

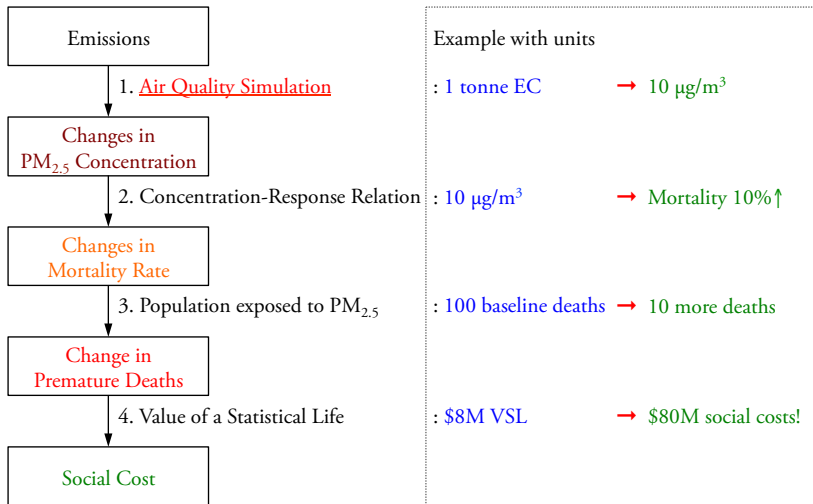
# EASIUR Tutorial v0.3

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# The Social Cost of Air Quality



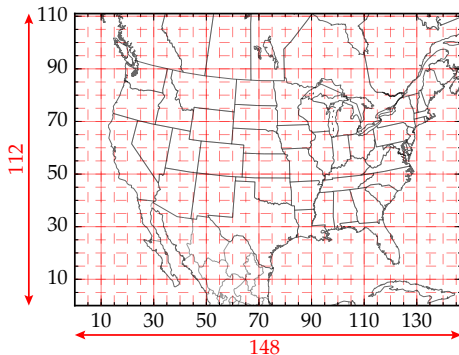
# EASIUR Model

(Estimating Air pollution Social Impact Using Regression)

- EASUR estimates **marginal damages** [\$/t] of emissions in the United States
- Species: currently **four species**
  - **EC**: direct or “primary”  $PM_{2.5}$
  - **$SO_2$ ,  $NO_x$ , and  $NH_3$** : precursors to “secondary”  $PM_{2.5}$
  - Volatile organic compounds (VOCs): important missing species
- Time resolution: **four seasons**
- Spatial resolution:  **$148 \times 112$  grid** (one cell =  **$36 \text{ km} \times 36 \text{ km}$** )
- Three stack heights: Ground-level area emissions, Point emissions at 150 m, and Point emissions at 300 m
- Where to get? <<http://barney.ce.cmu.edu/~jinhyok/easiur/>>

# How to use EASIUR

- User interface: **spatial lookup tables**
  - CSV (Comma-separated value) file
  - Shapefile for GIS software
  - Other format? (Need county-based?)
- A  $148 \times 112$  array per species per season (16 arrays in total)



# How to use EASIUR

- CSV (Comma-separated value) file
  - Filename format: (species)\_(season)\_(height).csv
  - species: PEC (Primary PM<sub>2.5</sub>), SO<sub>2</sub> (Sulfur dioxide), NO<sub>X</sub> (Nitrogen oxides), NH<sub>3</sub> (Ammonia)
  - season: Winter (Jan-Mar), Spring (Apr-Jun), Summer (Jul-Sep), Fall (Oct-Dec), Annual (Average of four seasons)
  - height: area (ground-level), point150 (150 m stack height), point300 (300 m stack height)
  - Unit: USD per metric ton (\$/t)

# How to use EASIUR

- Shapefile for GIS software
  - Look at Attribute table.
  - Field name format: (species)(season)(height)
  - species: PEC: Primary PM<sub>2.5</sub>, SO2: Sulfur dioxide, NOX: Nitrogen oxides, NH3: Ammonia
  - season: Wi (Jan-Mar), Spr (Apr-Jun), Su (Jul-Sep), Fa (Oct-Dec), An (Average of four seasons)
  - height: A (ground-level), M (150 m stack height), H (300 m stack height)
  - (Field names are shortened because shapefile allows only up to 10 characters for field name.)
  
- Caveats:
  - EASIUR grid index starts with (1, 1), not (0, 0).
  - EASIUR uses metric ton, not short ton.

