

Accountability and Attribution: Origin and Applications

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HEI Annual Conference

May 1, 2017

Morton Levin's Attributable Risk Formula

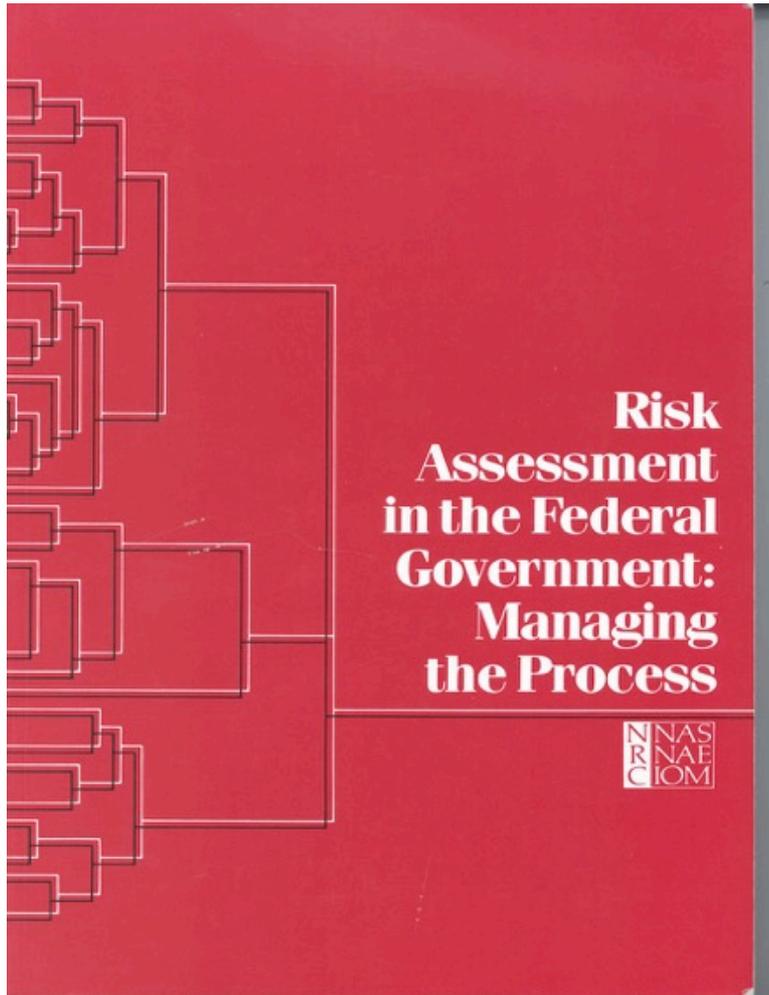


Johns Hopkins School of Hygiene
and Public Health, Department of
Epidemiology, c. 1935-36

- Estimate the Relative Risk (RR)
- Estimate the prevalence (P) of each risk factor.
- Calculate population attributable risk (PAR)

$$\text{PAR} = \frac{P (RR - 1)}{1 + P(RR - 1)}$$

The “Red Book”



Elements of Quantitative Risk Assessment (QRA)

Hazard ID

Dose-response

Exposure assessment

Risk characterization

Applications

SAMMEC

Smoking-Attributable Mortality, Morbidity, and Economic Costs

Table 12.4 Annual deaths and estimates of smoking-attributable mortality (SAM) for adults 35 years of age and older, total and by gender, United States, 2005–2009

Disease	Males				Females				Total	
	Deaths	SAM	Attributable fraction (%)	Deaths	SAM	Attributable fraction (%)	Deaths	SAM	Attributable fraction (%)	
Lung cancer	88,730	74,300	83.74	69,800	56,359	80.74	158,530	130,659	82.42	
Other cancers ^a	102,940	26,000	25.26	75,540	10,000	13.24	178,480	36,000	20.17	
Total—Cancers	191,670	100,300	52.33	145,340	63,400	43.62	337,010	163,700	48.57	
Coronary heart disease	218,870	61,800	28.24	193,720	37,500	19.36	412,590	99,300	24.07	
Other heart disease ^b	75,670	13,400	17.71	96,200	12,100	12.58	171,870	25,500	14.84	
Cerebrovascular disease ^c	53,610	8,200	15.30	81,300	7,100	8.73	134,920	15,300	11.34	
Other vascular disease ^d	14,480	6,000	41.43	15,510	5,500	35.47	29,990	11,500	38.35	
Diabetes mellitus	35,200	6,200	17.61	35,600	2,800	7.86	70,810	9,000	12.71	
Total—Cardiovascular and metabolic diseases	397,840	95,600	24.03	422,330	65,000	15.39	820,170	160,600	19.58	
Pneumonia, influenza, tuberculosis	25,300	7,800	30.83	30,290	4,700	15.52	55,590	12,500	22.49	
COPD	61,430	50,400	82.04	66,300	50,200	75.71	127,740	100,600	78.76	
Total—Pulmonary diseases^e	86,730	58,200	67.10	96,590	54,900	56.84	183,320	113,100	61.70	
Total—Cancers, cardiovascular and metabolic diseases, pulmonary diseases	676,240	254,100	37.58	664,260	183,300	27.59	1,340,500	437,400	32.63	
Prenatal conditions ^f	5,970	346	5.80	4,620	267	5.78	10,590	613	5.79	
Sudden infant death syndrome ^g	1,370	236	17.26	950	164	17.26	2,320	400	17.26	
Perinatal conditions	7,340	582	7.93	5,570	431	7.74	12,900	1,013	7.85	
Residential fires		336			284			620	-	
Secondhand smoke										

Source: <https://www.ncbi.nlm.nih.gov/books/NBK294316/>

Applications

GBD

Global Burden of Disease

IHME | GHDx Search

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Institute for Health Metrics and Evaluation

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Global Burden of Disease (GBD)

GBD

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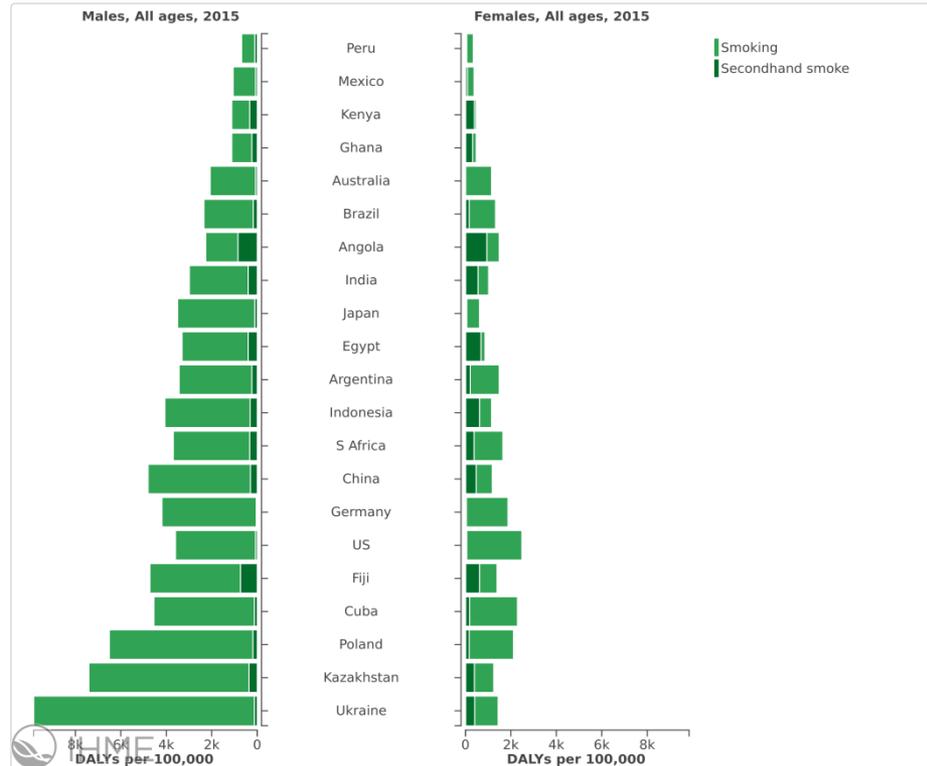
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Increase in global life expectancy offset by war, obesity, and substance abuse

Improvements in sanitation, immunizations, indoor air quality, and nutrition have enabled children in poor countries to live longer over the past 25 years, according to a new scientific analysis of more than 300 diseases and injuries in 195 countries and territories.

