

How evidence from epidemiological studies can be used to answer causality questions

The case of air pollution - cause or correlation?

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Air pollution epidemiology in risk assessment:

- Cause or correlation – evidence from epidemiological studies
- Evidence synthesis
- Getting the numbers right – how to get unbiased population-based health effect estimates





Summer
2023

„Air pollution is the **only**
man-made object you
can see from space with
the **naked eye**“

Joel Schwartz



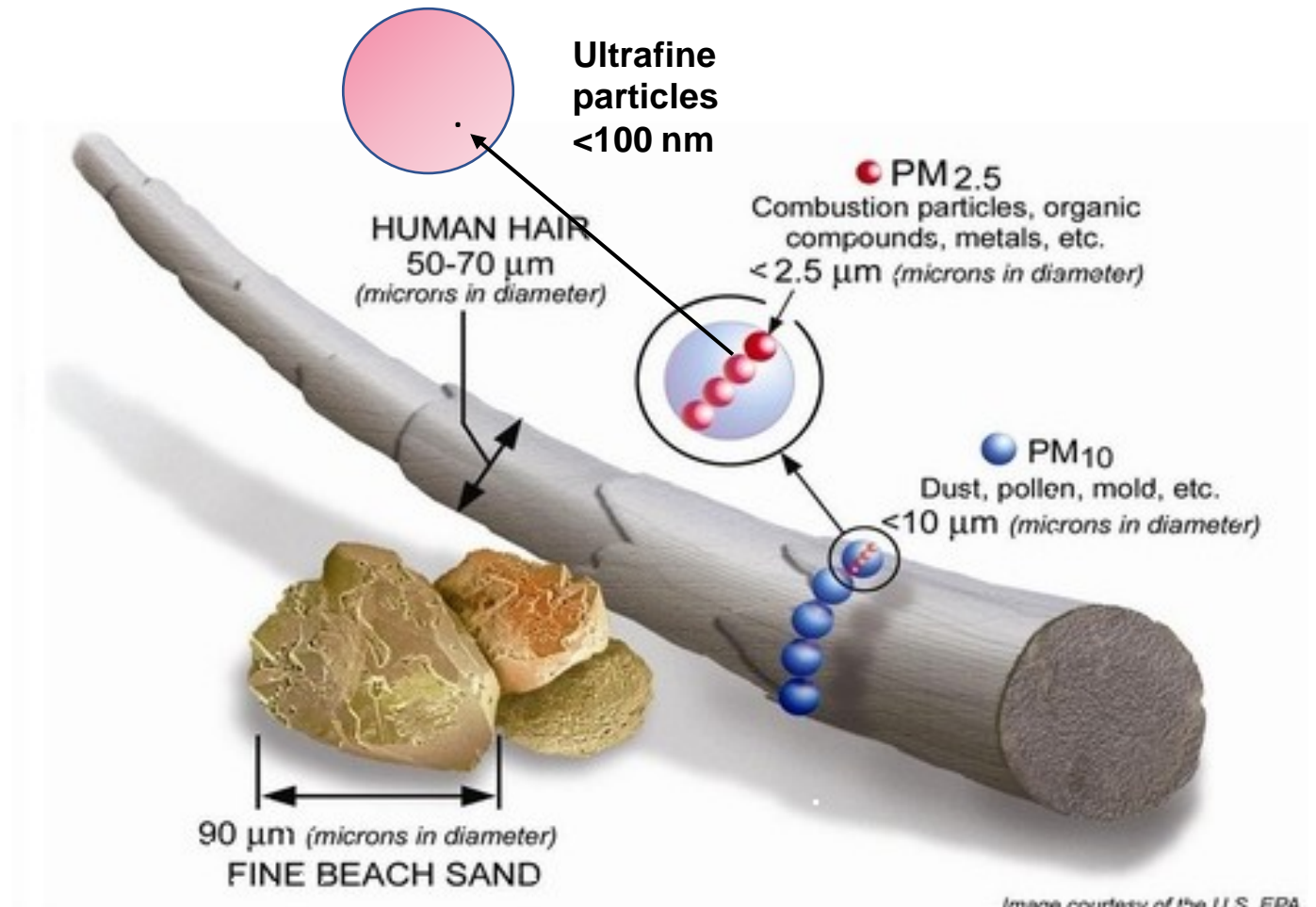
Air pollution: Mixture of gases and particles

Most important gases

Ozone, NO_2 , SO_2

Most important particles

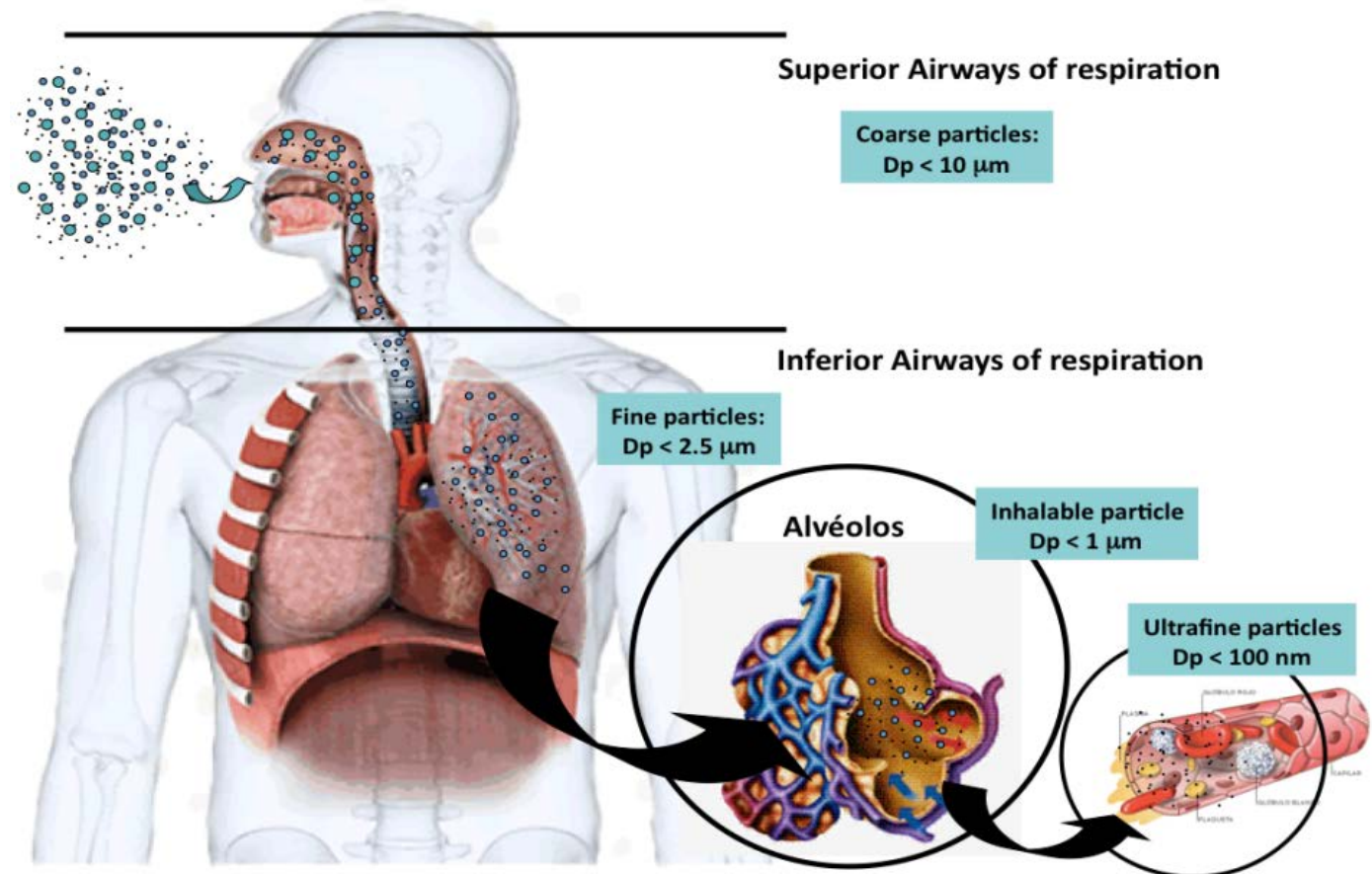
PM_{10} , $\text{PM}_{2.5}$, UFP



Biological Mechanisms



- Oxidative stress
- Inflammation
- Carcinogenic
- Activation of neural reflexes
- Transfer of inflammatory mediators, particles, and carcinogens through blood stream to far away organs



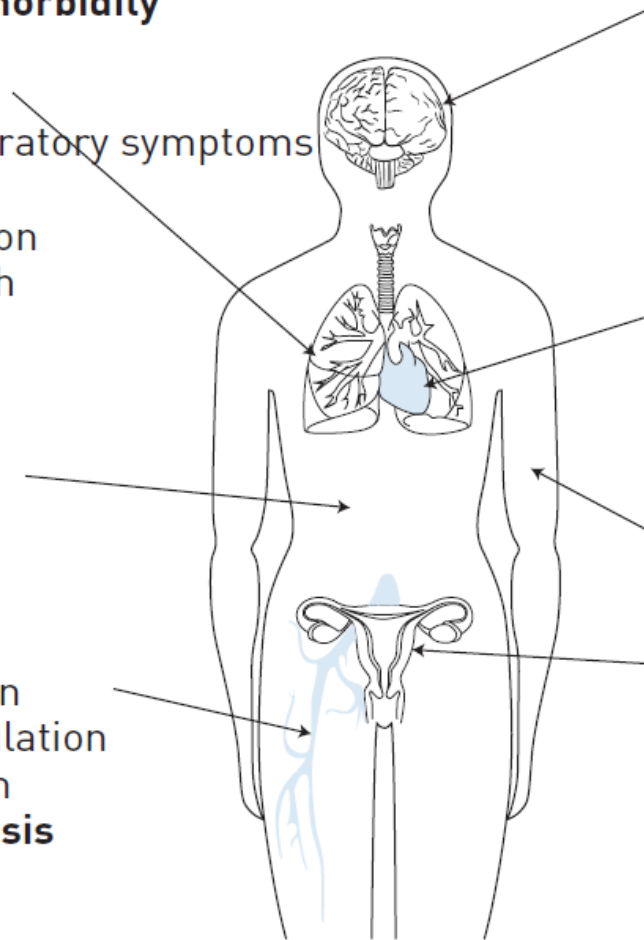
Multiple health effects on nearly every organ

Respiratory disease mortality
Respiratory disease morbidity
Lung cancer
Pneumonia

