

# **On the usefulness of air-quality models in epidemiological health studies**

**Myrto Valari<sup>1</sup>, Laurent Menut<sup>2</sup>  
and Edouard Chatignoux<sup>3</sup>**

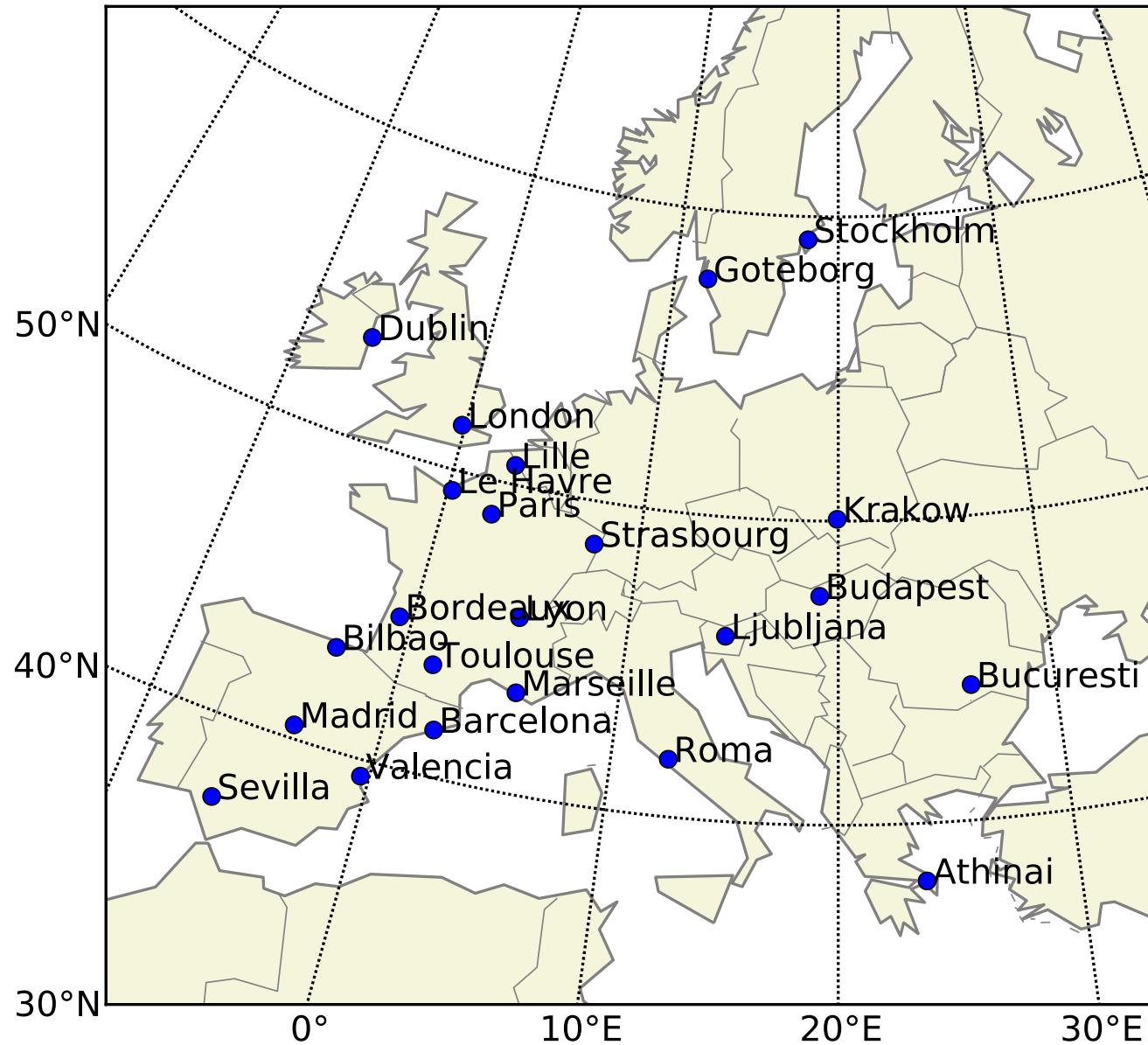
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<sup>2</sup>Labortoire de Météorologie Dynamique / IPSL

<sup>3</sup>Observatoire Régional de Santé Île-de-France

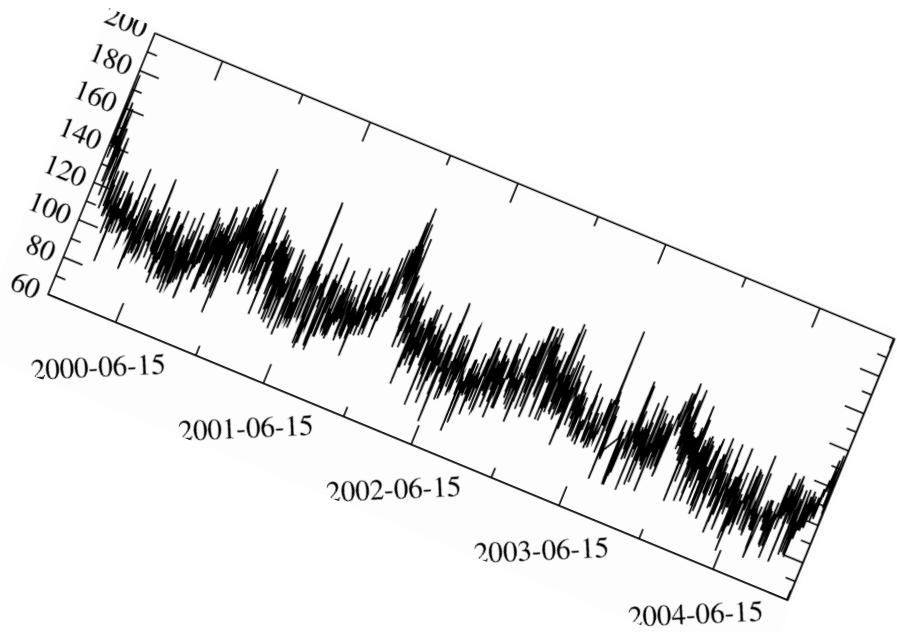
# **APHEIS** network: multi-year, multi-city project on short-term health effects of air-pollution

26 European cities in 12 countries



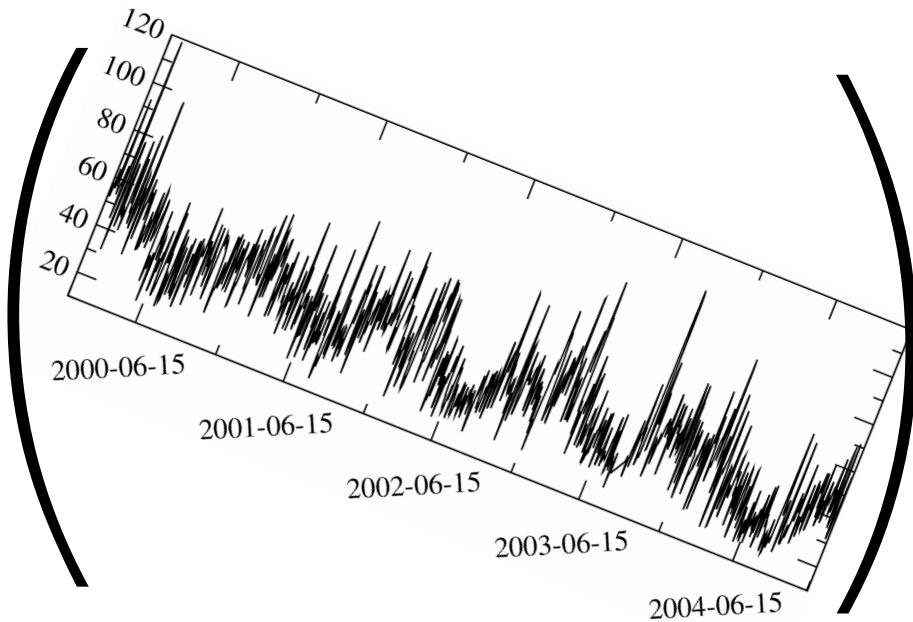
# Time series epidemiological model (GAM)

$$\log \mu_t = \beta_0 + \phi(U_{t-n}) + \alpha Z_{t-m}^T + \boxed{\beta} X_{t-l}$$



