemical constituent data) investigating a novel hypothesis (Lippmann *et al.*)
- ▶ Reproducibility also allowed for a critique of that new analysis and some additional new analysis (Dominici *et al.*)
- ▶ Original hypothesis not necessarily invalidated, but evidence not as strong as originally suggested (more work should be done)
- ▶ Reproducibility allows for the scientific discussion to occur in a timely and informed manner
- ▶ This is how science works