Upper and lower respiratory symptoms
Airway inflammation
Decreased lung function
Decreased lung growth

Insulin resistance
Type 2 diabetes
Type 1 diabetes
Bone metabolism

High blood pressure
Endothelial dysfunction
Increased blood coagulation
Systemic inflammation
Deep venous thrombosis



Stroke

Neurological development
Mental health

Neurodegenerative diseases

Cardiovascular disease mortality

Cardiovascular disease morbidity

Myocardial infarction

Arrhythmia

Congestive heart failure

Changes in heart rate variability
ST-segment depression

Skin ageing

Premature birth

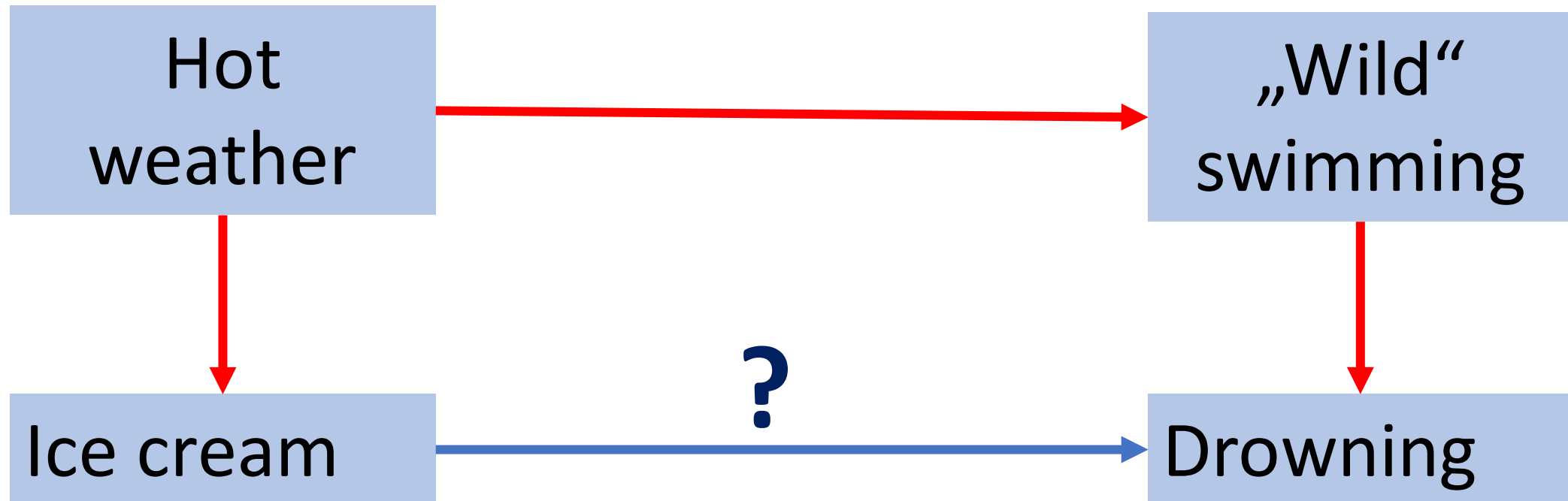
Decreased birthweight

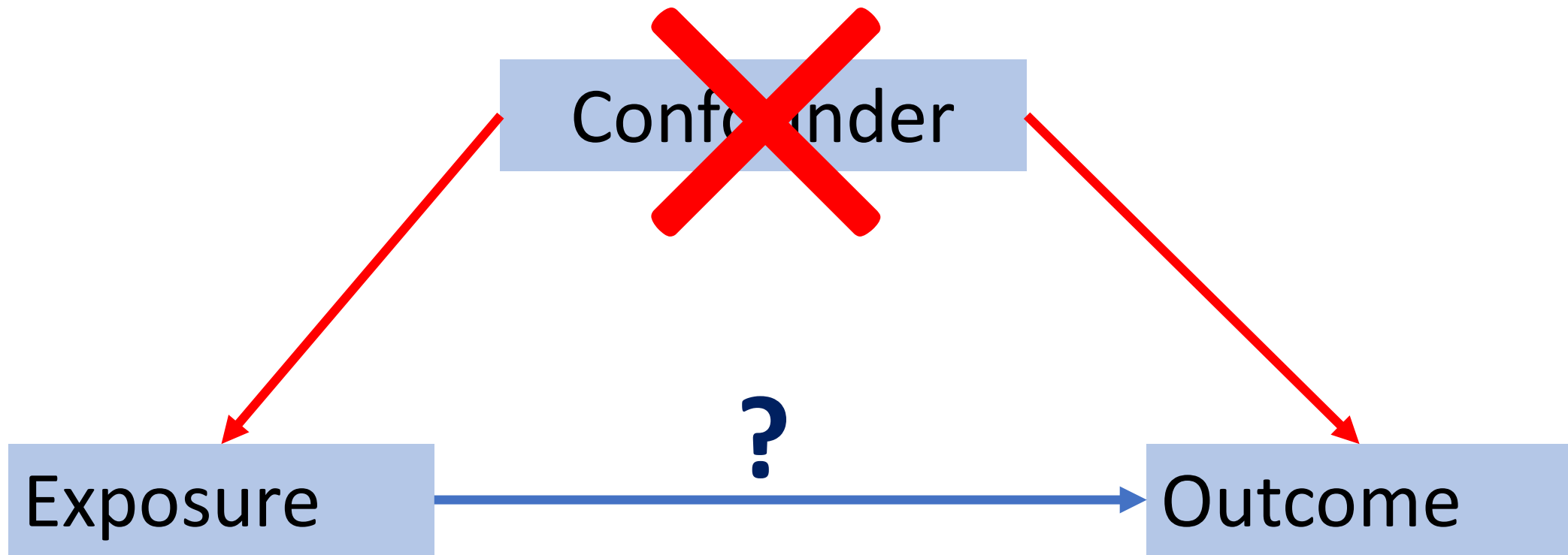
Decreased fetal growth
Intrauterine growth retardation
Decreased sperm quality
Pre-eclampsia

The famous ice cream, that is killing people



Directed Acyclic Graph (DAG)



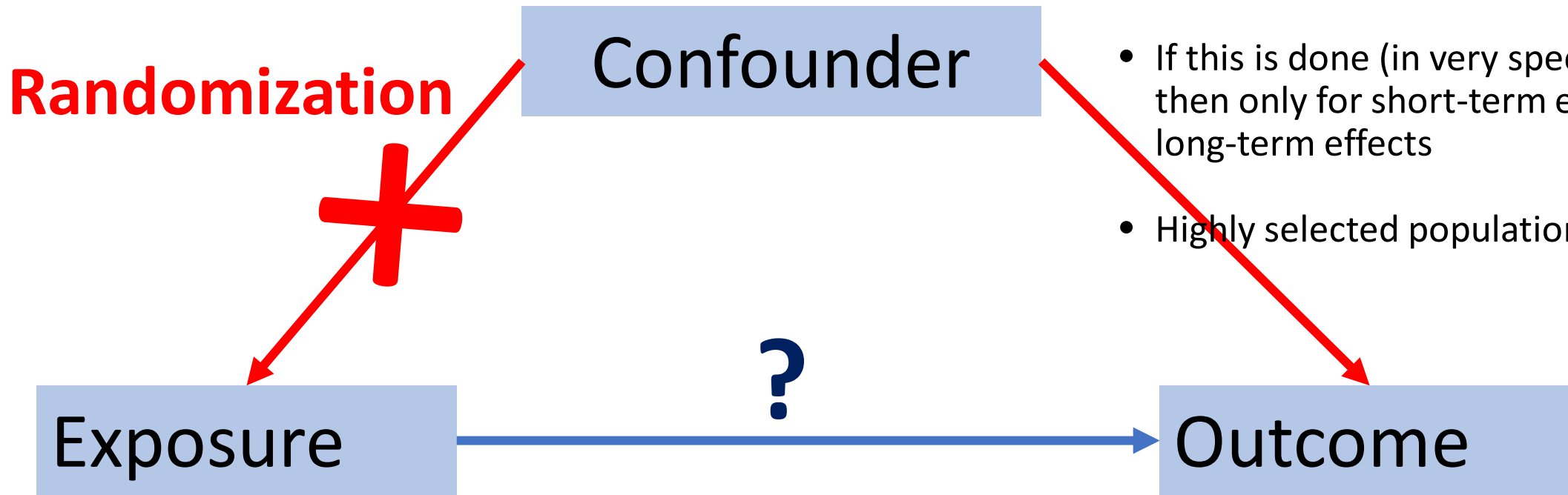


Why we like randomized studies

- Equal distribution of potential confounders in exposed and unexposed group

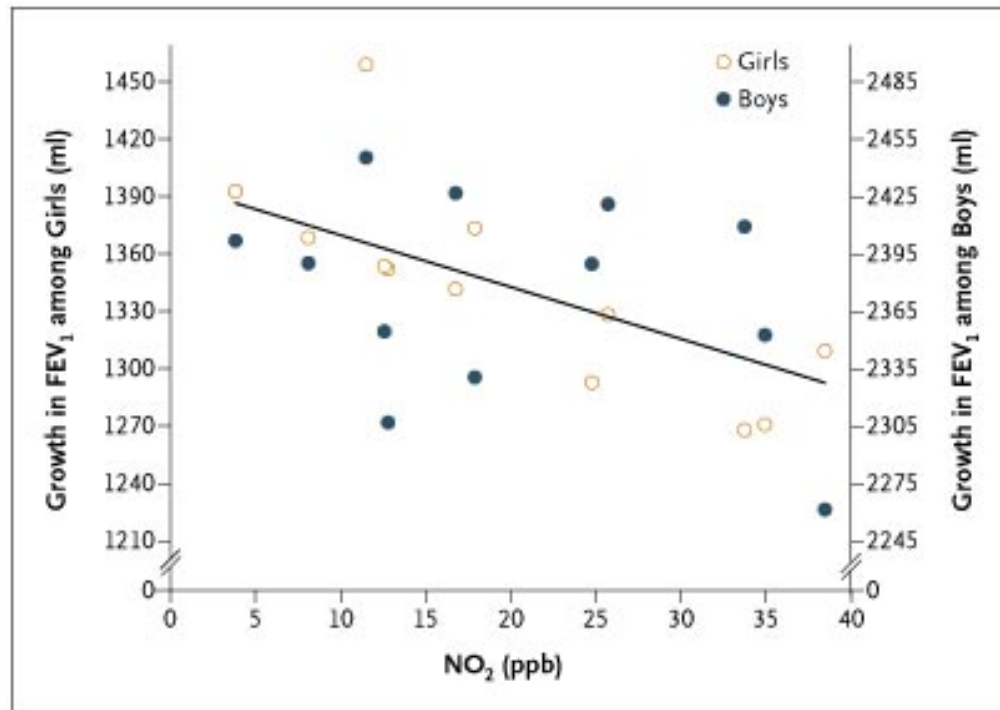
Why we do not like randomized studies

- In humans, we do not allow randomized assignment of potentially harmful exposures
- If this is done (in very specific cases), then only for short-term exposures, no long-term effects
- Highly selected populations