Applications

SAMMEC

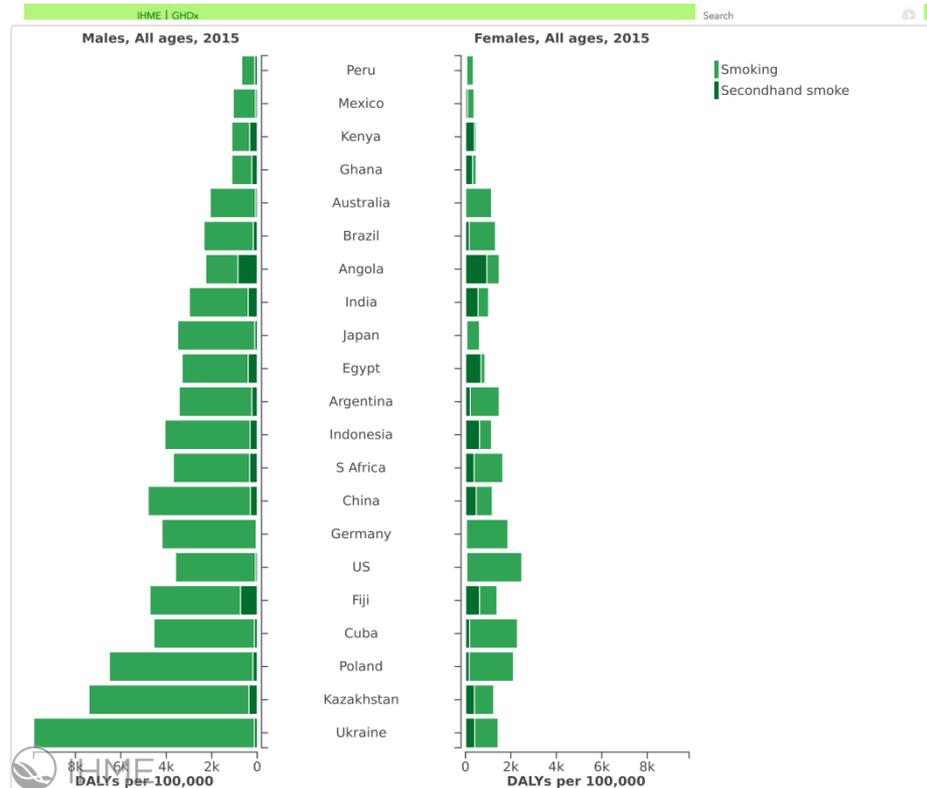
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GBD

Global Burden of Disease



Environmental Public Health Tracking

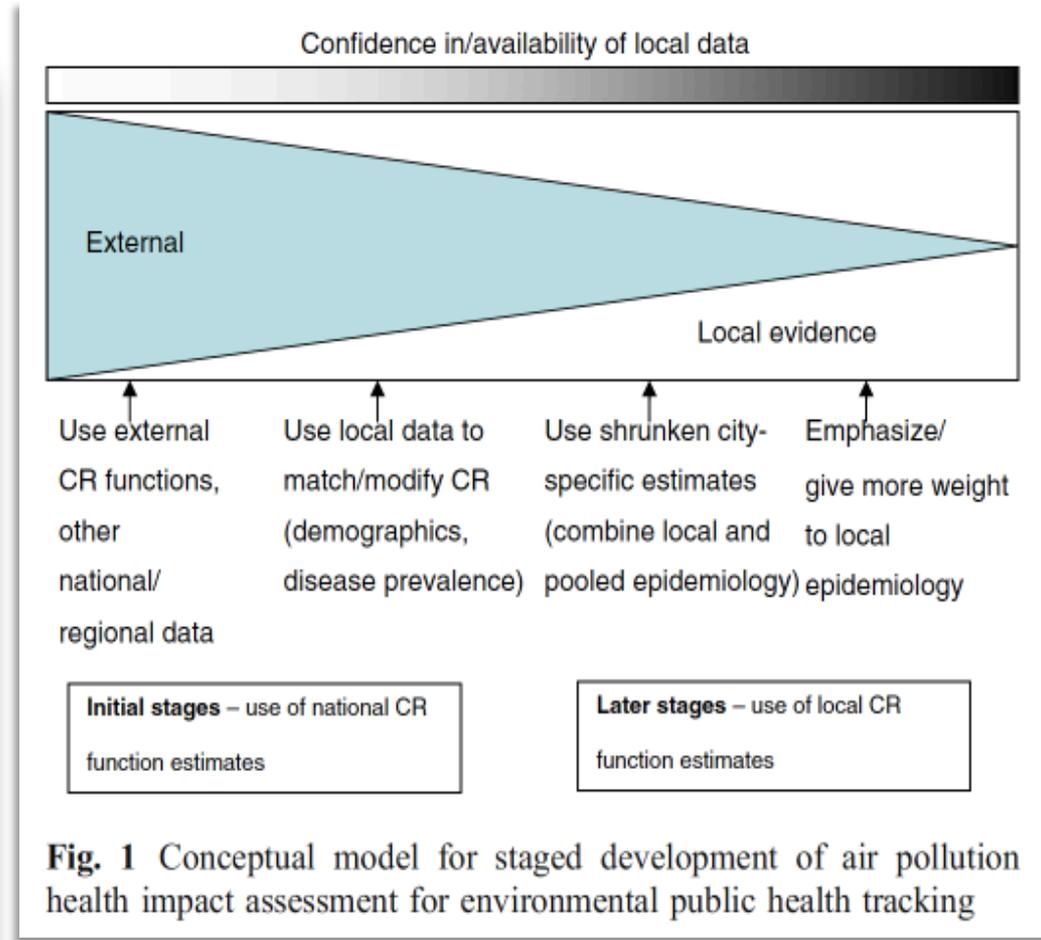
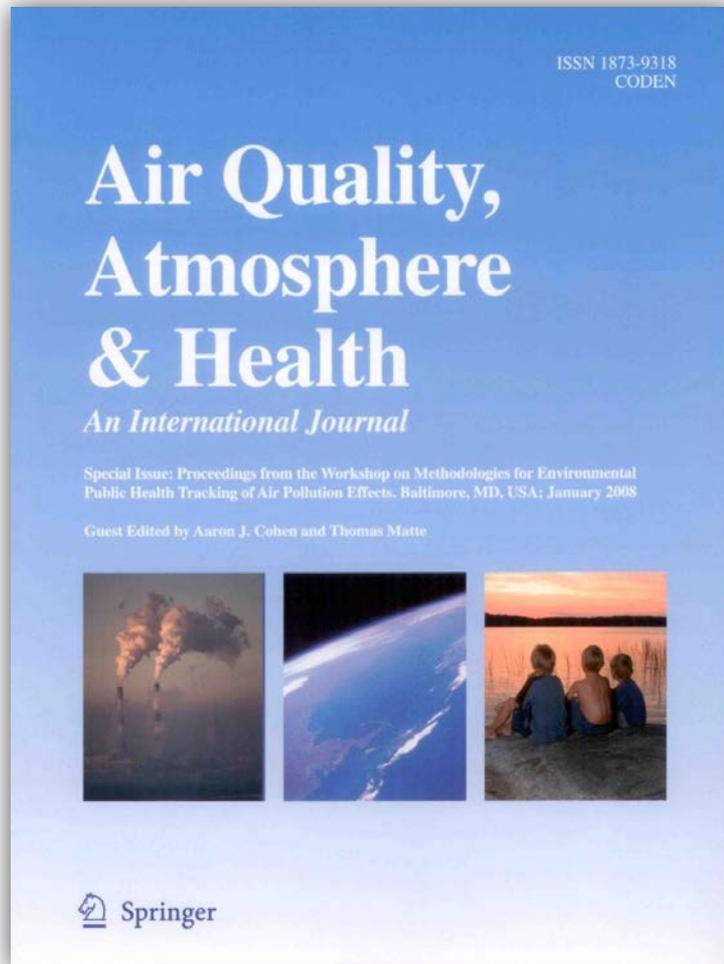