## Example: 3 tonne of SO<sub>2</sub> emitted in Pittsburgh in Winter?

- 1 Convert Pittsburgh (Lat, Lon) to EASIUR grid coordinate (x, y)  
⇒  $(-80.00^\circ, 40.44^\circ) = (116.62, 63.49) \simeq (117, 63)$   
⇒ A bit complicated, see the next slide.
- 2 Find (117, 63) in Winter SO<sub>2</sub> array (EASIUR<sub>SO<sub>2</sub></sub><sup>Winter</sup>)  
⇒  $\text{EASIUR}_{\text{SO}_2}^{\text{Winter}} [117, 63] = \$240,000 / \text{t SO}_2$
- 3 Multiply 3 t SO<sub>2</sub>  
⇒  $\text{Social Cost} = \$240,000 / \text{t SO}_2 \times 3 \text{ t SO}_2 = \$720,000$

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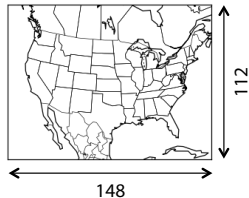
# Converting (latitude, longitude) to EASIUR grid



(a) Emissions information on an ellipsoid (NAD83)



(b) Earth as a spheroid



(c) EASIUR grid in Lambert conformal conic projection



Step 1:  
Ellipsoid to Spheroid



Step 2:  
Spheroid to Lambert conformal conic

- EASIUR website provides conversion tools:

⇒ <http://barney.ce.cmu.edu/~jinhyok/easiur/>

## Three major sources of uncertainties

- Air quality simulation:
  - EASIUR provides 95% prediction intervals (about a factor of two or three)
- Concentration-Response relation
- Value of a Statistical Life

# Uncertainty: Concentration-Response relation (1)

- Epidemiological studies on  $PM_{2.5}$  mortality provide 95% confidence intervals of relative risk ( $RR \equiv \frac{\text{increased mortality rate}}{10 \mu\text{g } PM_{2.5}/\text{m}^3}$ )
  - Log-linear relation: Mortality  $\propto \ln(RR)$
- Two landmark cohort studies:
  - American Cancer Society study (Krewski et al, 2009):
    - ⇒ Bigger sample (or cohort), not random
    - ⇒  $RR = 1.06$  (1.04-1.08)
  - Harvard Six Cities study (Lepeule et al, 2012):
    - ⇒ Smaller sample in eastern U.S., but random
    - ⇒  $RR = 1.14$  (1.07-1.22)

## Uncertainty: Concentration-Response relation (2)

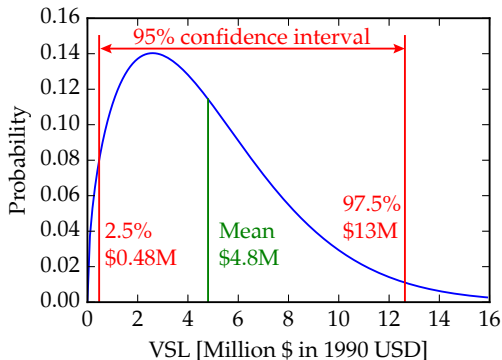
- EASIUR default relative risk: **1.06**
  - Adjustment factor ( $F_{RR}$ ) for other  $RR$ :

$$F_{RR} = -15.1 + 15.2 \cdot RR \quad (1)$$

- e.g. for  $RR = 1.08$ ,  $F_{RR} = -15.1 + 15.2 \times 1.08 = 1.3$ .  
Multiply 1.3 to default EASIUR estimate.
- Uncertainty analysis
  - Simple: Use Eq. 1 to calculate 95% confidence interval.
  - Monte Carlo: Look at Appendix C: Deriving Health Impact Functions in BenMAP User's Manual.

# Uncertainty: Value of a Statistical Life (1)

- U.S. EPA's official VSL: \$4.8M in 1990 USD and 1990 income level (= \$6.3M in 2000 USD = \$8.0M in 2010 USD)
- a mean of a Weibull distribution (scale=5.32, shape=1.51) based on 26 value-of-life studies



## Uncertainty: Value of a Statistical Life (2)

- EASIUR's default VSL: **\$8.8M** in **2010 USD** and **2010 income**
- need to adjust for **dollar year** and for **income growth**.
  - A table of U.S. EPA's adjustment factors is provided.
- Uncertainty analysis
  - Simple: Use 95% confidence interval of the Weibull distribution  
⇒ [\$0.46M, \$13M] in 1990 USD  
⇒ Adjust for your dollar year and income year
  - Monte Carlo: Use the Weibull distribution directly.

# Thanks! Any question?

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