Get the best of two worlds → make epi studies conceptually like randomized studies without the disadvantages of randomization

Children's Health Study

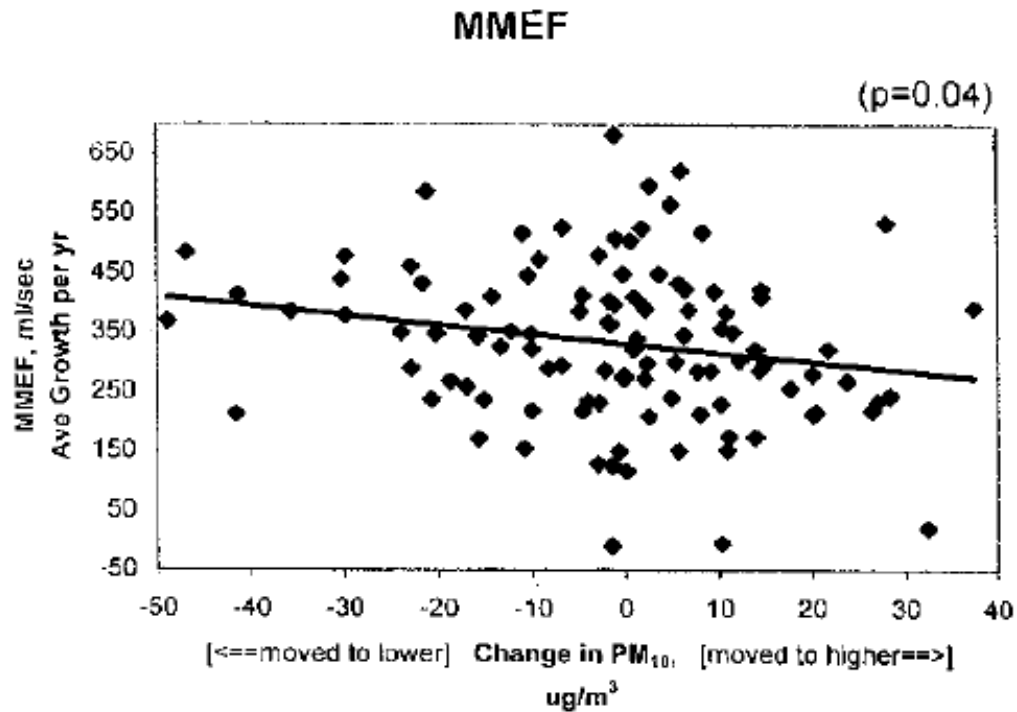


Gauderman et al. 2005



- Children relocating to other areas in the South-West
- Change in exposure purely related to parents' jobs, living circumstances, etc., but unlikely related to potential confounders like smoking
- -> Pseudorandomization

Children's Health Study



Avol et al. AJRCCM 2001



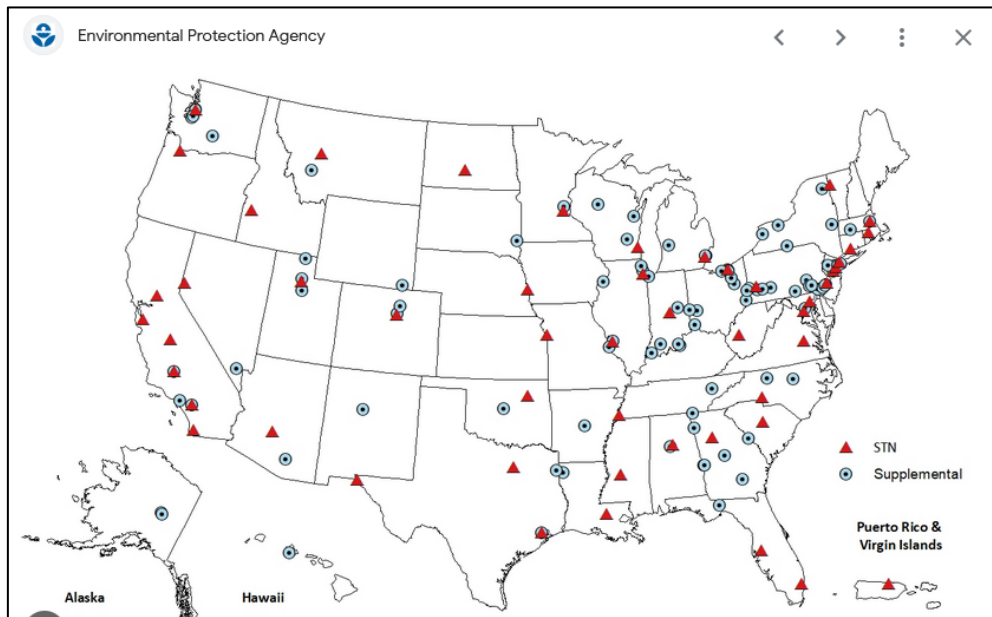
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Long-term exposure and mortality in the Medicare Cohort

20 Mill subjects, 6 Mill deaths, 2000 - 2010

Measured exposure in each city and averaged to annual city-specific means

Assignment of yearly city-wide exposure fluctuations to each enrollee



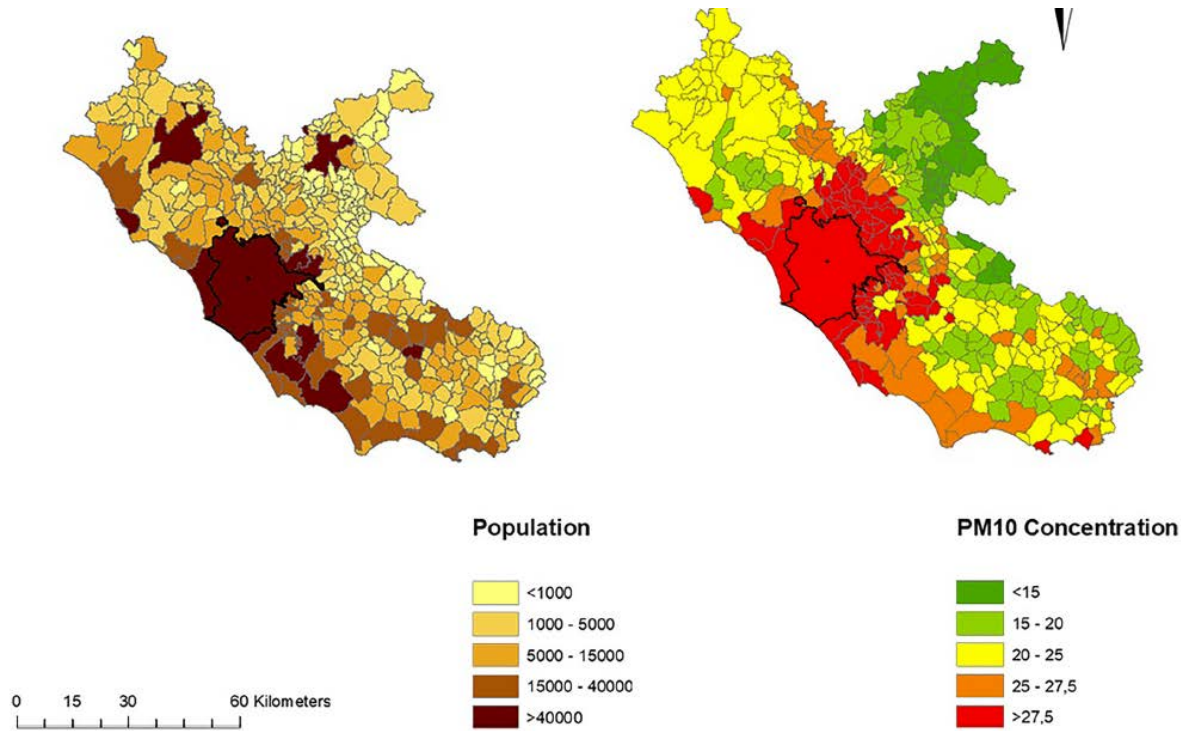
Differences between cities
Differences between participants
Differences between years

City-specific, city-wide
year-to-year fluctuation
in exposure

Mortality

Long-Term PM₁₀ Exposure and Cause-Specific Mortality in the Latium Region (Italy): A Difference-in-Differences Approach

Matteo Renzi,¹ Francesco Forastiere,^{2,3} Joel Schwartz,⁴ Marina Davoli,¹ Paola Michelozzi,¹ and Massimo Stafoggia^{1,5}



Modelled annual long-term exposure for each municipality

Annual counts of death for each municipality

Statistical analysis of fluctuations of exposure and fluctuations in outcome

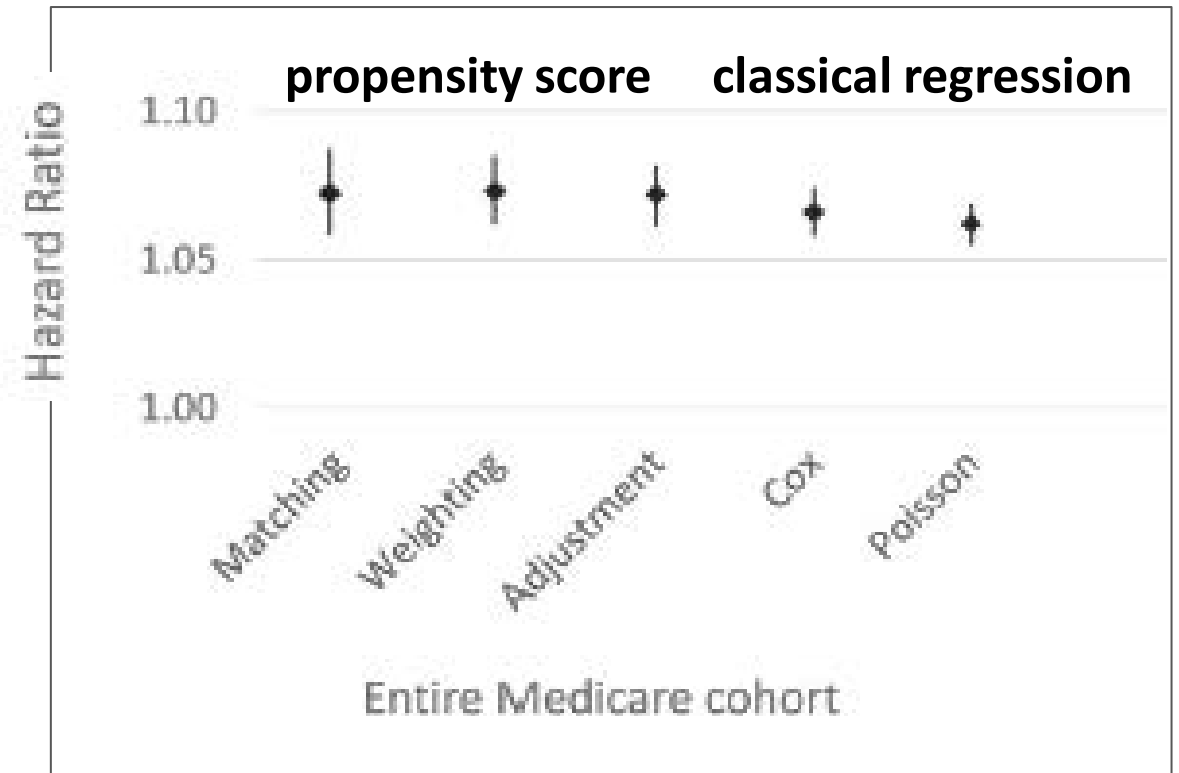
Only potential plausible confounder is temperature, which was controlled for