= linear  $f$

**daily mortality counts**



**day averaged pollutant levels**

# $\text{NO}_2, \text{O}_3, \text{PM}_{2.5}$

## vs.mortality

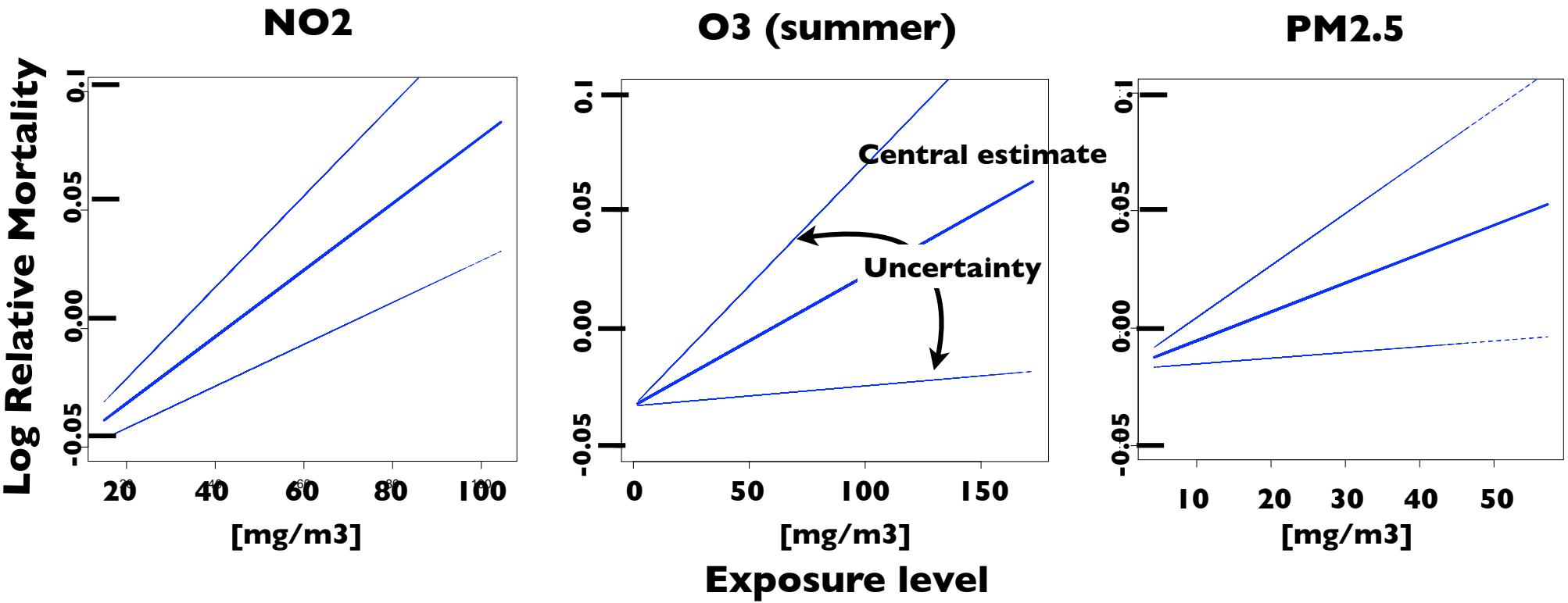
Paris, 2000-2005



# Results of the **single-pollutant model**

NO2		O3 (summer)		PM2.5	
ERR (%)	95% CI	ERR (%)	95% CI	ERR (%)	95% CI
1.4	[ 0.9; 1.9]	0.6	[ 0.1; 1.]	1.2	[ 0.2; 2.2]

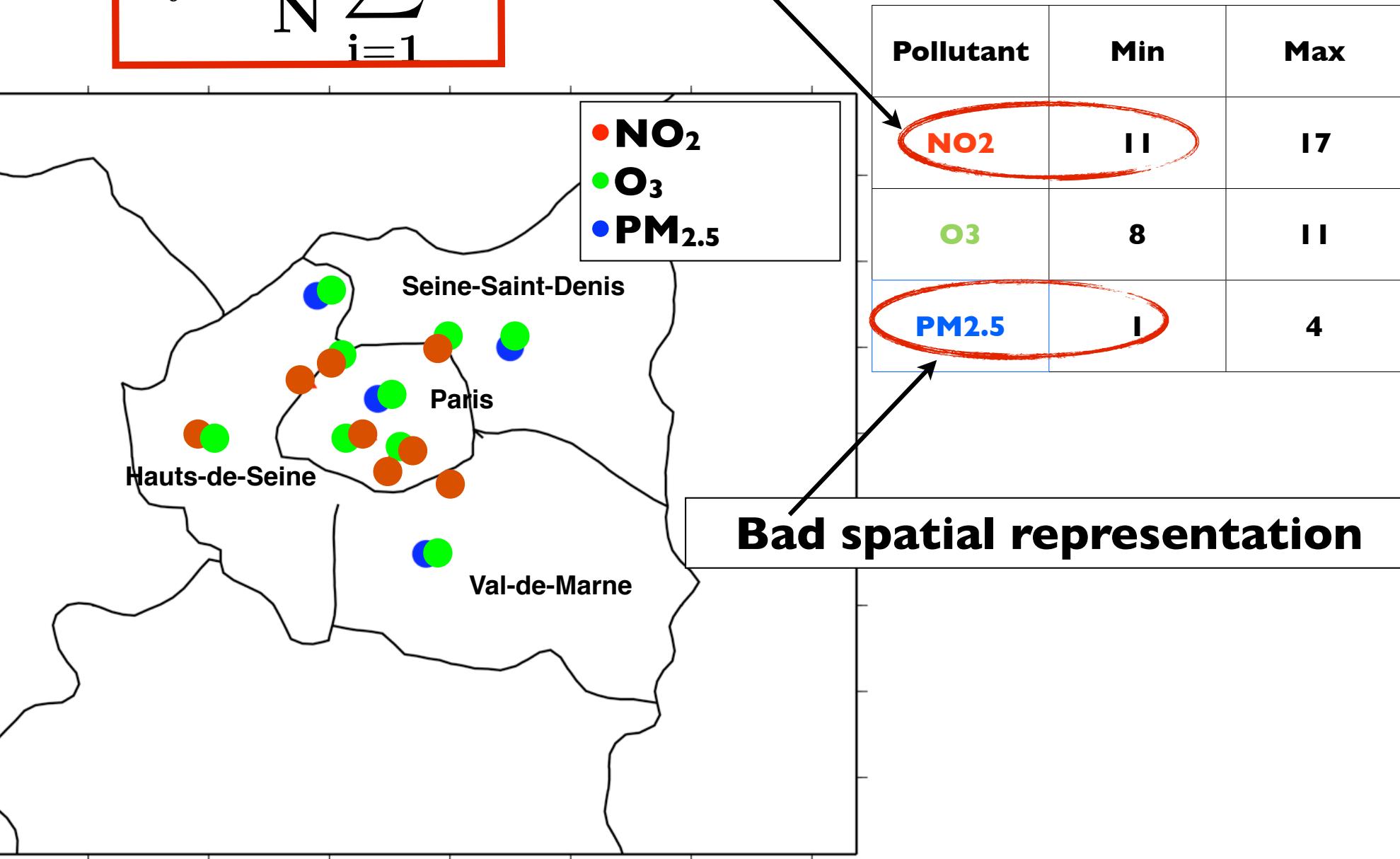
ERR: % increase in mortality due to an increase by 10 µg/m<sup>3</sup> in the level of exposure  
95%: CI 95% probability confidence interval



# Central-site approach for exposure surrogates

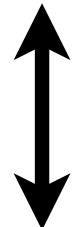
$$X_t = \frac{1}{N} \sum_{i=1}^N \bar{C}_i$$