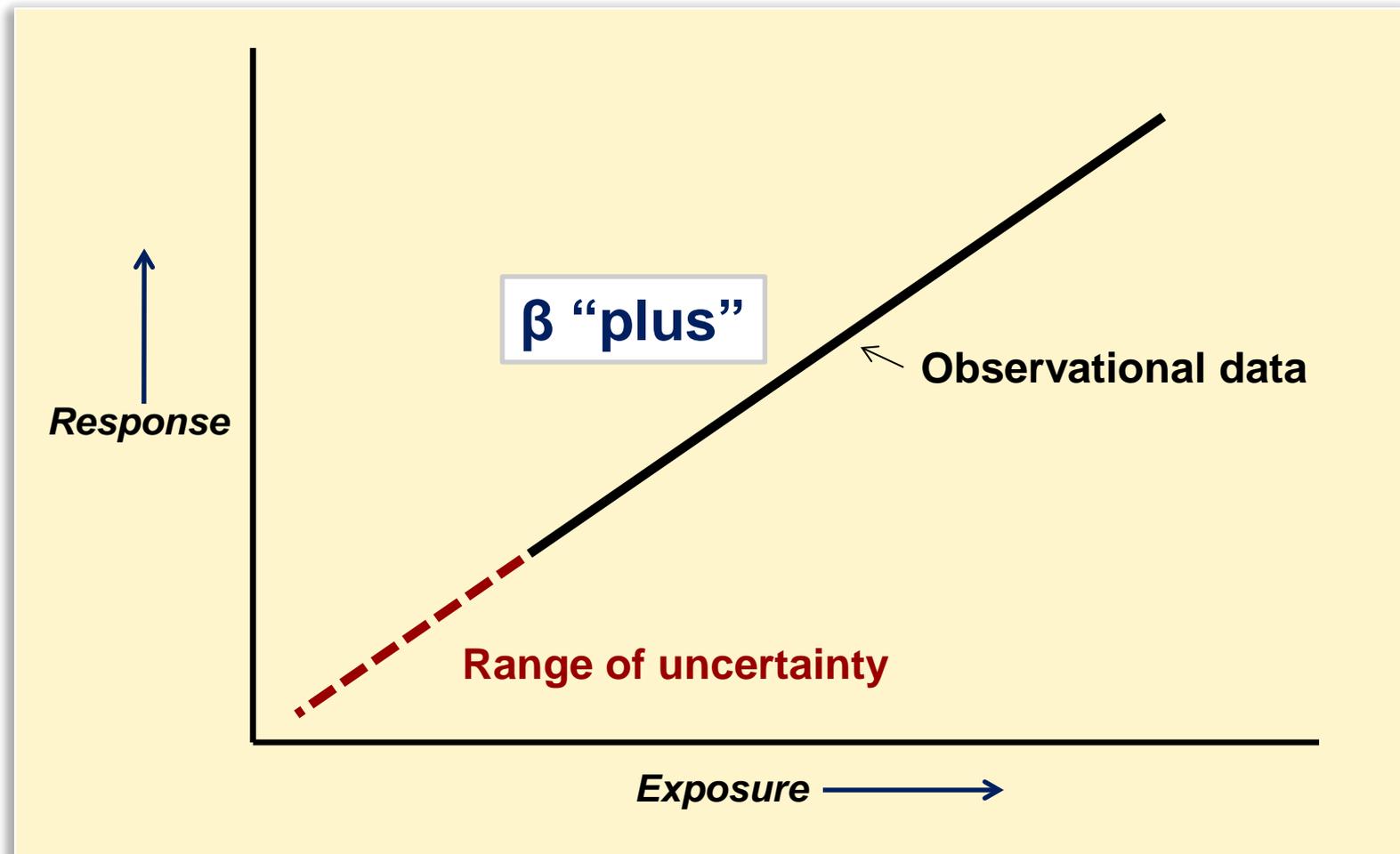
Fig. 1 Conceptual model for staged development of air pollution health impact assessment for environmental public health tracking

Back to the beginning: Rationale for accountability studies

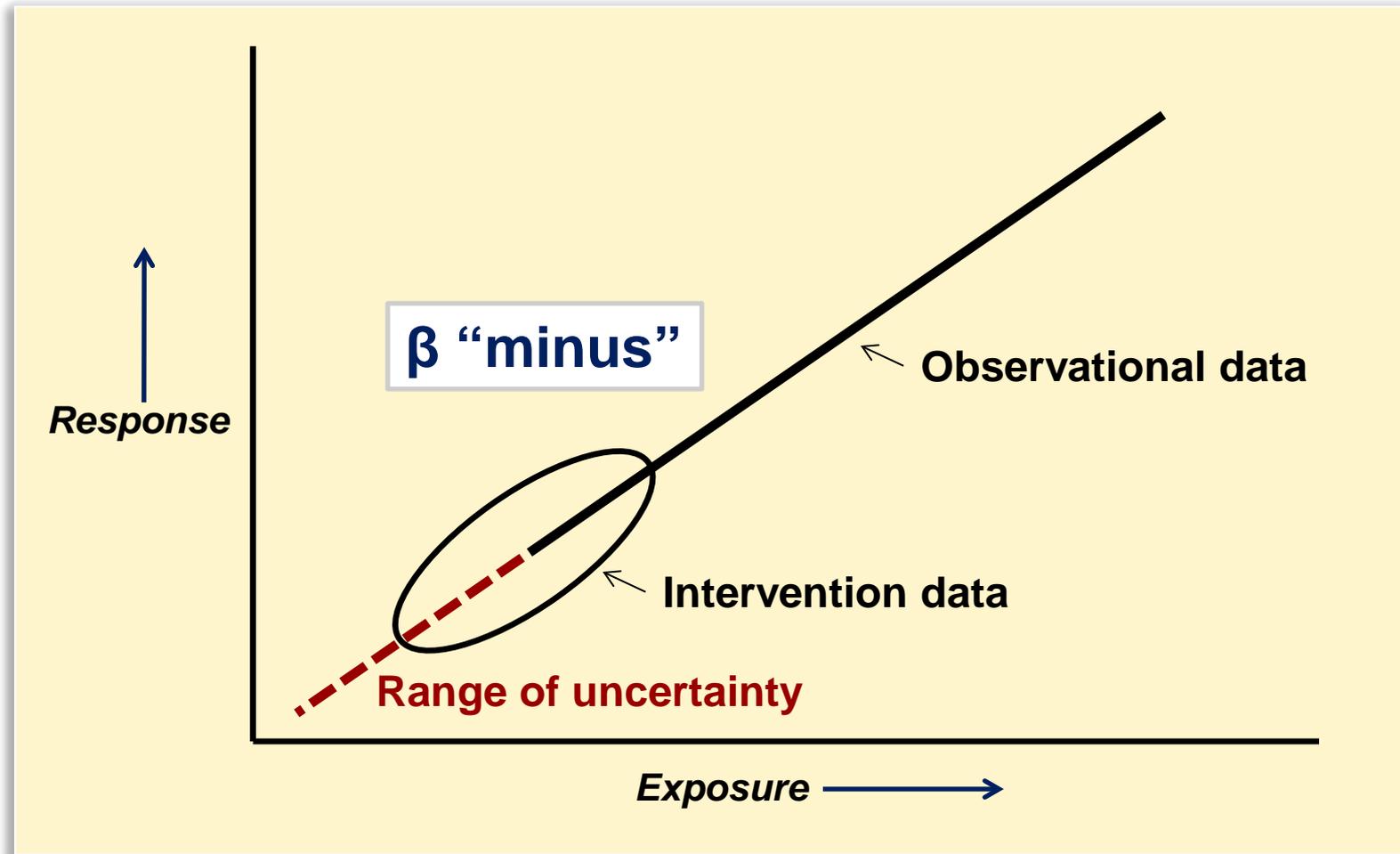
- There is (was) a call for it.
- Strengthen basis for causal inference ($\beta+$ vs. $\beta-$).
- Assess consequences of specific interventions.
- Provide “validation” of risk assessments.