Results similar to other, more traditional approaches

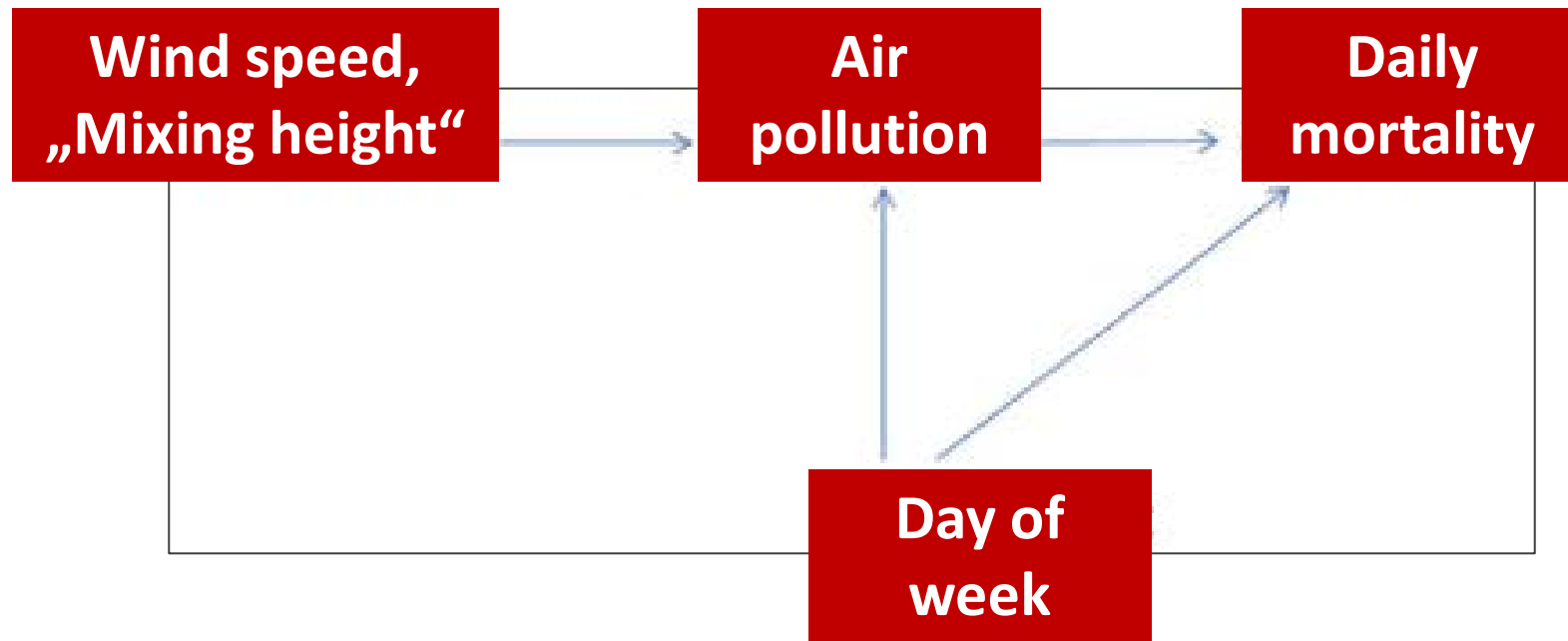
Other causal modeling approaches: Propensity score

Assessing Adverse Health Effects of Long-Term Exposure to Low Levels of Ambient Air Pollution: Implementation of Causal Inference Methods

Francesca Dominici, Antonella Zanobetti, Joel Schwartz, Danielle Braun, Ben Sabath, and Xiao Wu