**Good spatial representation**



**Measured concentrations**

$X_{NO_2}$



$r^2 = 0.72$

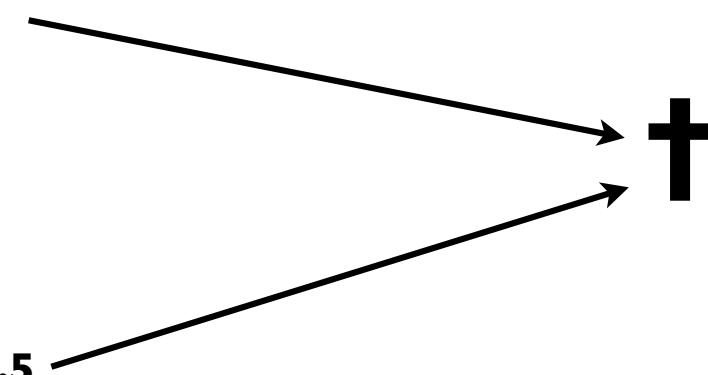


$X_{PM2.5}$

**“Real” exposure**

$X^*_{NO_2}$

$X^*_{PM2.5}$



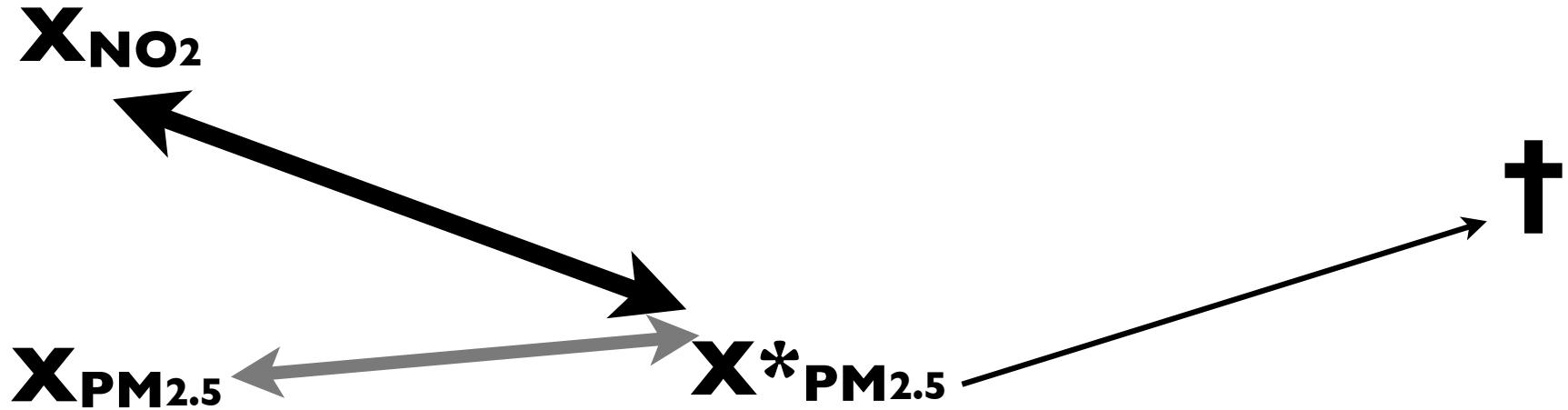
**Mortality**

**strong correlation between co-pollutants**

**Exposure  
surrogate**

**“Real” exposure**

**Mortality**



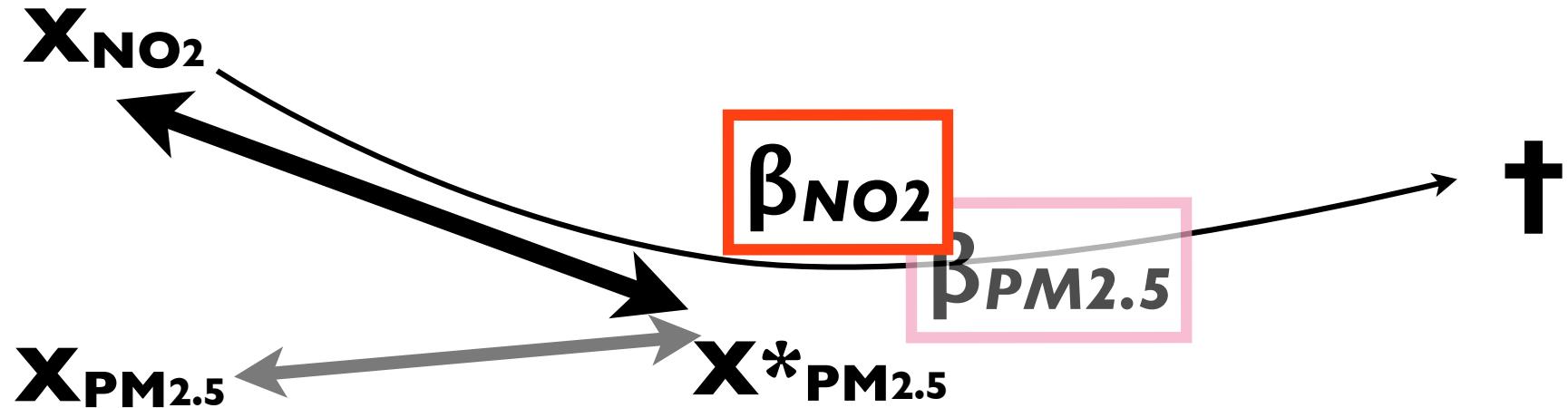
**if**  $r^2(X_{NO_2}, X^{*}_{PM2.5}) > r^2(X_{PM2.5}, X^{*}_{PM2.5})$  **then**

- **impossible to separate health-effects**

**Exposure  
surrogate**

**“Real” exposure**

**Mortality**



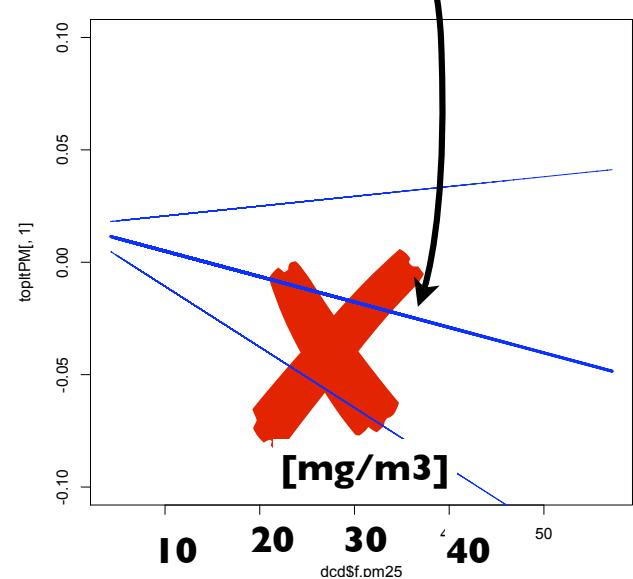
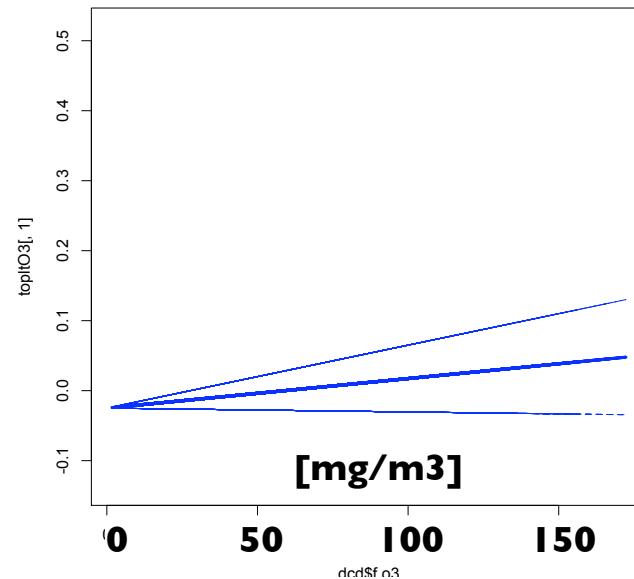
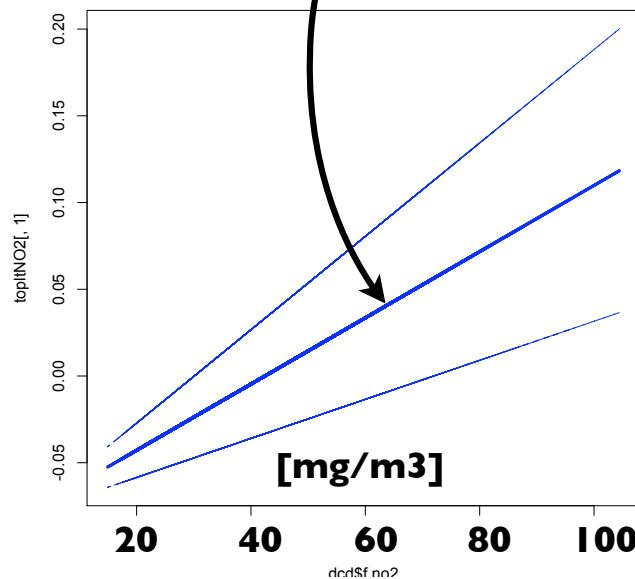
- PM<sub>2.5</sub> health effect is masked by NO<sub>2</sub>
- impossible to separate health-effects