+ and - refer to whether air pollutant concentrations are increasing (more emissions or higher-pollution location) or decreasing (intervention or clean air policies).

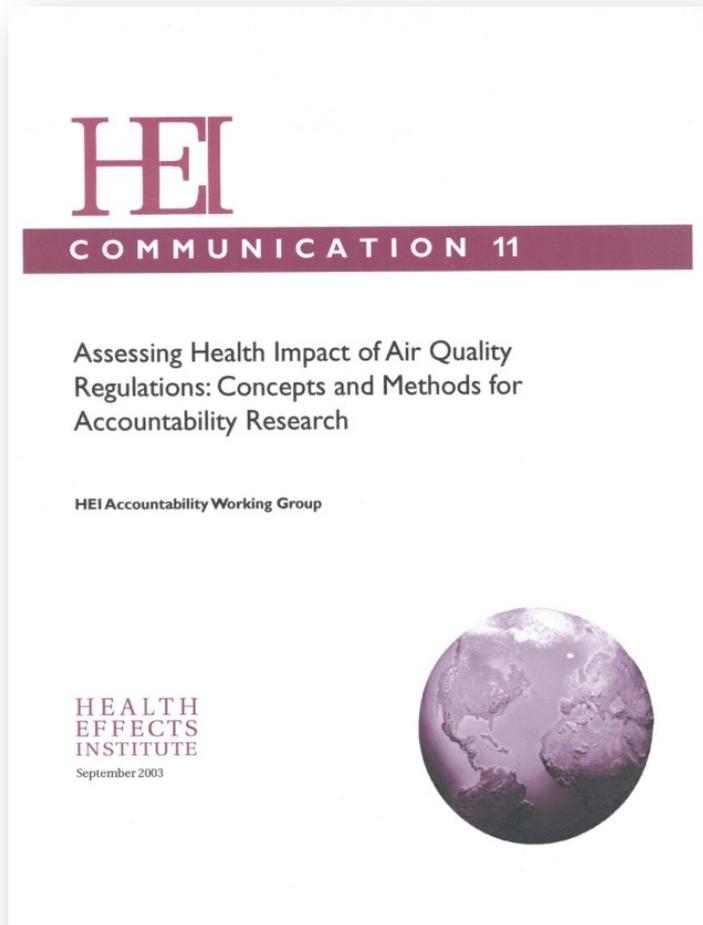
Interventions and Dose-Response



Interventions and Dose-Response

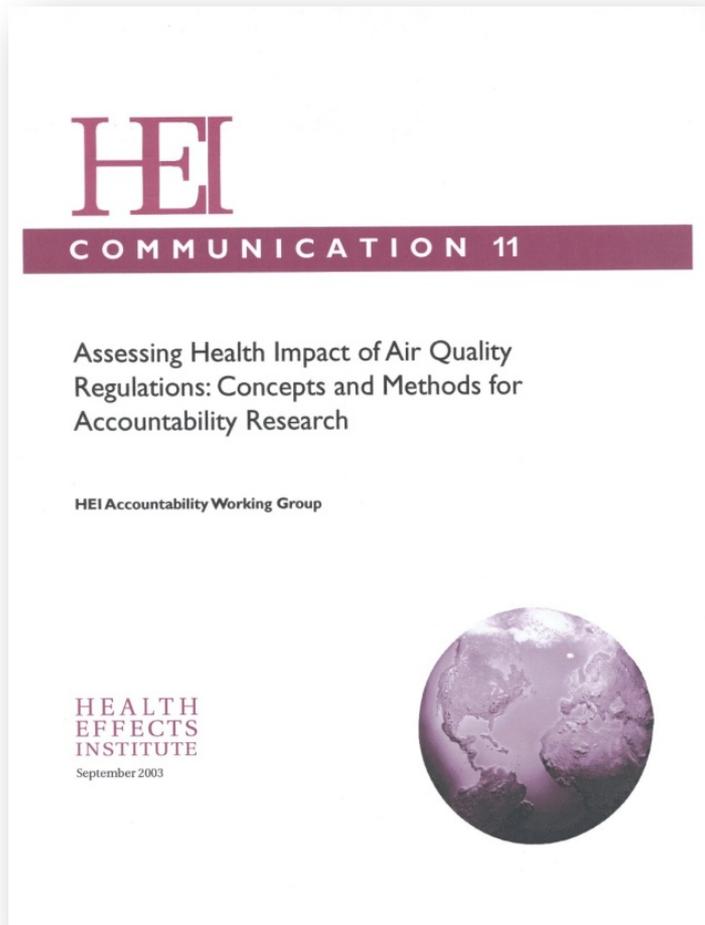


Accountability: Communication 11



“Evaluating the extent to which air quality regulations improve public health is part of a broad effort—termed ***accountability***—to assess the performance of all environmental regulatory policies.”

September, 2003



What did Communication 11 propose?

- **Chain of accountability**
- **Conceptual framework**
- **Research recommendations**

Chain of Accountability

**Regulatory
Action**

Compliance,
effectiveness

Emissions

Atmospheric transport
chemical transformation and
deposition

**Ambient Air
Quality**

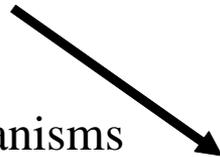
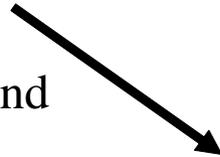
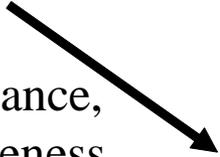
Human time activity
in relation to indoor
and outdoor air quality

**Exposure/
Dose**

Uptake, deposition,
clearance, retention

**Human
Health**

Susceptibility factors; mechanisms
of damage and repair, health
outcomes



Communication 11: Recommendations

- Developing and implementing new study designs
- Identifying targets of opportunity
 - PM and O₃ NAAQS implementation
 - Air Toxics Control Plan
 - Targets at local level
- Developing surveillance systems

Accountability: Communications 14 and 15

HEI SEPTEMBER 2009
Communication 14
HEALTH EFFECTS INSTITUTE

HEI's Research Program on the Impact
of Actions to Improve Air Quality:
Interim Evaluation and Future Directions

Annemoon M. van Erp and Aaron J. Cohen

2009



HEI AUGUST 2010
Communication 15
HEALTH EFFECTS INSTITUTE

Proceedings of an HEI Workshop on Further
Research to Assess the Health Impacts of
Actions Taken to Improve Air Quality

2010





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[Particulate **air pollution** and mortality in the United ...](#) - [Dominici](#) - Cited by 31
[... perspectives on the public experience of **air pollution**](#) - [Bickerstaff](#) - Cited by 53
[... and bottom-up approaches to implementation **research** ...](#) - [Sabatier](#) - Cited by 586

[Accountability: Targets of Opportunity](#)

 Aug 26, 2004 ... Continually changing **air pollution** regulations in the United States, ...