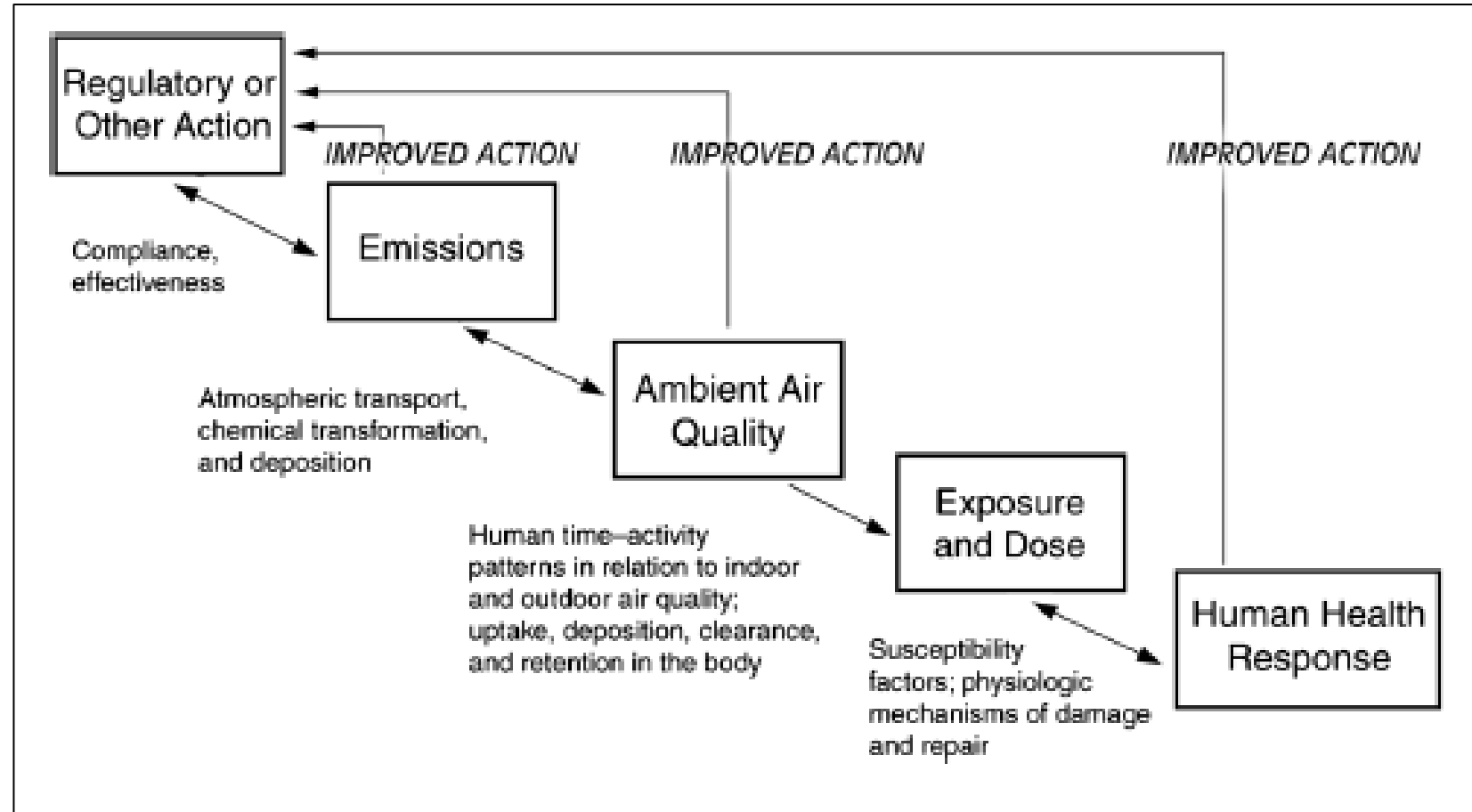


Instrumental variable



Accountability studies

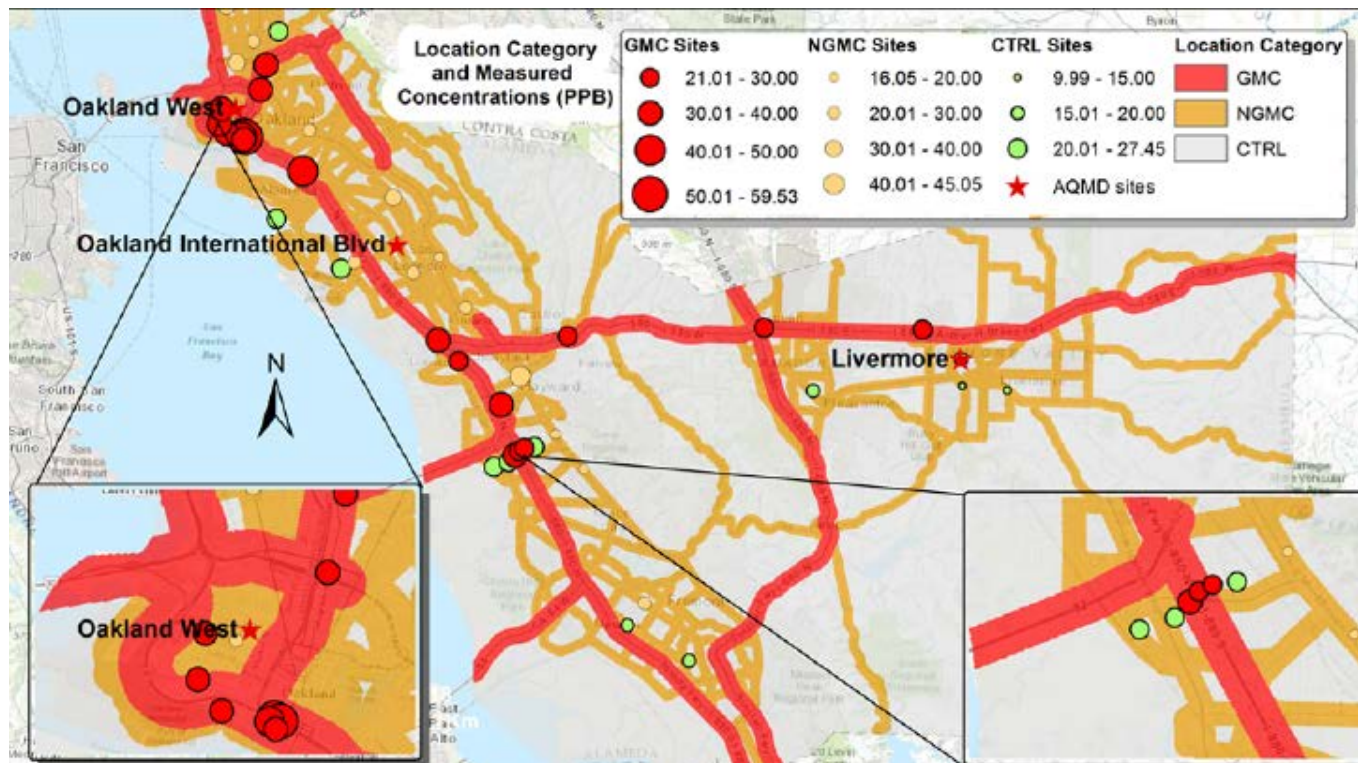
- Empirical studies assessing the effects of regulatory actions or natural experiments
- Examples:
 - Dublin coal sale ban
 - Fuel sulfur content restrictions in Hong Kong
 - Traffic bans during Beijing Olympic Games



California Ports and Goods Movement Plan 2006

State program on reduction of traffic-related emissions

- 3 study areas with different level of intervention
- 23,000 Medi-Cal beneficiaries with chronic disease
- Change in exposure after regulation coming into effect
- Change in incidence of ER visits – DiD analysis

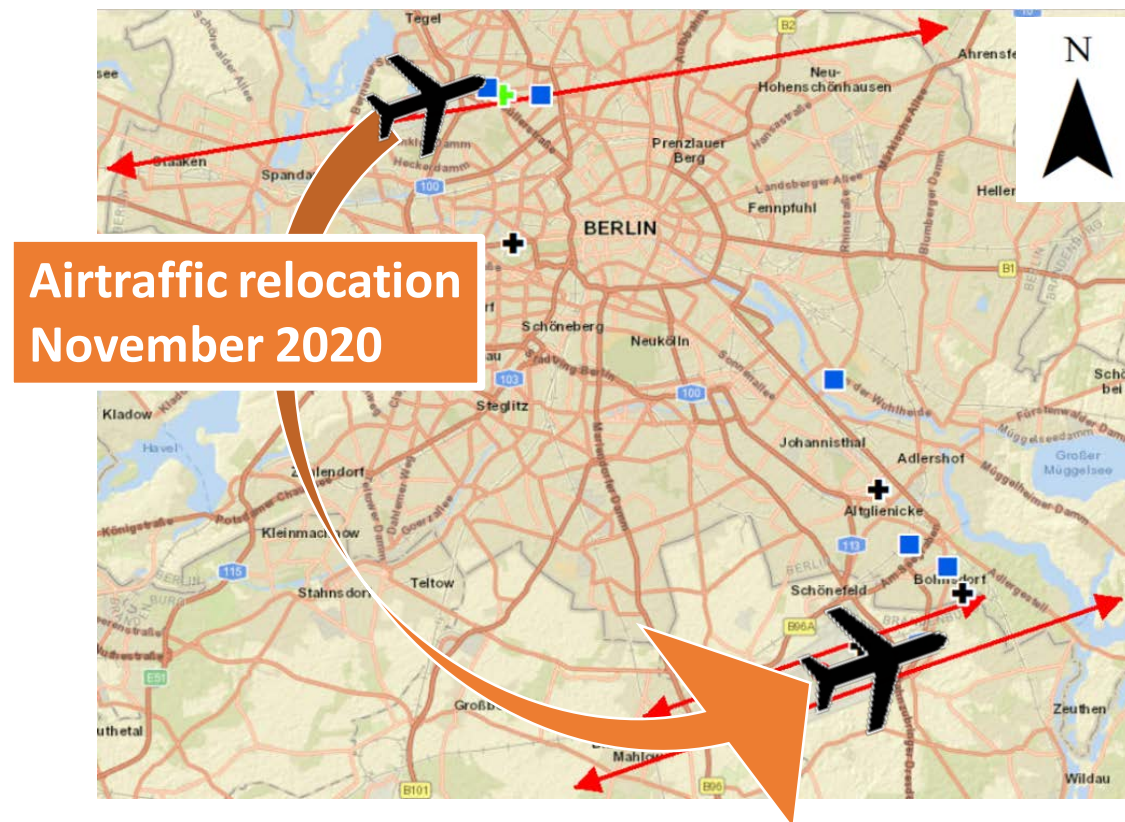


Largest exposure reductions of pollutant concentrations in GMC

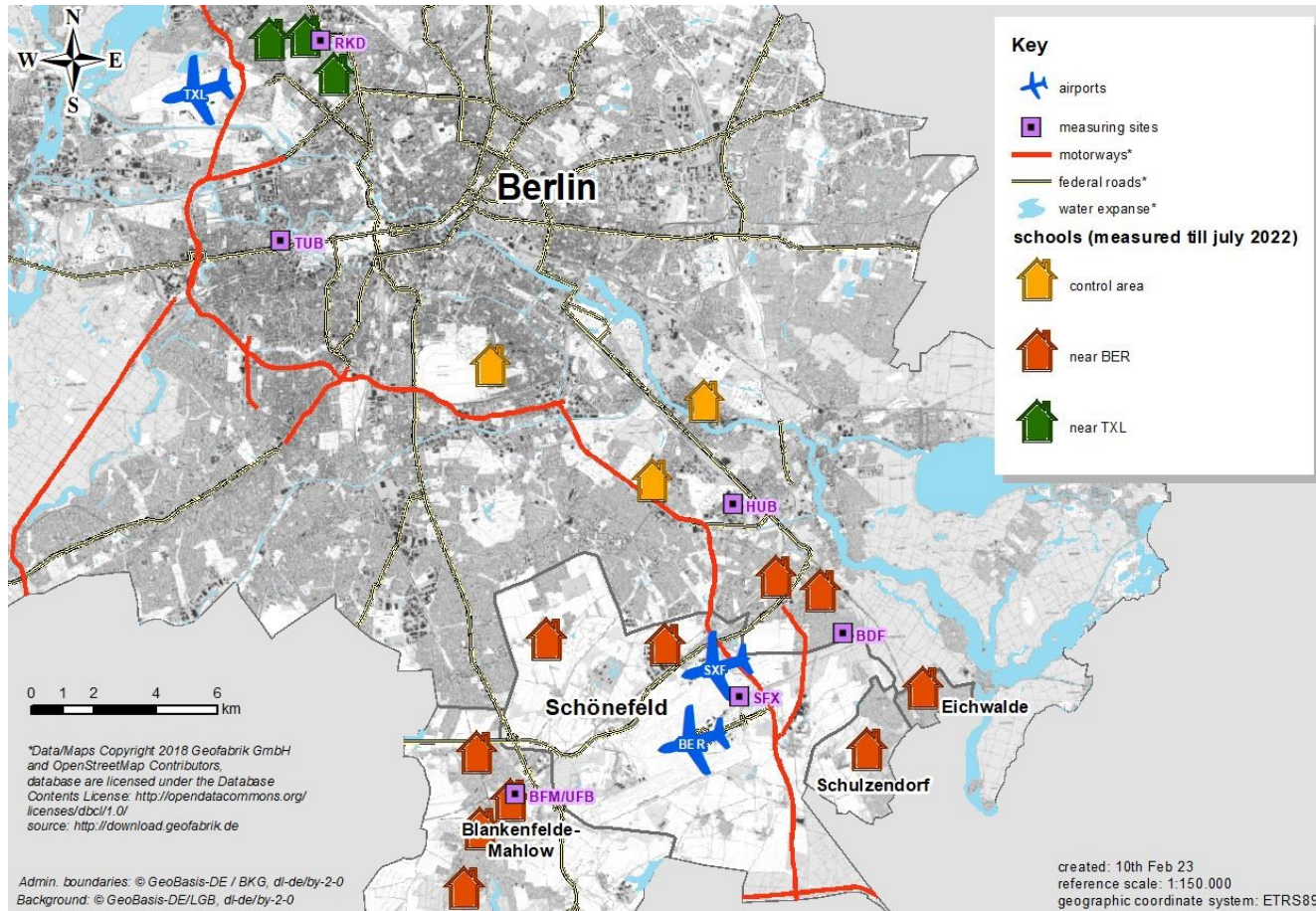
Largest reductions in incidence of ER visits among asthma and COPD patients in GMC

BEAR-Study – a natural cross-over experiment

Airtraffic relocation from Berlin Tegel (TLX) to Berlin-Brandenburg (BER) in 2020



BEAR: Study aims and methods



Aims

1. To assess daily and long-term exposure to airtraffic-associated UFP before and after relocation in 3 areas of Berlin
2. To investigate short- and long-term effects from airtraffic-associated UFP on lung and cognitive growth in children

Methods

Crossover study of 1000 elementary school children

In 3 areas of the city (TXL, BER, control)

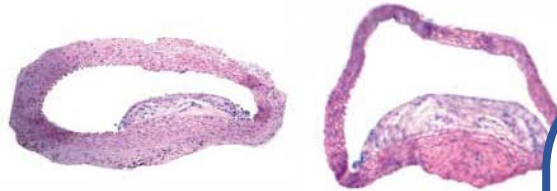
Repeated exams over follow-up of 4 years

Effect estimation using DiD analysis

Air pollution epidemiology in risk assessment:

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- **Evidence synthesis**
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Chain of evidence



filtered
AIR

concentrated
particles

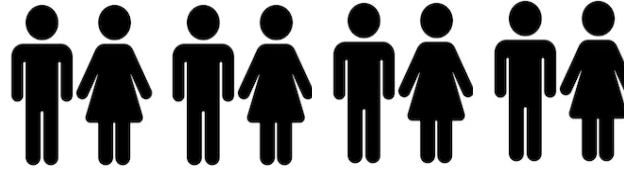
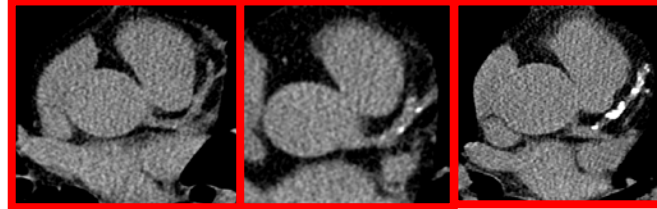
Cell and animal toxicology



Disease processes,
short-term exposures

controlled exposure studies,
epi panel studies

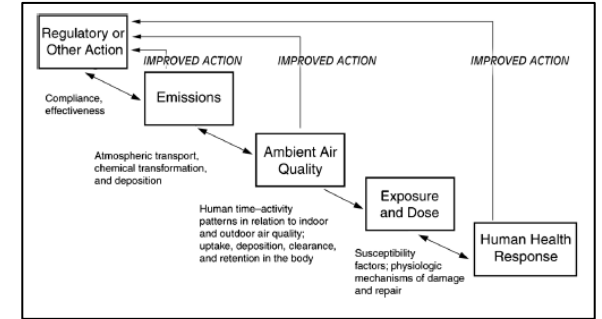
Classical cohort studies



Long-term exposure and
coronary atherosclerosis

cohort and case-control studies

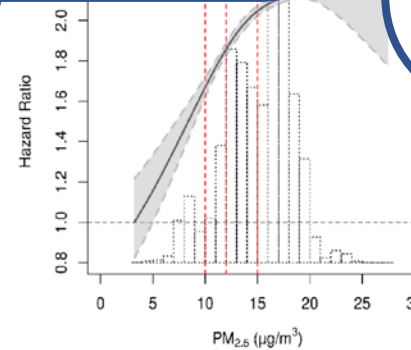
Accountability studies



Hospital admissions
after reduction of
exposure



Long-term exposure in
large cohorts



cohort and case-control studies

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Need for supporting policy making

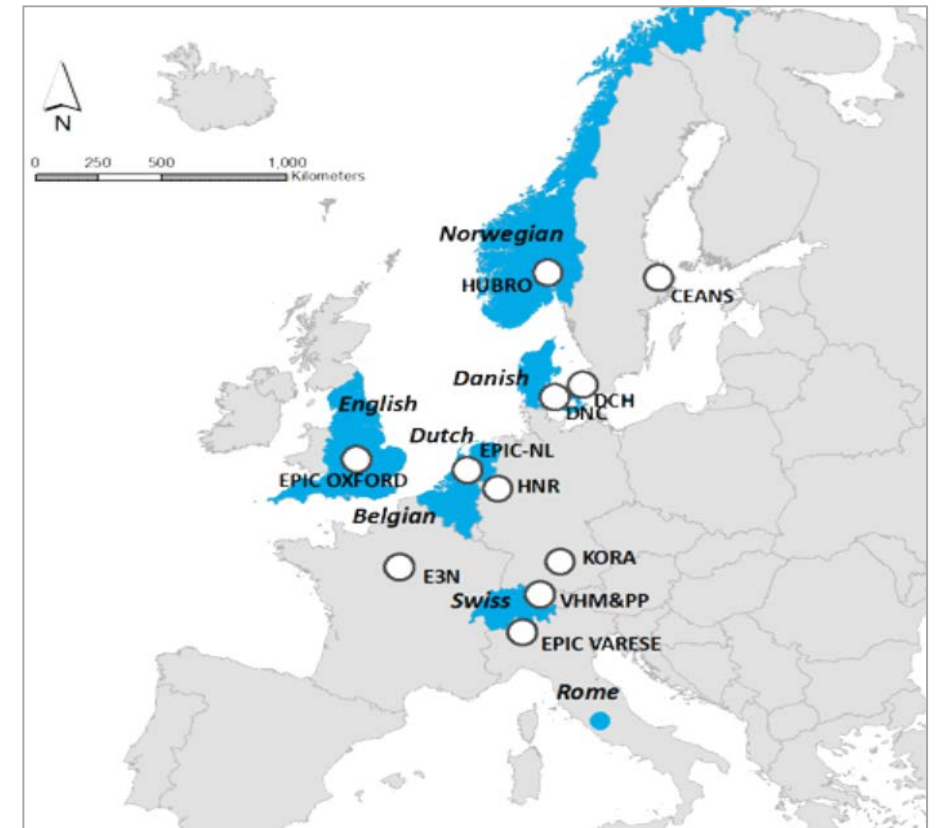
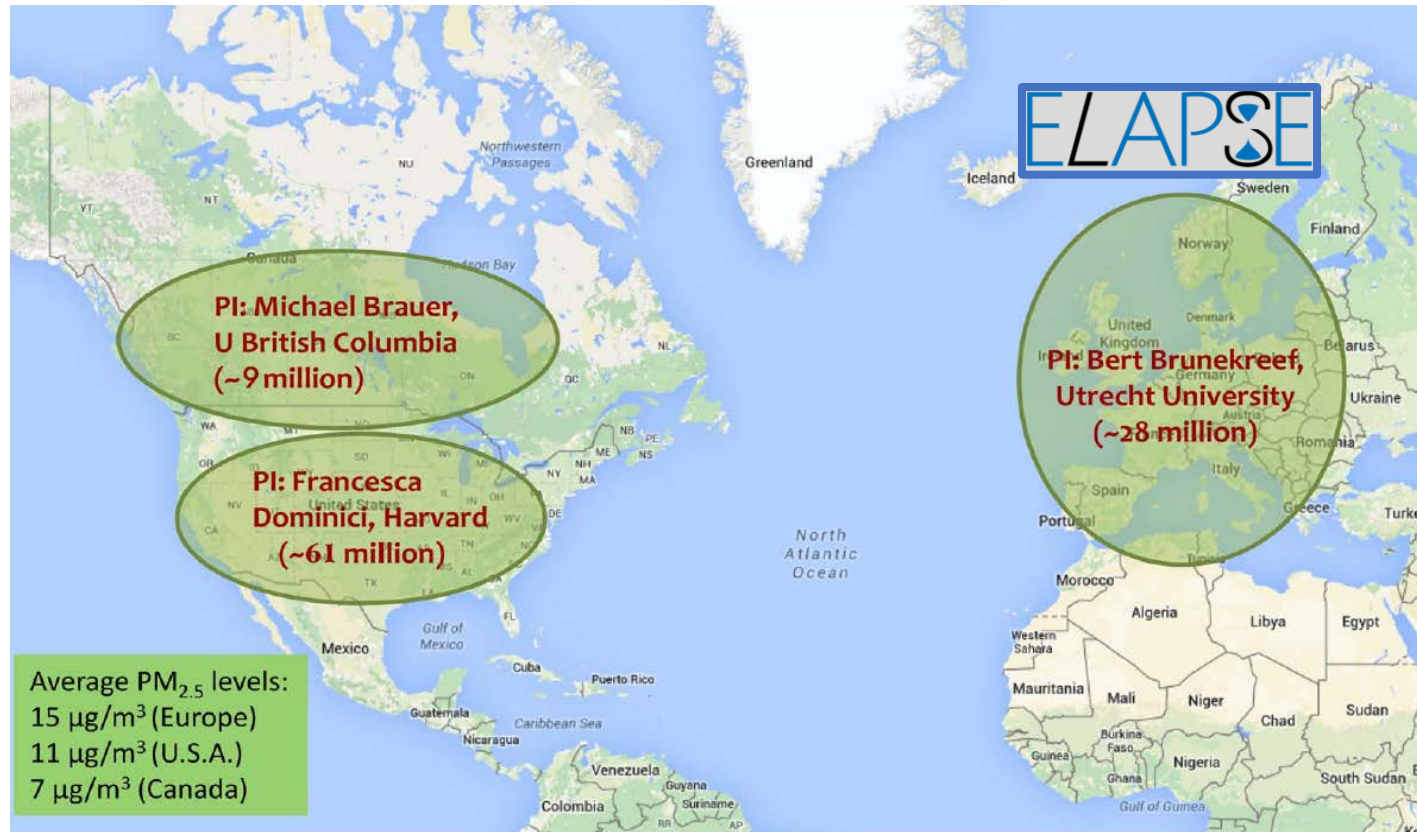


- Size of long-term effects in general population
- Burden of disease
- Cost-benefit analyses

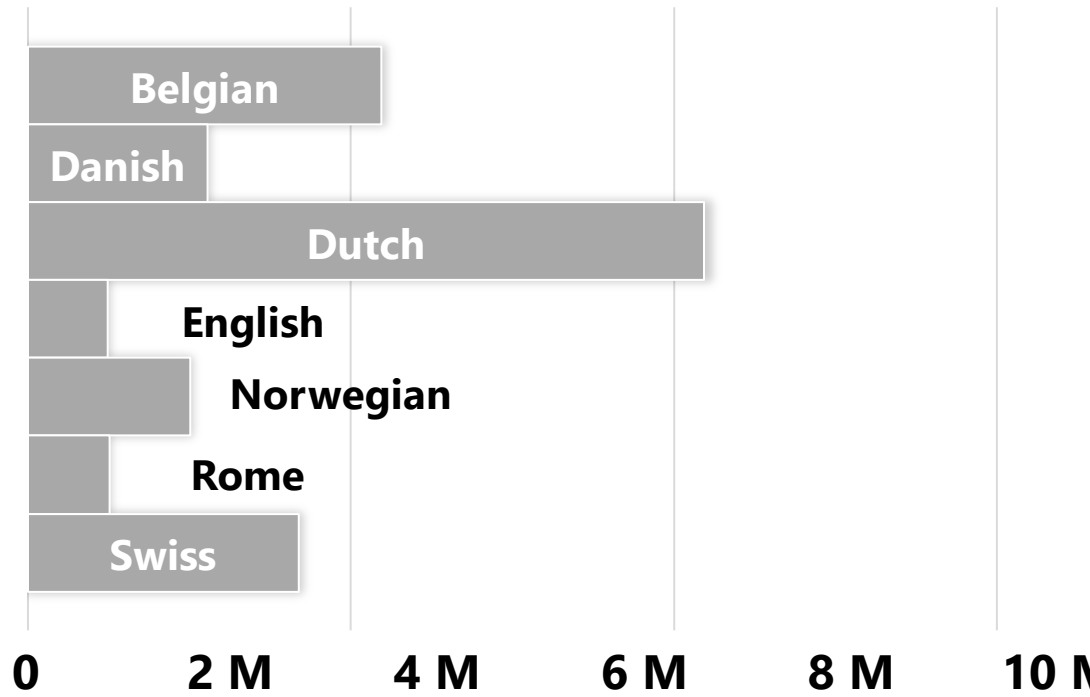
Proposal for a
DIRECTIVE OF THE EUROPEAN PARLIAMENT AND OF THE COUNCIL
on ambient air quality and cleaner air for Europe
(recast)