# Multi-pollutant regression

$$\log \mu_t = \dots + \beta_{NO2}[NO2]_{t-l} + \beta_{O3}[O3]_{t-l} + \beta_{PM2.5}[PM2.5]_{t-l}$$

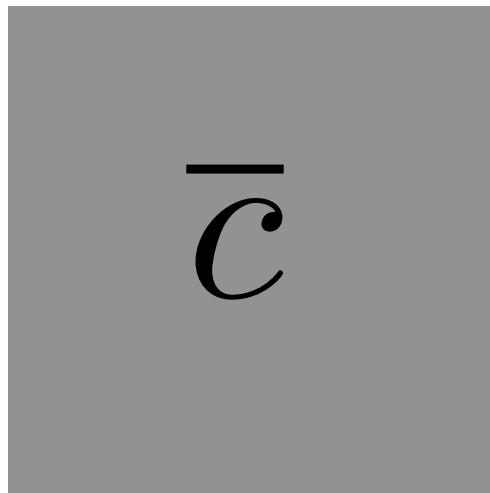
	NO2		O3 (summer)		PM2.5	
	ERR (%)	95% CI	ERR (%)	95% CI	ERR (%)	95% CI
<b>single-pollutant</b>	1.4	[ 0.9; 1.9]	0.6	[ 0.1; 1.]	1.2	[ 0.2; 2.2]
<b>multi-pollutant</b>	1.9	[ 1.1; 2.7]	0.4	[ 0.0; 0.9]	-1.1	[-2.6; 0.5]

**NO2 absorbs the effect of PM**



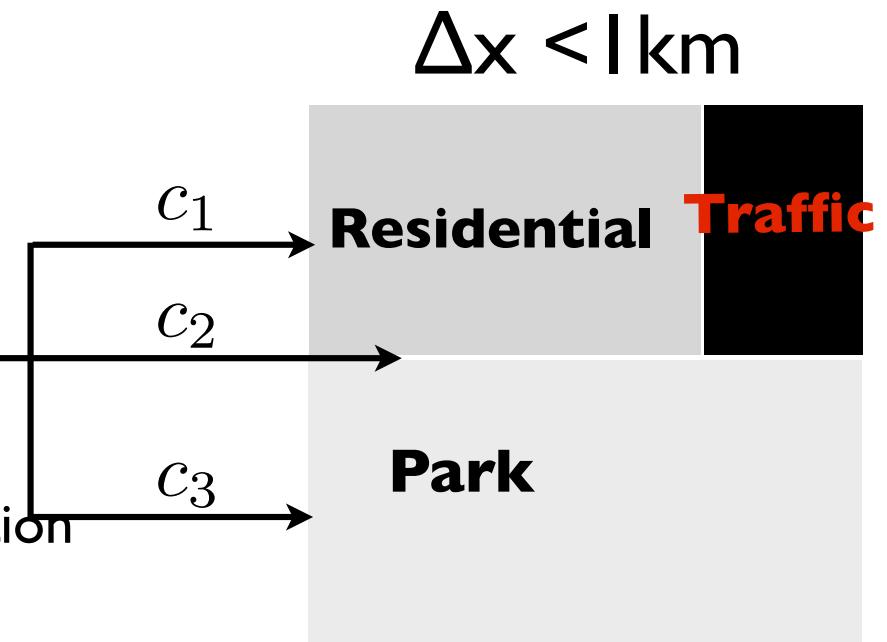
# How can chemistry-transport model help?

$\Delta x > 1 \text{ km}$



+ subgrid

- population
- roads
- housing
- parks & recreation



$\Delta x < 1 \text{ km}$

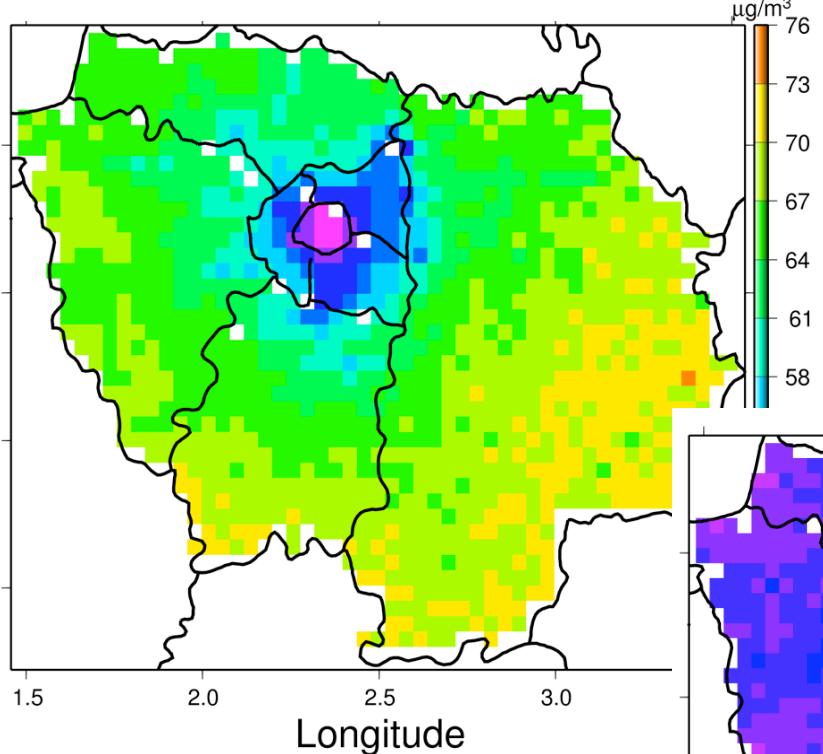
Valari and Menut, *Atmospheric Environment*, **44**, 2010

+ 3 activity regimes

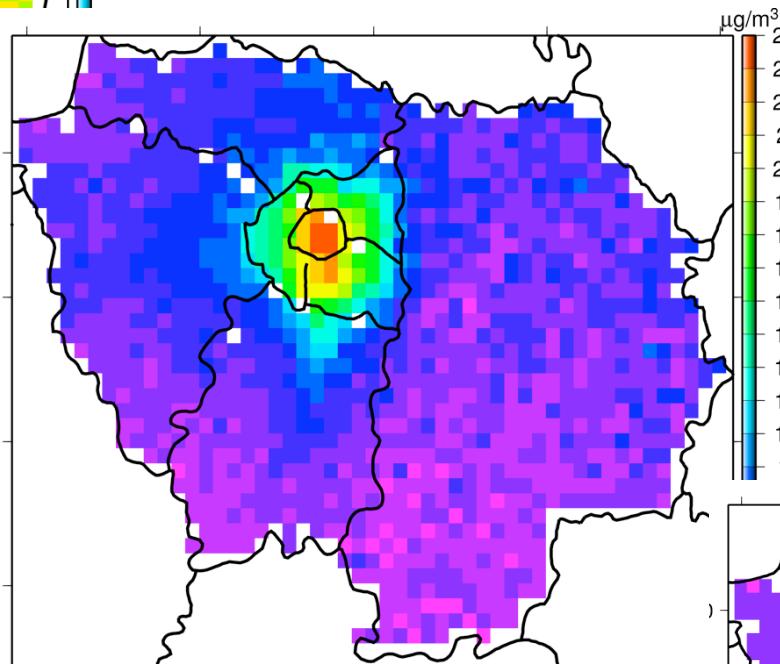


Valari et al., *JAWMA*, 2010 (in press)