Accountability research concerning these air toxics might include ...

www.healtheffects.org/accountability.htm - [Cached](#) - [Similar](#)

[Health Effects Institute - Home Page](#)

Research Report 142, **Air Pollution** and Health: A European and North ... HEI publishes Evaluation of **Accountability Research** Program – September 2009 ...

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[\[PDF\] US EPA: ACCOUNTABILITY RESEARCH: ASSESSING THE IMPACT OF AIR ...](#)

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Accountability research in air science is inherently multidisciplinary. ... **air pollution** sciences that link sources to air quality as well as ...

www.epa.gov/airscience/pdf/ca-factsheet-accountability.pdf

[Air regulation support research | Research and Development | US EPA](#)

 US EPA: **Accountability Research**: Assessing the Impact of **Air** Quality Regulations ...

Accountability research in air science is inherently multidisciplinary. ...

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[Multi-Pollutant Accountability](#)

 A meeting of Lead Authors for the NARSTO multi-pollutant **accountability** assessment was held in **Research** Triangle Park, North Carolina. ... A workshop on modeling issues in multi-pollutant **air** quality management was held in Denver on ...

www.narsto.org/mpacc.src - [Cached](#) - [Similar](#)

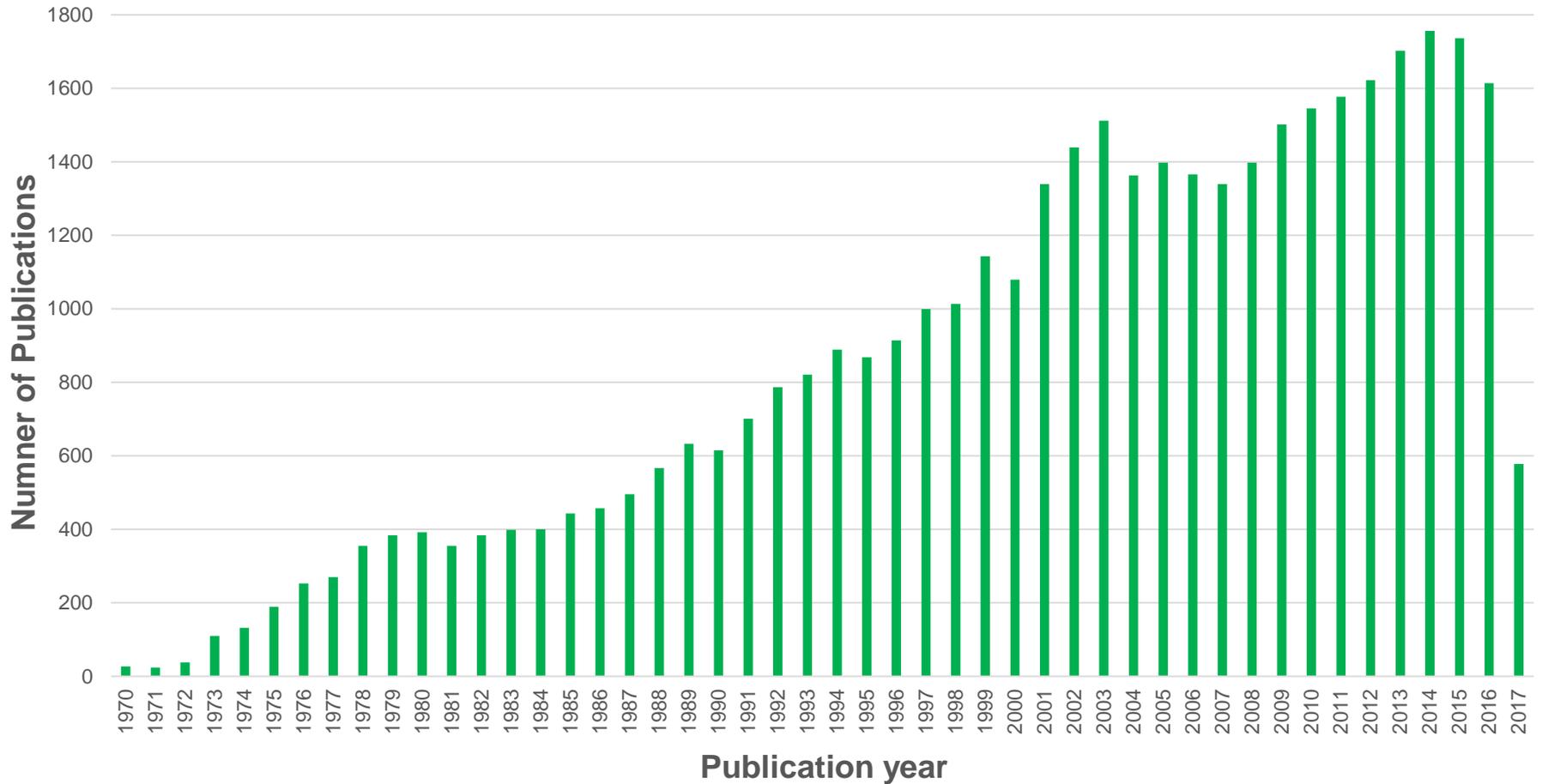
[NEJM -- Evaluating the Effects of Ambient Air Pollution on Life ...](#)

 by D Krewski - 2009 - [Cited by 2](#) - [Related articles](#)

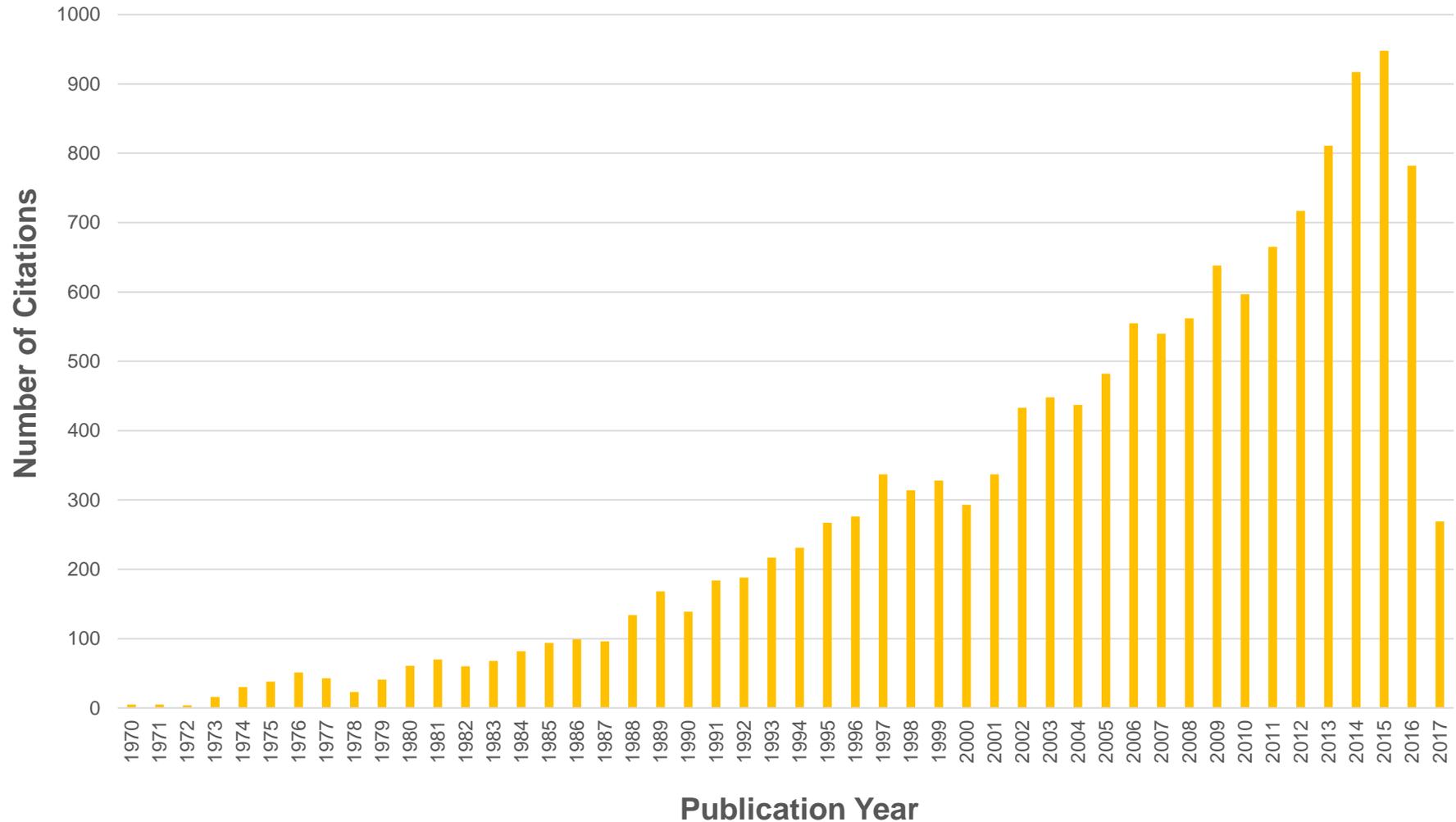
 Jan 5, 2009 ... **Air pollution** is an important determinant of population health. quality regulations: concepts and methods for **accountability research**. ...