„Administrative cohorts“

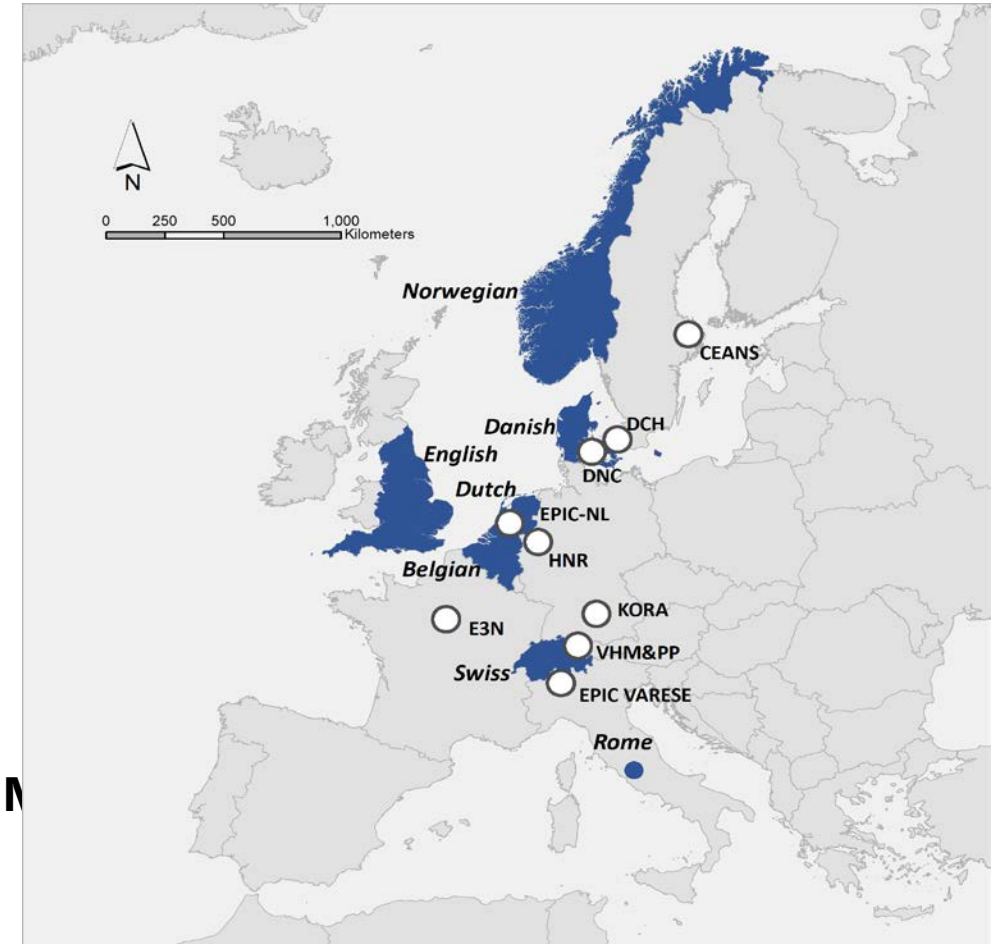
Effects of low levels of air pollution – a study in Europe

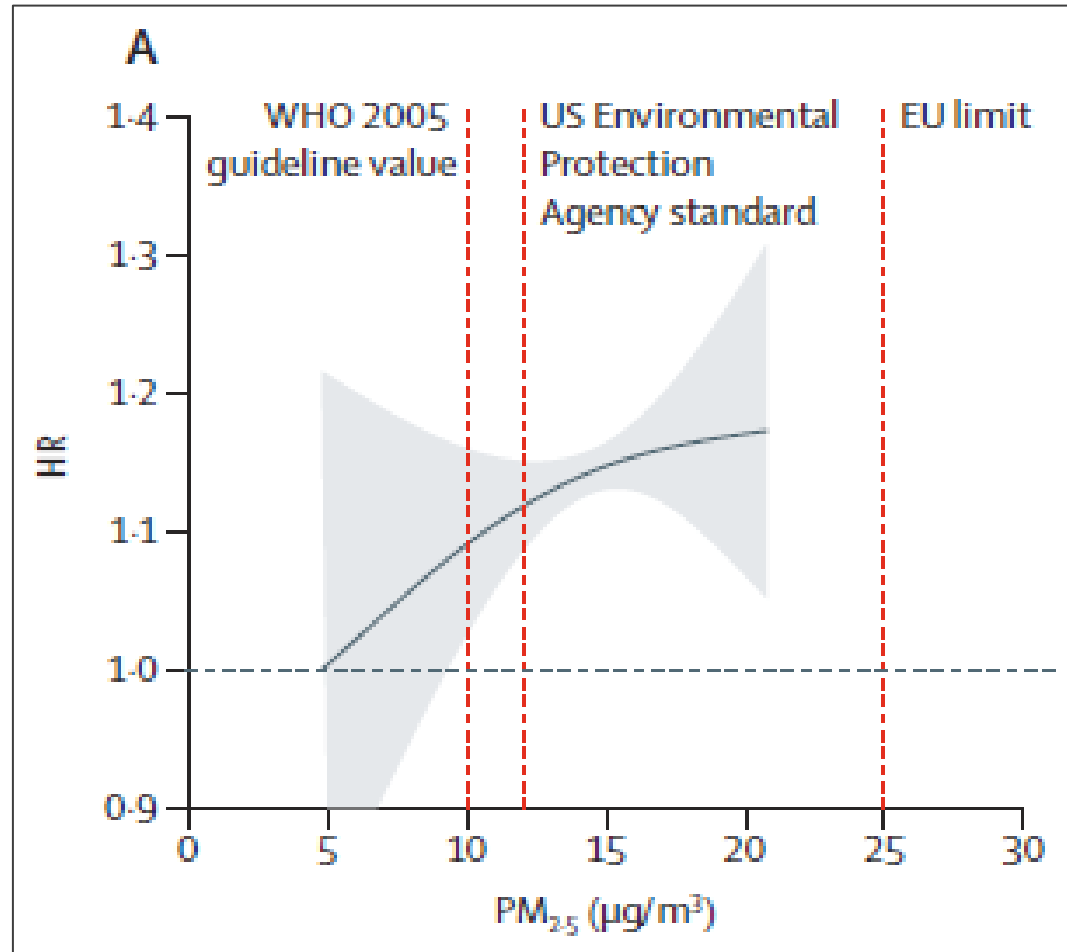


- From administrative data bases, e.g. population registers -> no selection bias
- Large numbers, vulnerable subgroups
- Exposure-response function
- Rich area-level confounder data
- Indirect adjustment



Brunekreef et al. 2021





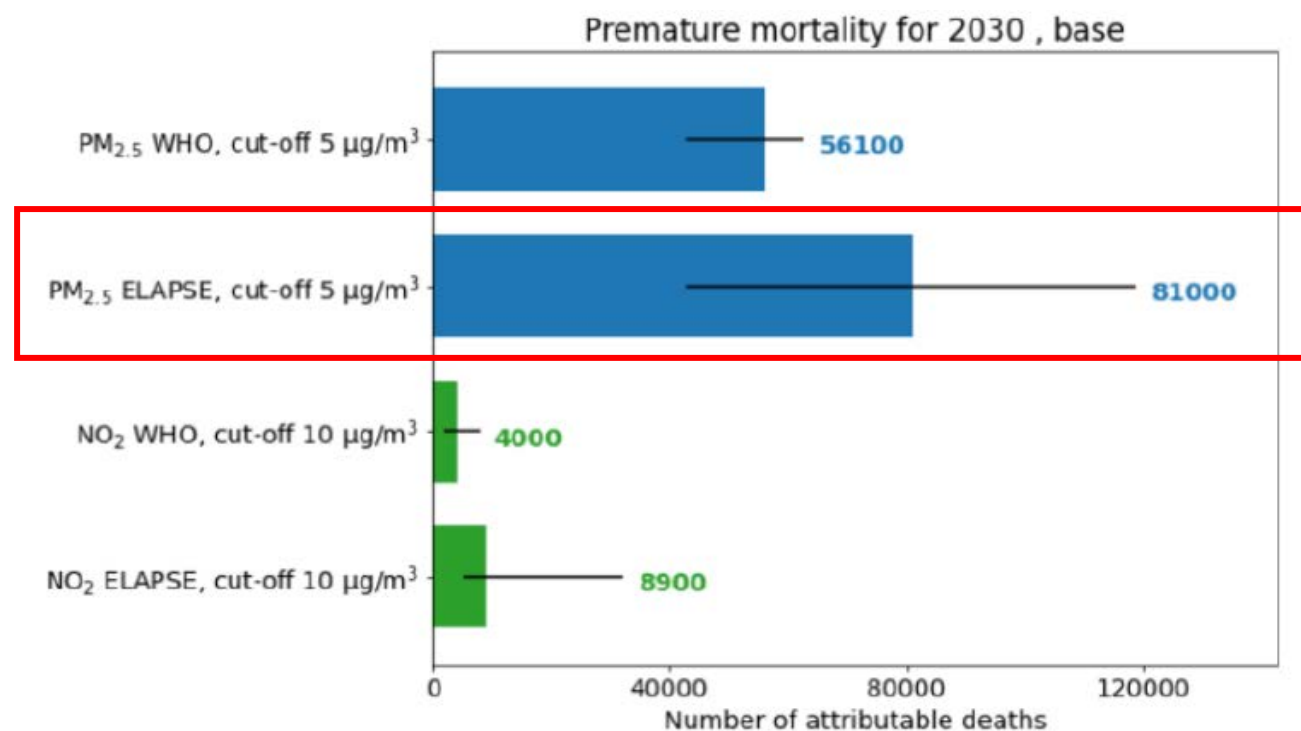
- Effect sizes higher than previously estimated
- Effects down to lowest observed levels
- No threshold
- Effect sizes considerably higher at lower end of exposure