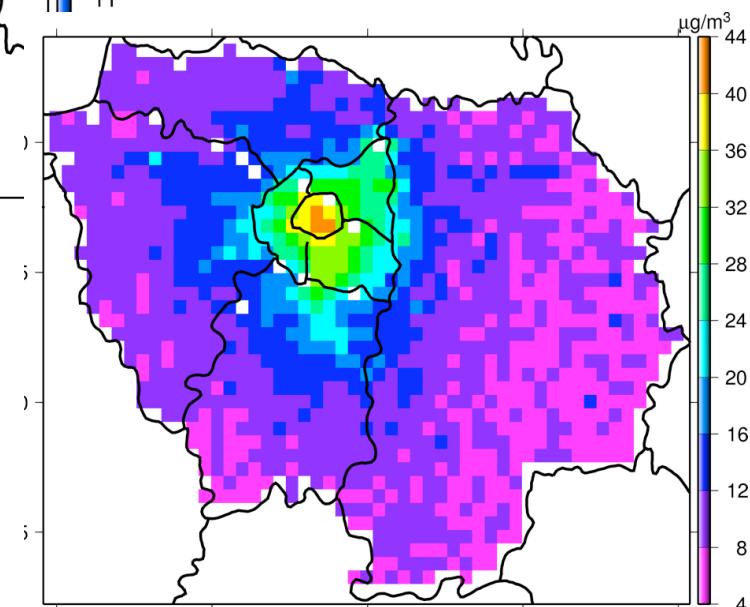
# **O<sub>3</sub>, 2004-07-07 Daily averaged ‘exposure’ maps**