content.nejm.org/cgi/content/full/360/4/413 - [Similar](#)

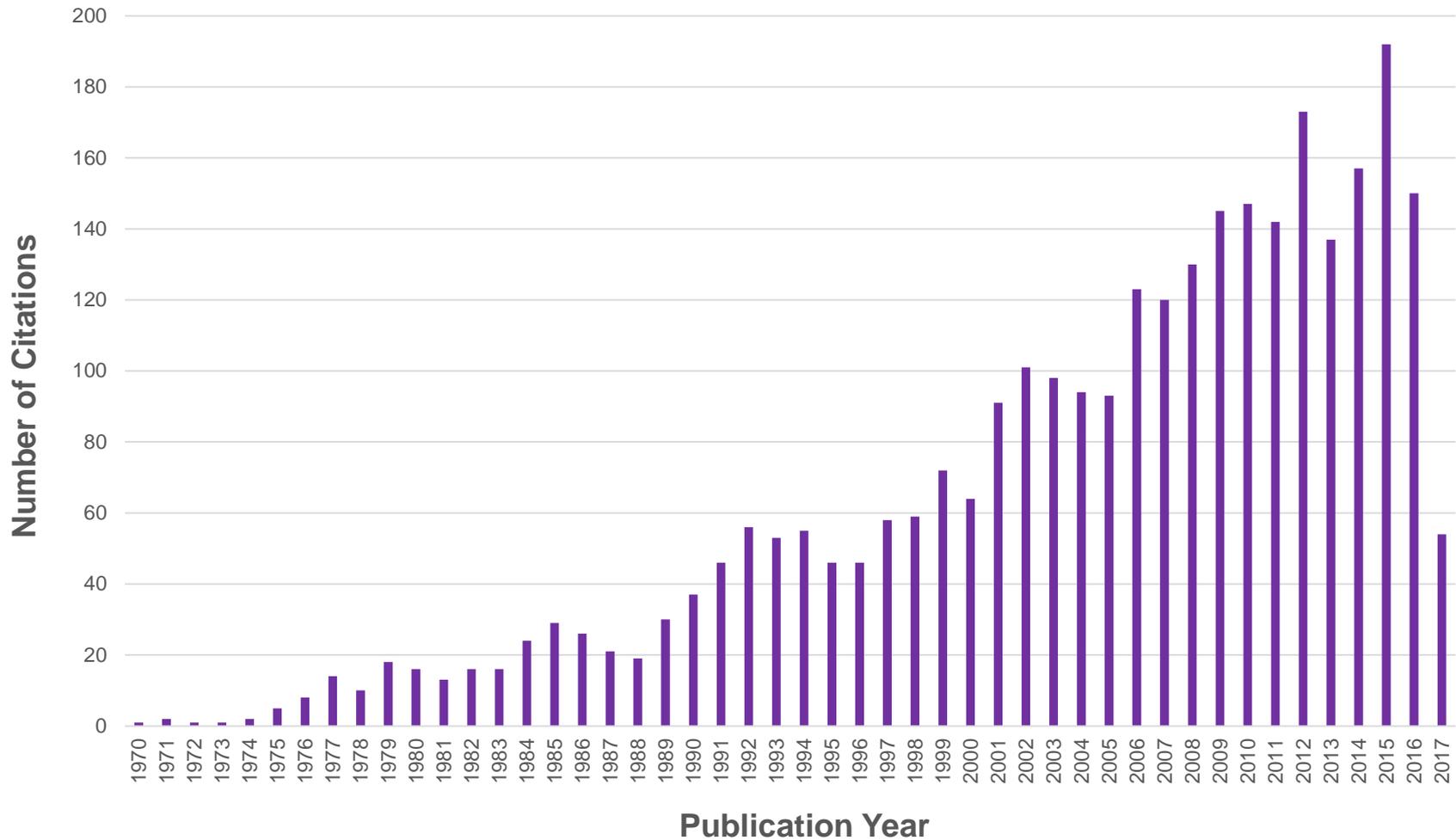
PubMed Analysis: Accountability



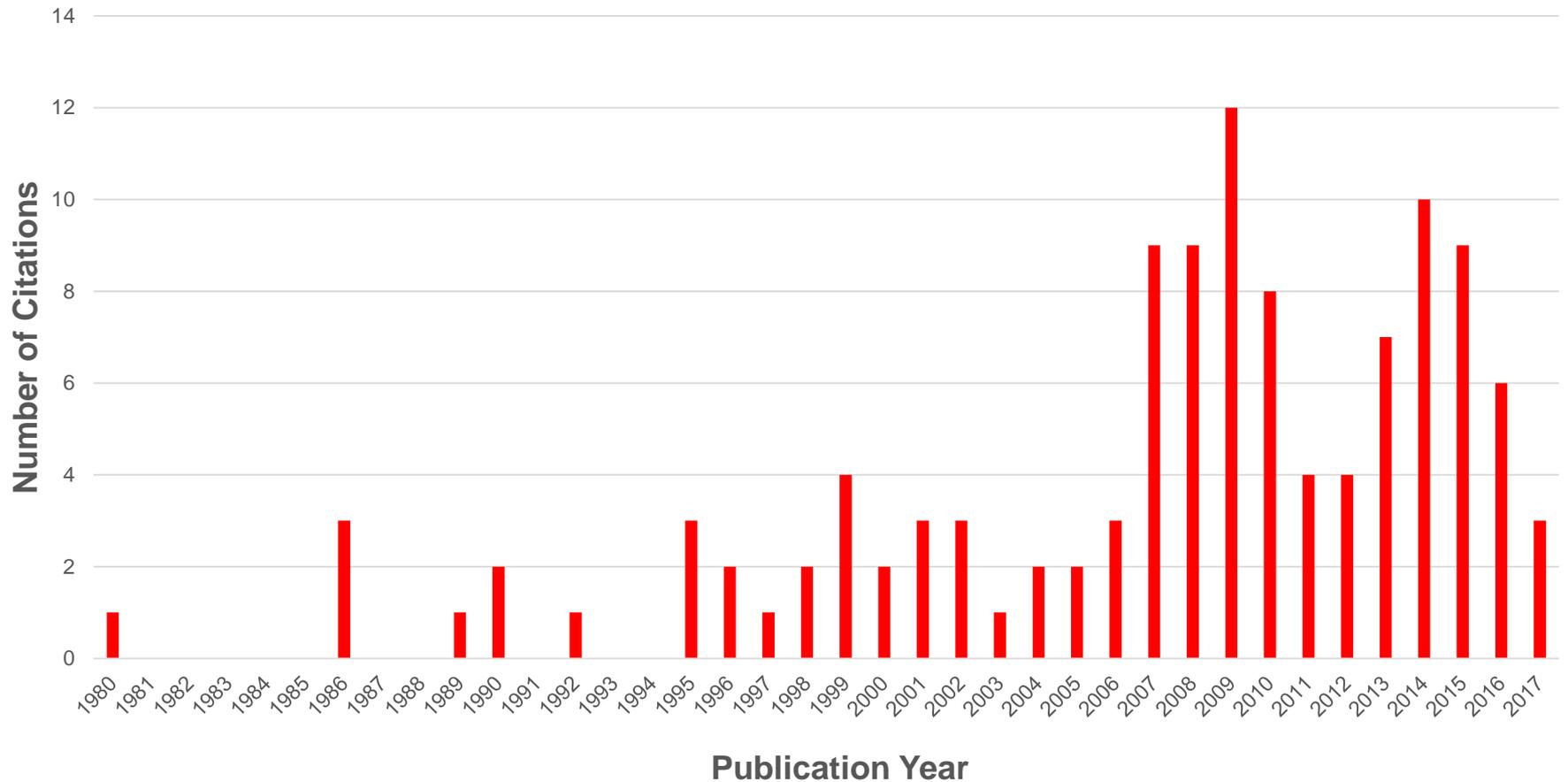
PubMed Analysis: Accountability AND Research