EC Health Impact Assessment

Sensitivity analysis



Pollutant (per 10 µg/m ³)	WHO 2021	ELAPSE 2022
PM2.5	1.08	1.118
NO ₂	1.02	1.045



7 Reasons why epi is so important for risk assessment

1. Long-term studies on potentially hazardous exposures possible
2. Evidence in unselected population
3. Size of effect in general population
4. Identification of susceptible population groups
5. Evidence of effectiveness of interventions
6. Basis for calculation of burden of disease
7. This is basis for political decisions on priorities



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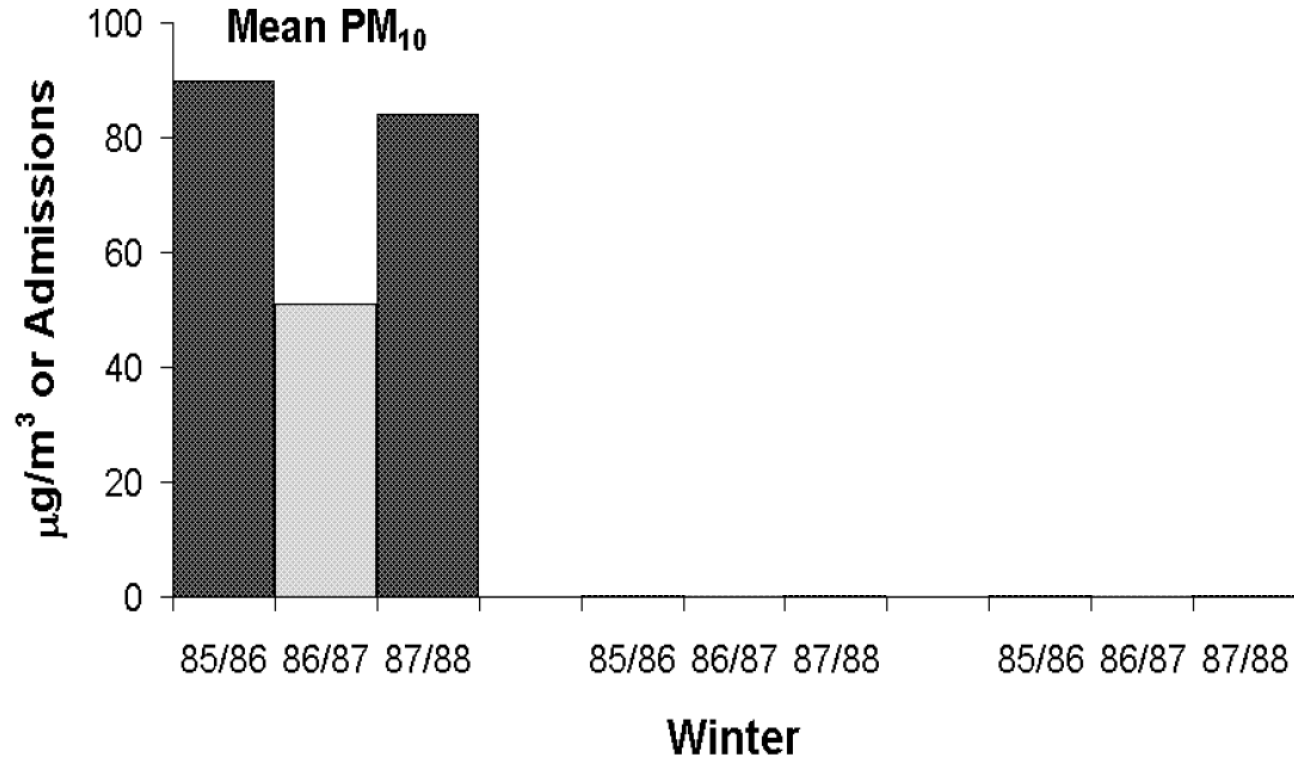
hhu Heinrich Heine
Universität
Düsseldorf

chs
centre for
health & society

Conclusions

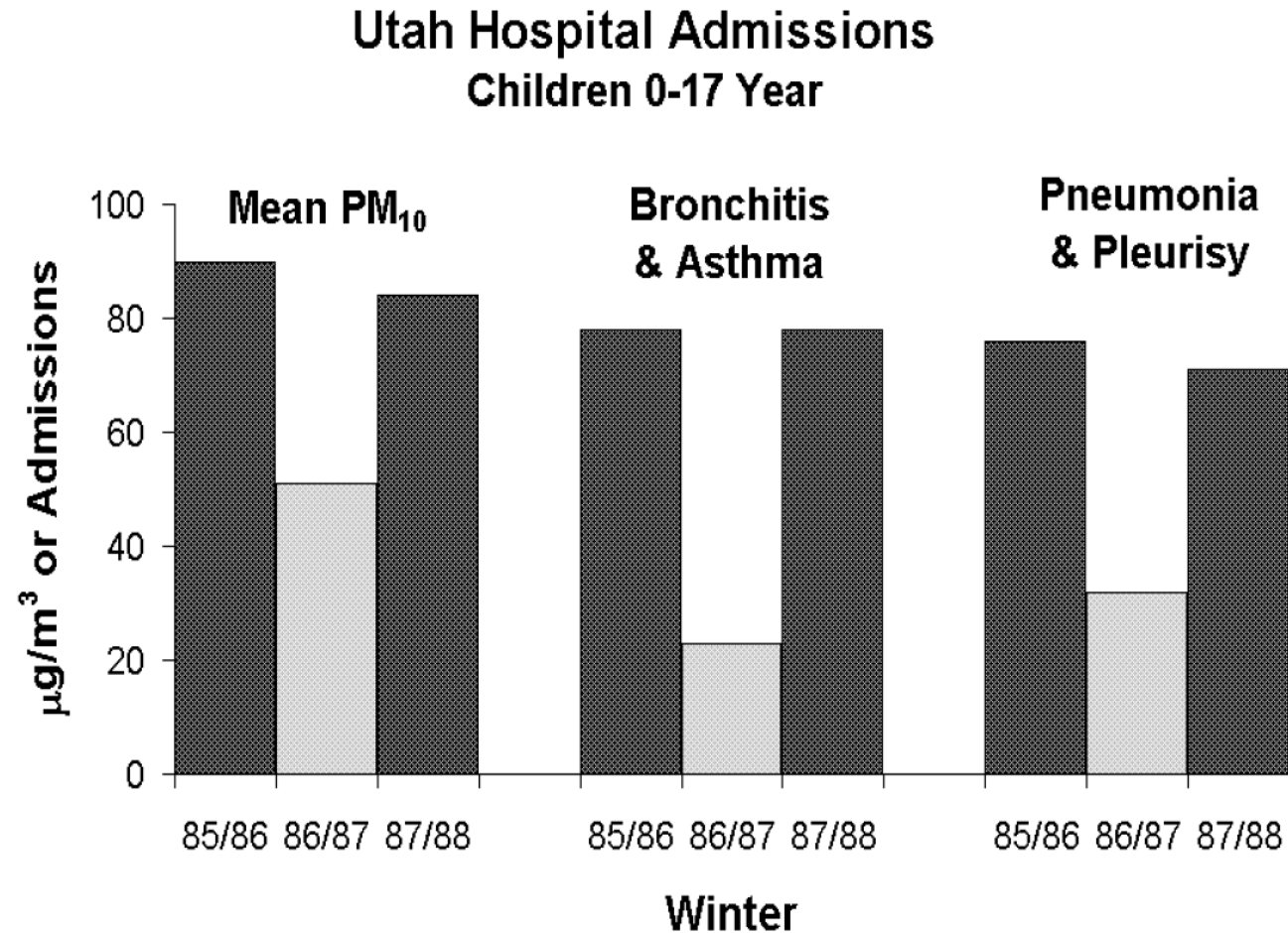
- Randomized controlled trials not always gold standard
- Selection bias can be avoided in administrative cohorts
- Chain of evidence is important „from cell to population“
- Epidemiological studies can inform about effect size in the general population and vulnerable subgroups
- Crucial function of epidemiological studies for informed policy decision making in policy

History: Utah valley steel mill strike



Pope, Amer J Public Health 1989; 79: 623

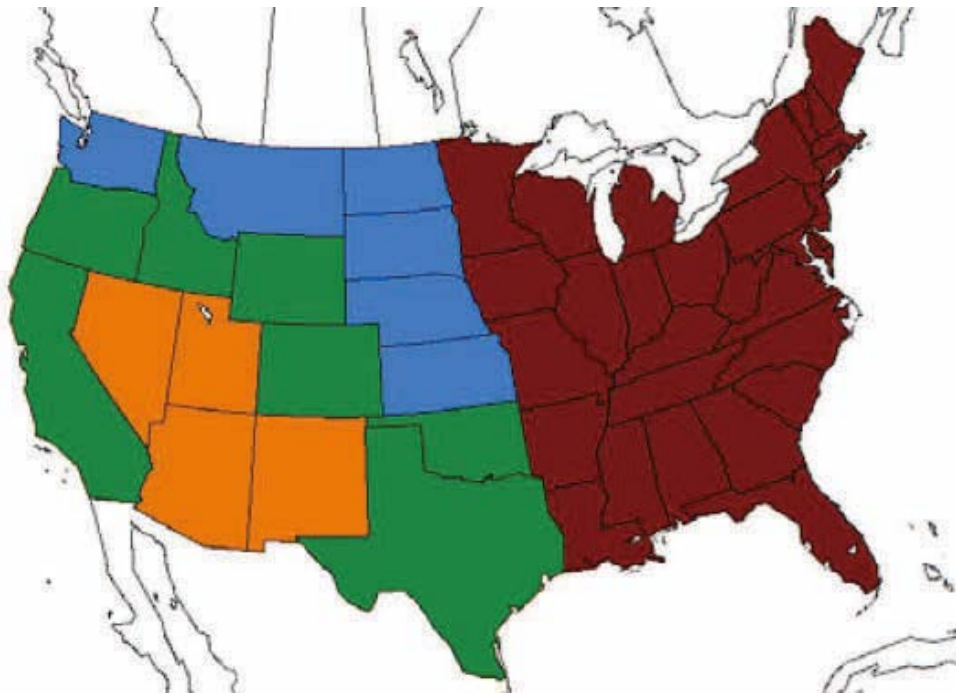
History: Utah valley steel mill strike



Pope, Amer J Public Health 1989; 79: 623

Copper smelter strike in the Southwest

Difference-in-Difference analysis in a natural experiment



- Strike: August 1967-March 1968
- 2.5 $\mu\text{g}/\text{m}^3$ decrease in sulfate particles
- Difference in mortality in strike area
- Difference in mortality in surrounding states not affected by strike, but underlying the same regional influences (weather, influenza, etc.)
- **Result: 2.5% decrease in mortality**