**PM<sub>2.5</sub>, 2004-07-07**



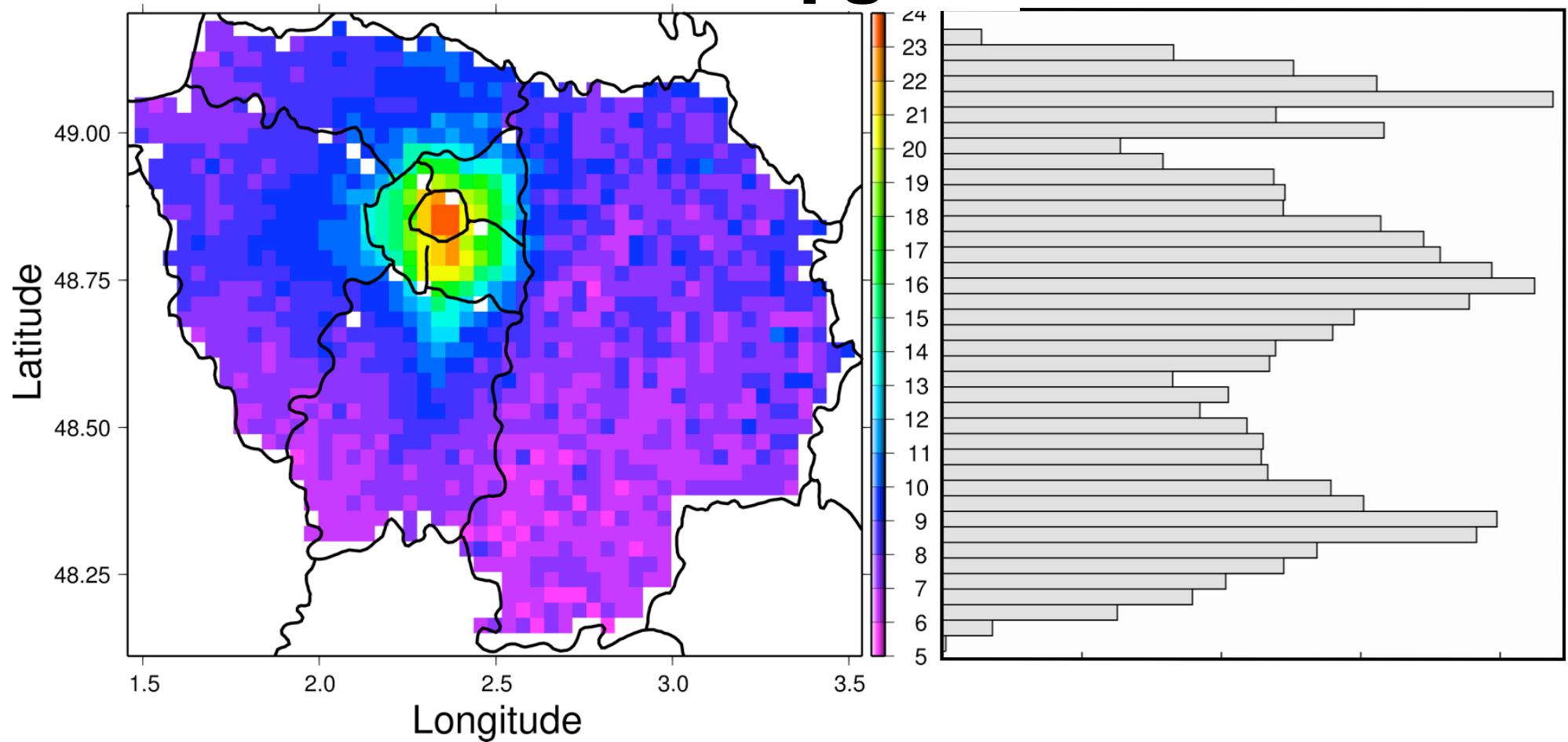
**NO<sub>2</sub>, 2004-07-07**



# Exposure distribution

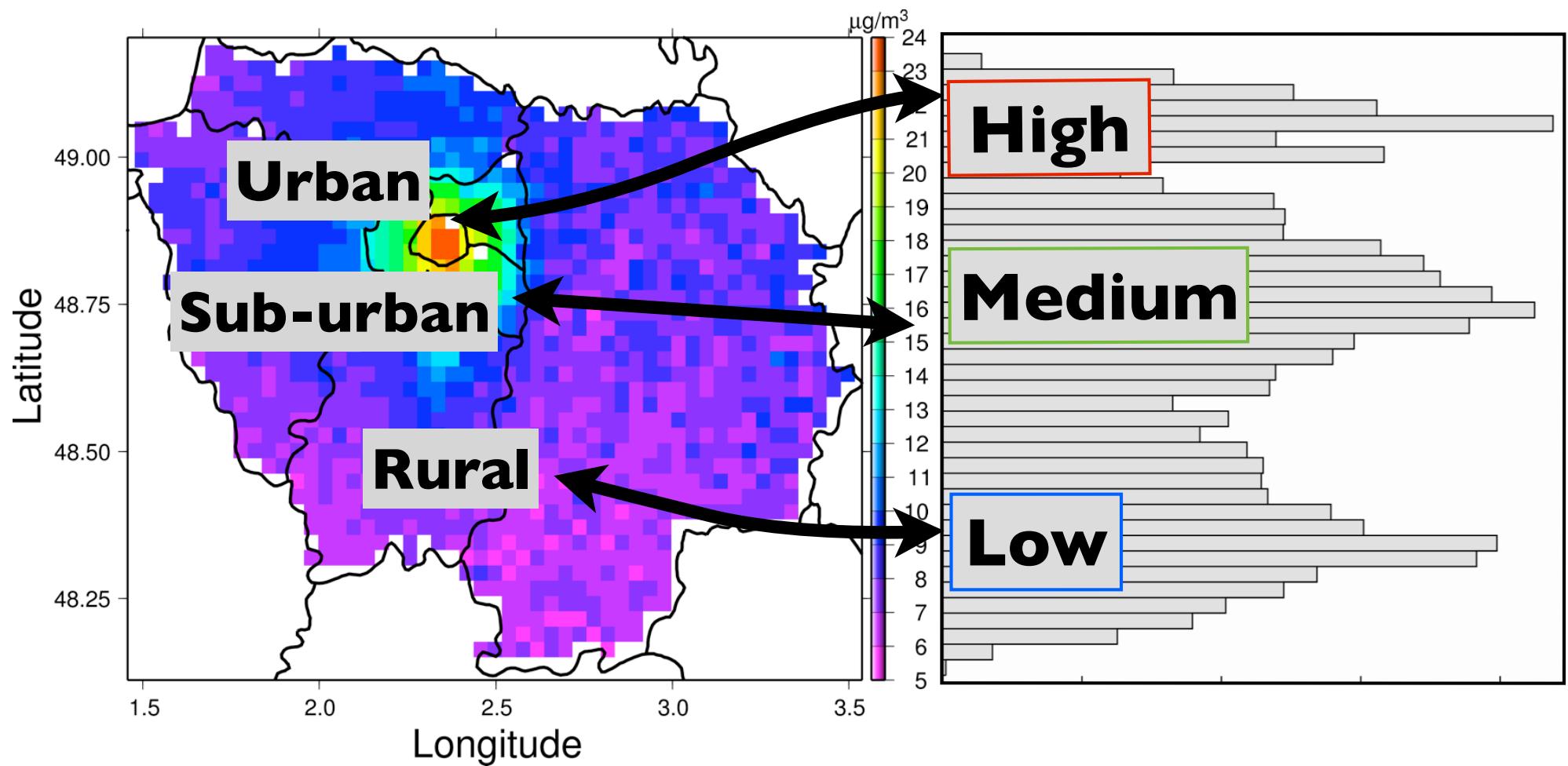
**PM<sub>2.5</sub>**, 2004-07-07

**μg/m<sup>3</sup>**



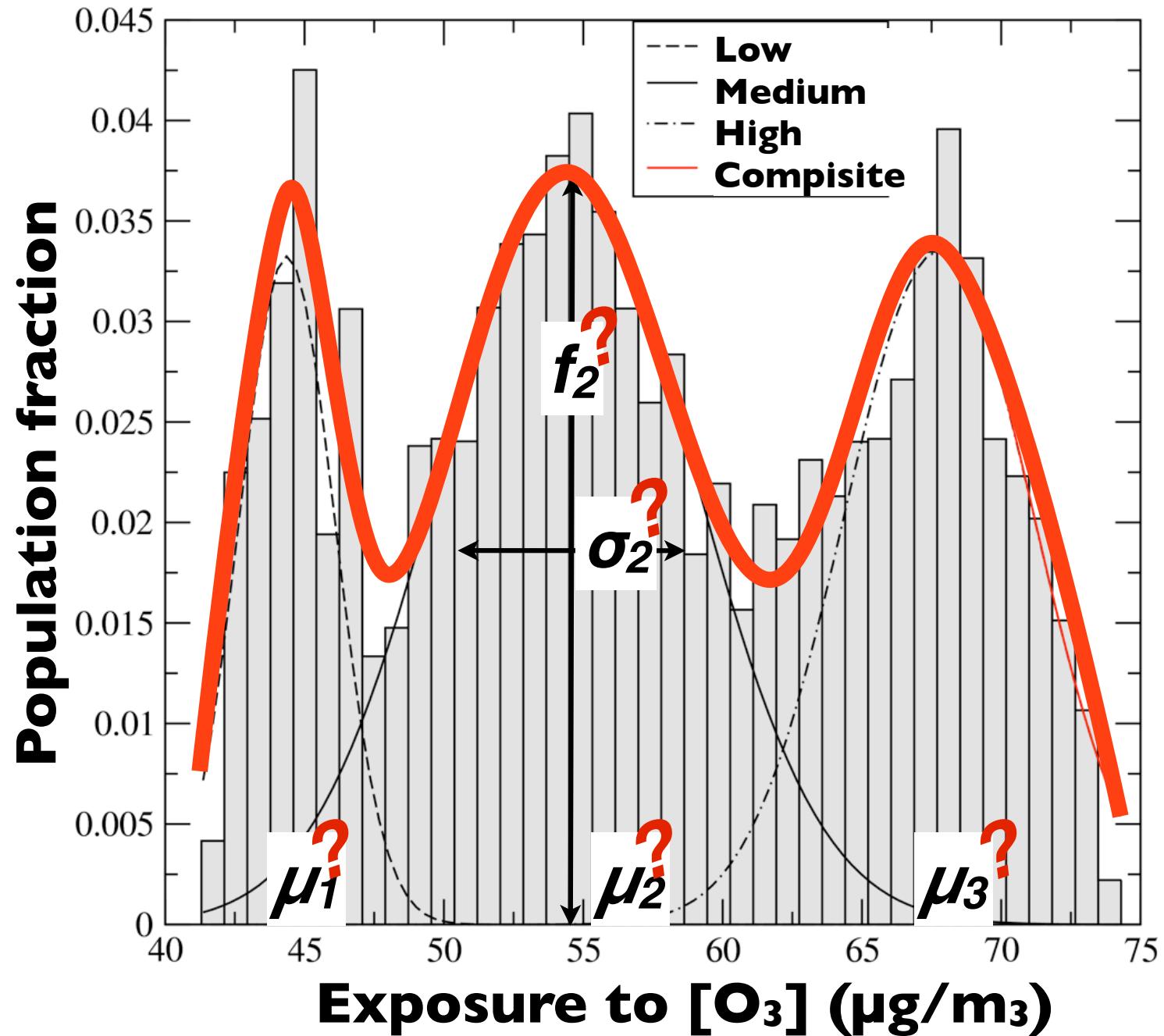
# Distribution mode => Population

**PM<sub>2.5</sub>, 2004-07-07**



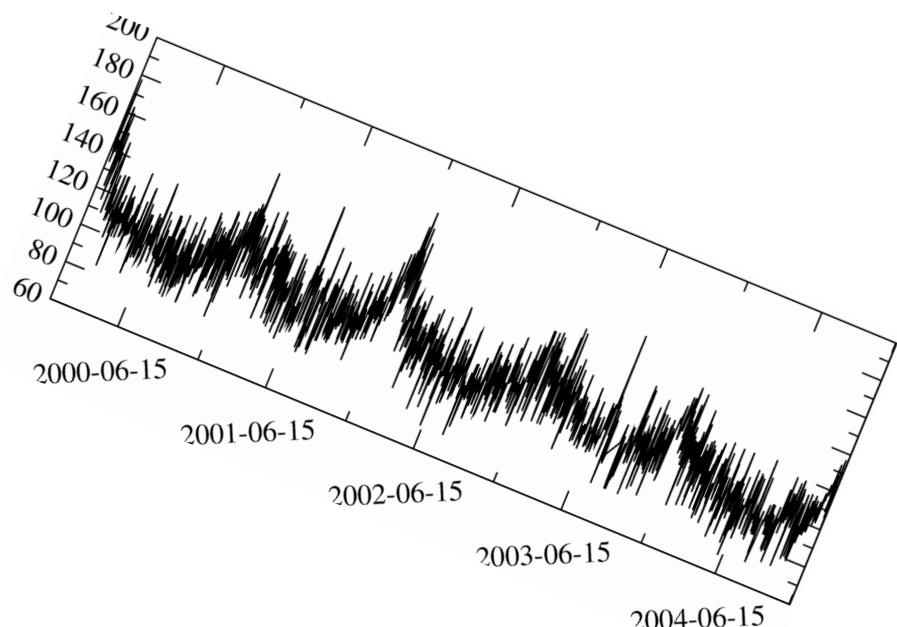
# Parametrization:

$$D(x) = \sum_{i=1}^3 \frac{f_i}{\sigma_i \sqrt{2\pi}} \exp \left[ -\frac{(x - \mu_i)^2}{2\sigma_i^2} \right]$$