PubMed Analysis: Accountability AND Environment



PubMed Analysis: Accountability AND Air Pollution



Respiratory Disease Associated with Community Air Pollution and a Steel Mill, Utah Valley

AJPH 1989; 79 (5): 623-8

C. ARDEN POPE III, PhD

Abstract: This study assessed the association between hospital admissions and fine particulate pollution (PM₁₀) in Utah Valley during the period April 1985–February 1988. This time period included the closure and reopening of the local steel mill, the primary source of PM₁₀. An association between elevated PM₁₀ levels and hospital admissions for pneumonia, pleurisy, bronchitis, and asthma was observed. During months when 24-hour PM₁₀ levels exceeded 150 µg/m³, average admissions for children nearly tripled; in adults, the increase in admissions was 44 per cent. During months with mean PM₁₀ levels greater than or equal to 50 µg/m³ average admissions for children and adults increased by 89 and 47 per cent, respectively. During the winter months when the steel mill was open, PM₁₀ levels

were nearly double the levels experienced during the winter months when the mill was closed. This occurred even though relatively stagnant air was experienced during the winter the mill was closed. Children's admissions were two to three times higher during the winters when the mill was open compared to when it was closed. Regression analysis also revealed that PM₁₀ levels were strongly correlated with hospital admissions. They were more strongly correlated with children's admissions than with adult admissions and were more strongly correlated with admissions for bronchitis and asthma than with admissions for pneumonia and pleurisy. (*Am J Public Health* 1989; 79:623–628.)

Introduction

On March 20, 1984, the US Environmental Protection Agency (EPA) proposed changes in the national ambient air quality standards for particulate pollution. Total suspended particulates (TSP) was to be replaced with a new indicator of particulate pollution that includes only those particulates with an aerodynamic diameter equal to or less than a nominal 10 micrometers (PM₁₀). On July 1, 1987, the EPA announced its final decision. The previous primary TSP standards were to be replaced, effective July 31, 1987, with a 24-hour PM₁₀ standard of 150 micrograms per cubic meter (µg/m³) with no more than one expected exceedance per year and an annual

Methods

Study Area

Utah Valley, located in Utah County of Central Utah, is the third largest county in the state with a population of 258,000 in 1987.²⁴ Approximately two-thirds of the population resides in five nearly contiguous cities situated on a valley floor with an elevation of approximately 1,402 meters above sea level bordered east and west by mountains (Figure 1).

Based on an unpublished 1986 Utah State Department of Health survey, only 5.5 per cent of Utah County's adults (18 years of age or older) smoke; approximately 90 per cent of its

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Intro

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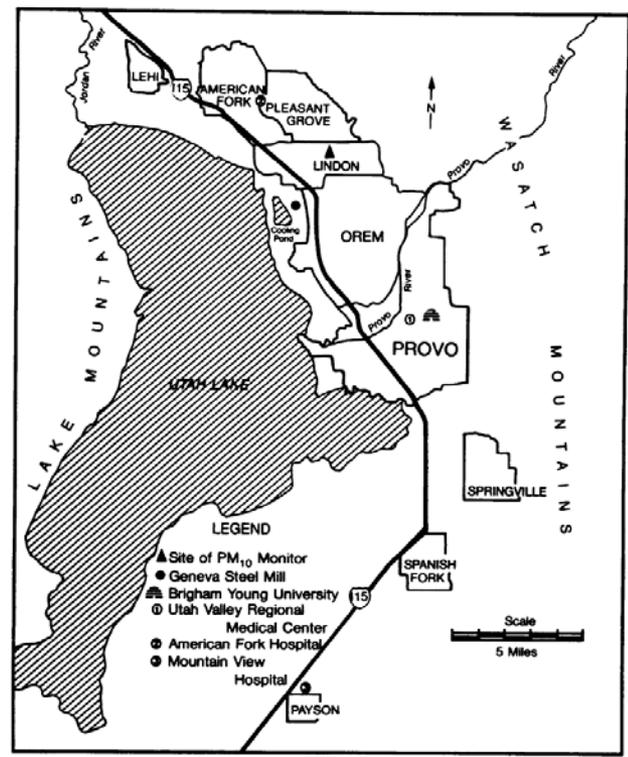
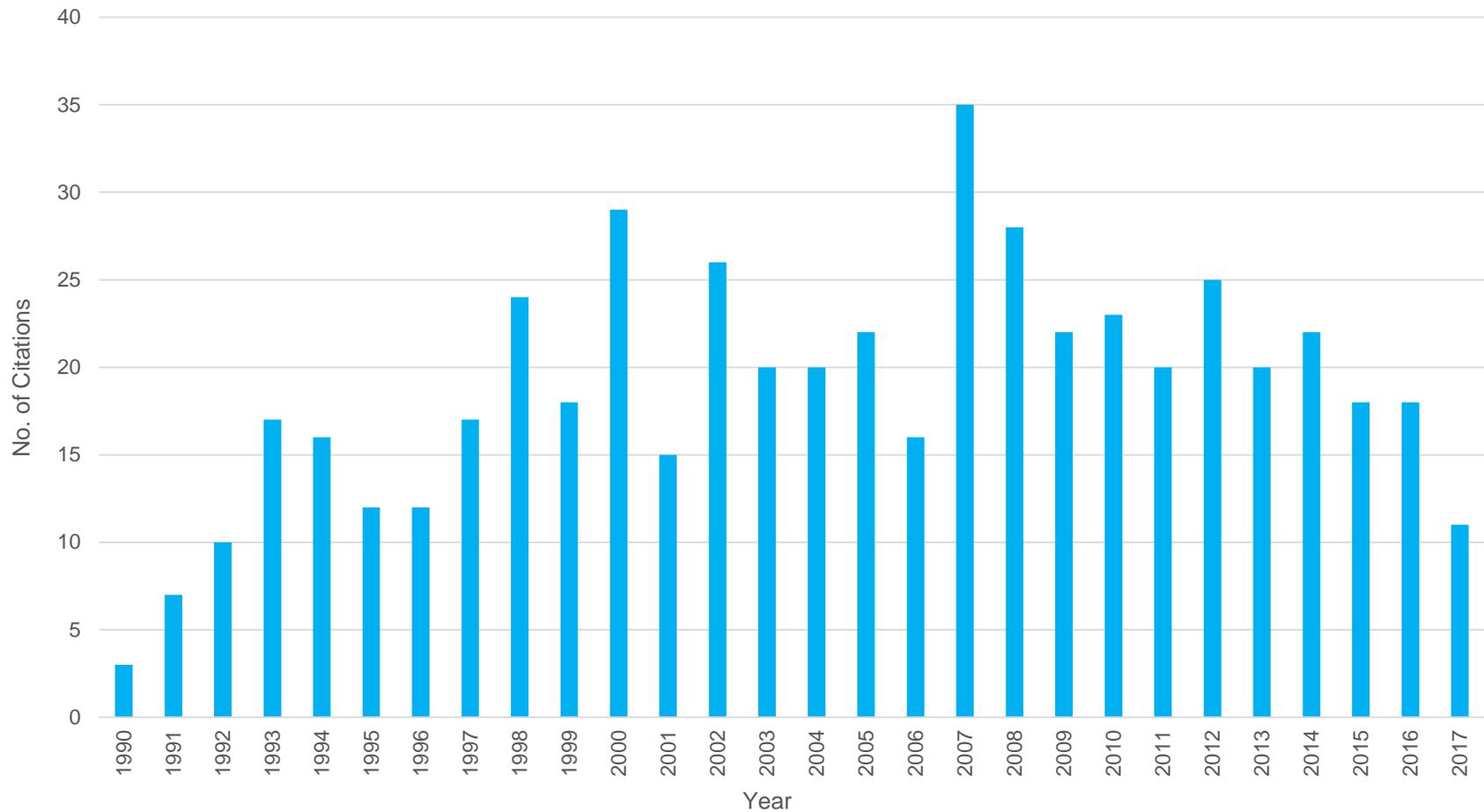


FIGURE 1—Study Area, Utah Valley

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No. of citations for *Pope 1989* (n=543)

Pope CA 3rd. Respiratory disease associated with community air pollution and a steel mill, Utah Valley. AJPH 1989 May;79(5):623-8.

Data from Google Scholar



Air Quality Criteria for Particulate Matter

*U.S. EPA. Air Quality Criteria for Particulate Matter (Final Report, Oct 2004).
U.S. Environmental Protection Agency, Washington, DC, EPA 600/P-99/002aF-bF, 2004*

Available at: <http://cfpub.epa.gov/ncea/cfm/recordisplay.cfm?deid=87903>

8.2.3.4 PM-Mortality Intervention Studies

Although many studies have reported short-term associations between PM indices and mortality, a largely unaddressed question remains as to the extent to which reductions in ambient air PM actually lead to reductions in deaths attributable to PM. This question is not only important in terms of “accountability” from the regulatory point of view, but it is also a scientific question that challenges the predictive validity of statistical models and their underlying assumptions used thus far to estimate excess mortality due to ambient PM.

The opportunities to address this question are rare. However, at the time of the 1996 PM AQCD, one situation presented a good opportunity for a PM intervention study—that being the Utah Valley situation evaluated by Pope. In the Pope (1989) analysis of PM_{10} and children’s hospital admissions in Utah Valley, the study period contained the 13-month steel mill closure mentioned earlier (during which time PM_{10} concentrations averaged $35 \mu\text{g}/\text{m}^3$ versus $50 \mu\text{g}/\text{m}^3$ when the mill was opened). Analyses of children’s respiratory admissions in Utah Valley before and after the steel mill closure provided evidence of decreased morbidity resulting from the lower PM_{10} concentrations during the mill closure.

Two more recent mortality intervention studies have examined: (1) the impact of a ban on coal sale in Dublin, Ireland (Clancy et al., 2002); and (2) the impact of a regulation to use fuel oil with low sulfur content in Hong Kong (Hedley et al., 2002). These regulations were enforced

Integrated Science Assessment for Particulate Matter

The objective of the Dominici et al. (2007, [097361](#)) study described above was motivated by accountability research, the idea of measuring the impact of policy interventions. However, unlike the intervention studies conducted in Hong Kong (Hedley et al., 2002, [040284](#)) and Dublin, Ireland (Clancy et al., 2002, [035270](#)) that were reviewed in the 2004 PM AQCD (U.S. EPA, 2004, [056905](#)), this study was not designed to estimate a reduction in mortality in response to a sudden change in air pollution. In fact, the figure of observed trend in PM₁₀ levels presented in the Dominici et al. (2007, [097361](#)) study indicates that the decline in PM₁₀ levels during the study period was very gradual, with much of the decline appearing in the first few years (median values of ~33 µg/m³ in 1987 to ~25 µg/m³ in 1992, then down to ~23 µg/m³ in 2000). A flaw in the use of the time-series study design for this type of analysis is that it adjusts for long-term trends, and, therefore, does not estimate the change in mortality in response to the gradual change in PM₁₀. The apparent change, though weak, in the PM₁₀ risk estimates may also reflect a potential change in the composition of PM₁₀ (i.e., PM_{10-2.5} or PM_{2.5}). The study listed a number of PM₁₀-related air pollution control programs that were implemented between 1987 and 2000. Some of these programs, such as the Acid Rain Control Program, did result in major reductions in emissions, and, therefore, could have contributed to the results observed, but the analytic approach used in the study does not allow for a systematic analysis of the effect of air pollution policies on the risk of mortality.

Integrated Science Assessment for Particulate Matter

Includes Errata Sheet created on 2/10/2010

*U.S. EPA. Air Quality Criteria for Particulate Matter (Final Report, Dec 2009).
U.S. Environmental Protection Agency, Washington, DC, EPA 600/R-08/139F, 2009*

Available at: <https://cfpub.epa.gov/ncea/isa/recordisplay.cfm?deid=216546>



5. Interventions in the context of AQGs

Previous editions of the AQGs have mainly focussed on providing guidance in the form of pollutant-exposure specific recommendations, usually as ‘not to be exceeded’ concentration levels of air pollutants. Some informative text on application of guidelines in policy formulation, including risk management and implementation of the guidelines, has also been proposed; however this has largely been done without a systematic review of the underlying scientific evidence evaluating their effectiveness.

For the next update of the guidelines, it may be possible to formulate recommendations concerning specific measures or interventions shown to decrease the levels of air pollutants and improve health. These recommendations could be useful to countries, policy makers or other end-users of the guidelines on how to progress towards meeting the WHO goals. If and to what extent the available scientific evidence justifies including this particular topic as part of the updated AQGs was discussed during the third day of the expert meeting.

Jacob Burns from the University of Munich presented the study design and preliminary results of an ongoing Cochrane systematic review, conducted in collaboration with researchers from the Health Effects Institute (HEI), assessing the effectiveness of interventions in improving air quality (mostly PM_{2.5} and PM₁₀) and/or health effects. This review includes evidence from 47 studies in 18 countries across the world, categorized according to the source of PM as vehicular, industrial, residential or multiple sources; and assesses the effect of these interventions on both non-health (i.e. mainly changes in pollutant concentrations) and health outcomes (i.e. mortality, hospital admissions due to cardiovascular or respiratory events, emergency department admissions and pre-term birth weight). Modelling studies were not included in the review as the project did not have the scope to evaluate the quality of the models.



WHO Expert Consultation:
Available evidence for the future update
of the WHO Global Air Quality Guidelines
Page 25

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Has accountability been useful?

- For developing a research agenda?
- For providing evidence that is useful for evidence-based regulation?
- For benefitting public health?

Who Knew

That accountability could be so complicated?