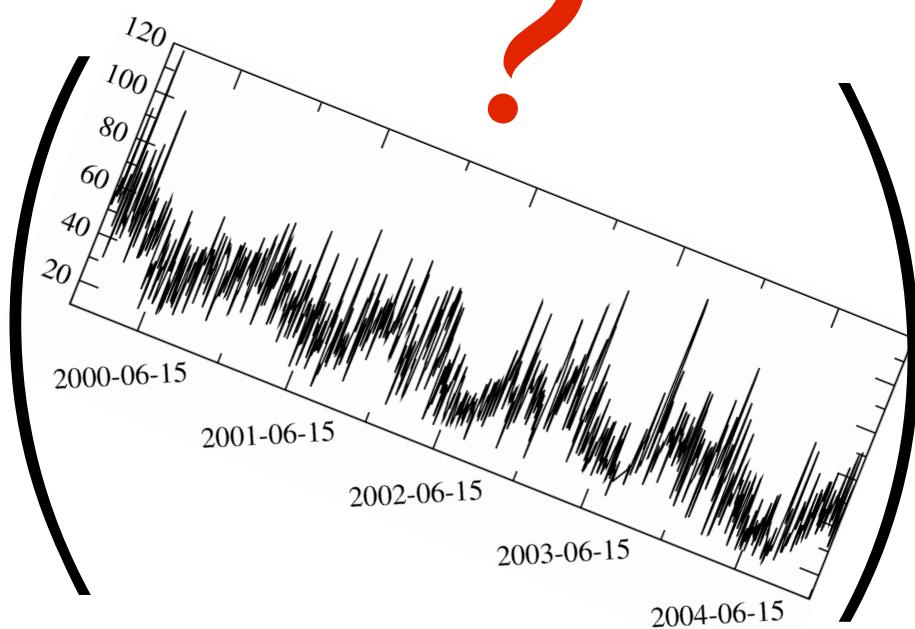


# Sensitivity study

$$\log \mu_t = \beta_0 + \phi(U_{t-n}) + \alpha Z_{t-m}^T + \beta X_{t-l}$$



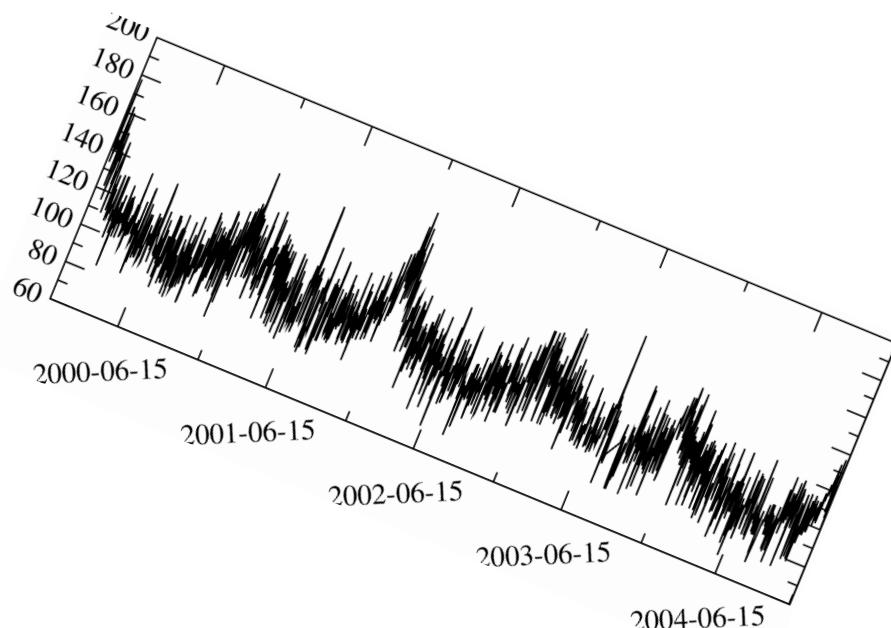
= linear  $f$



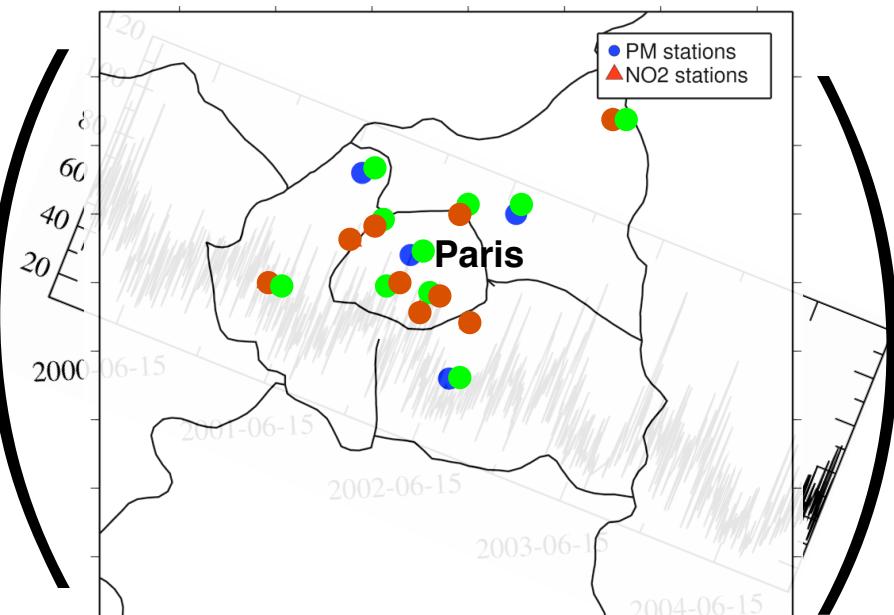
# Sensitivity study

$$\log \mu_t = \beta_0 + \phi(U_{t-n}) + \alpha Z_{t-m}^T + \beta X_{t-l}$$

## I) Monitors

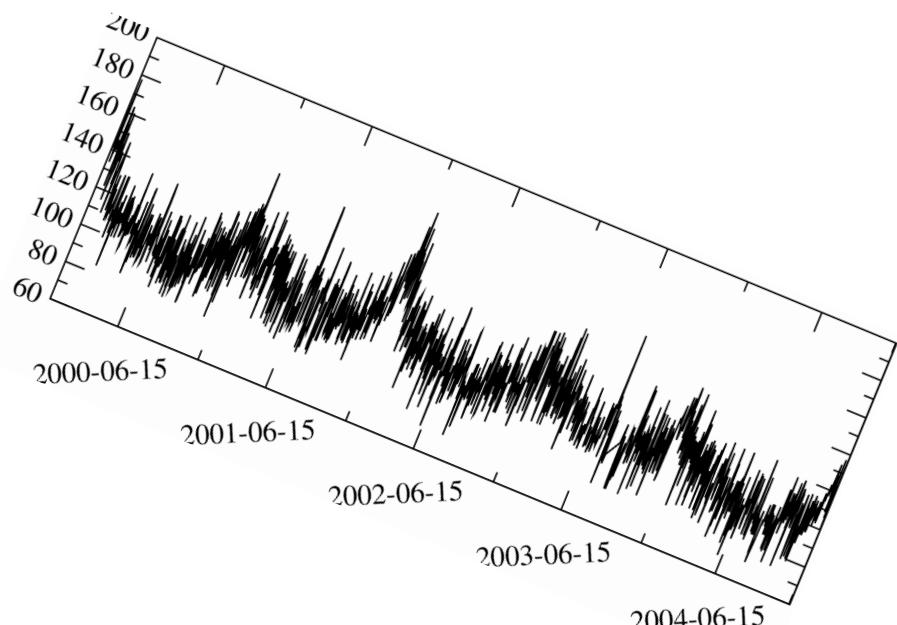


= linear  $f$



# Sensitivity study

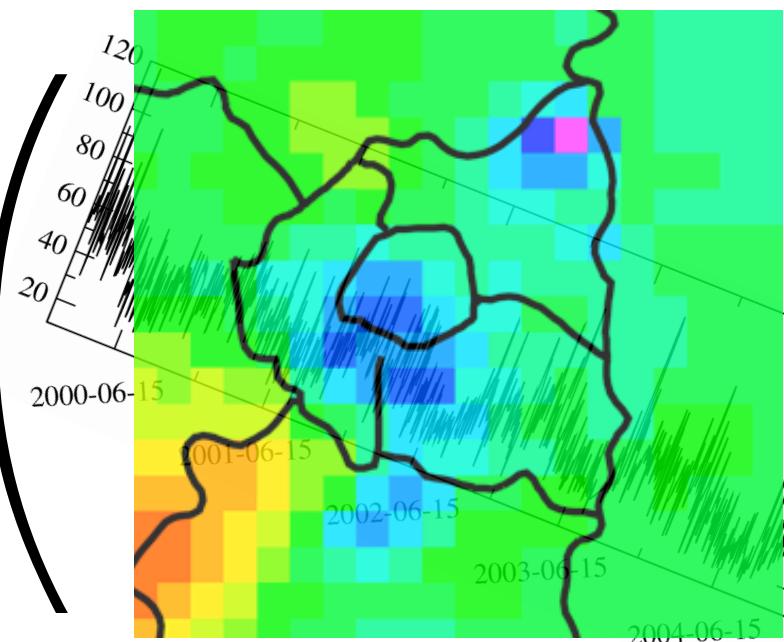
$$\log \mu_t = \beta_0 + \phi(U_{t-n}) + \alpha Z_{t-m}^T + \beta X_{t-l}$$



= linear  $f$

**daily mortality counts**

**2) CTM at 3km**

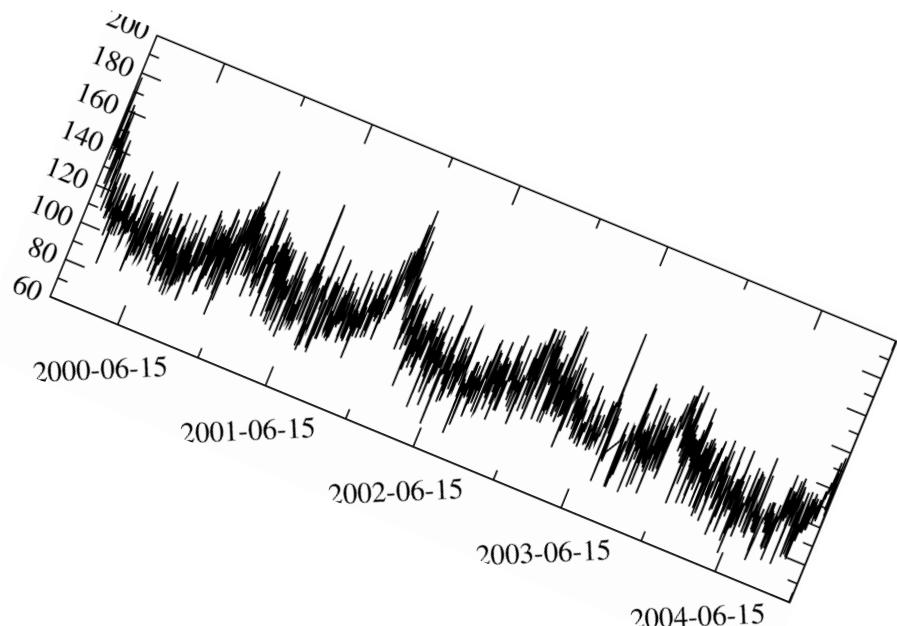


**day averaged pollutant levels**

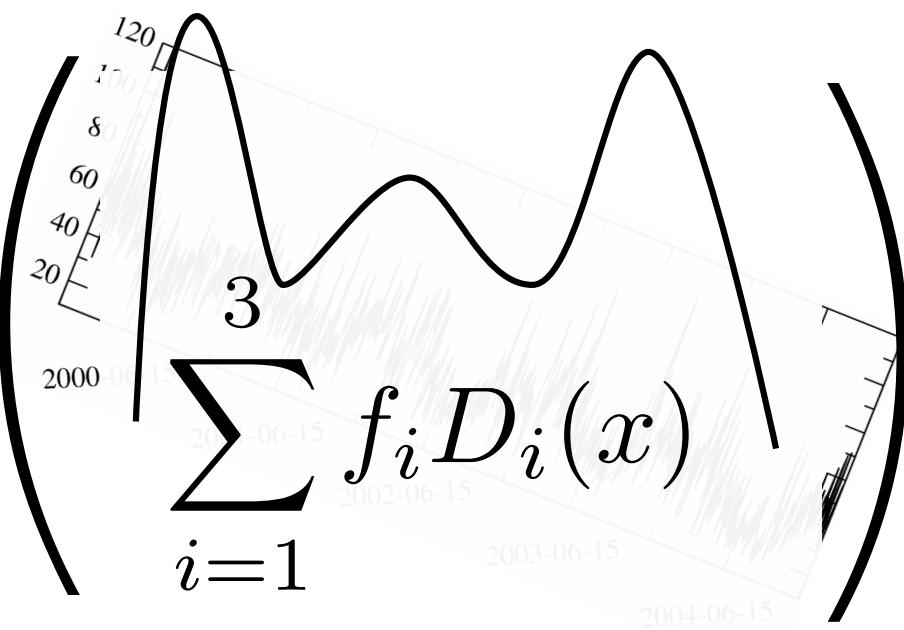
# Sensitivity study

$$\log \mu_t = \beta_0 + \phi(U_{t-n}) + \alpha Z_{t-m}^T + \beta X_{t-l}$$

3) CTM+Subgrid+Activity

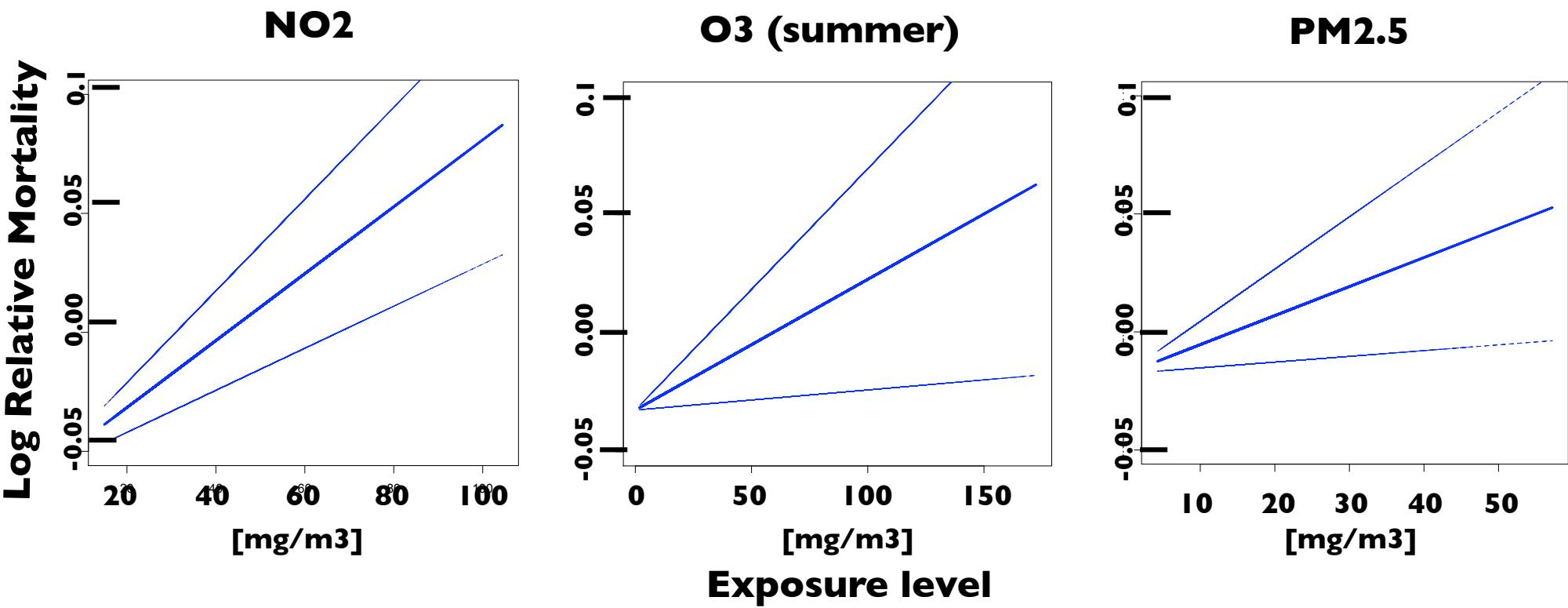


= linear  $f$



**single-  
pollutant**

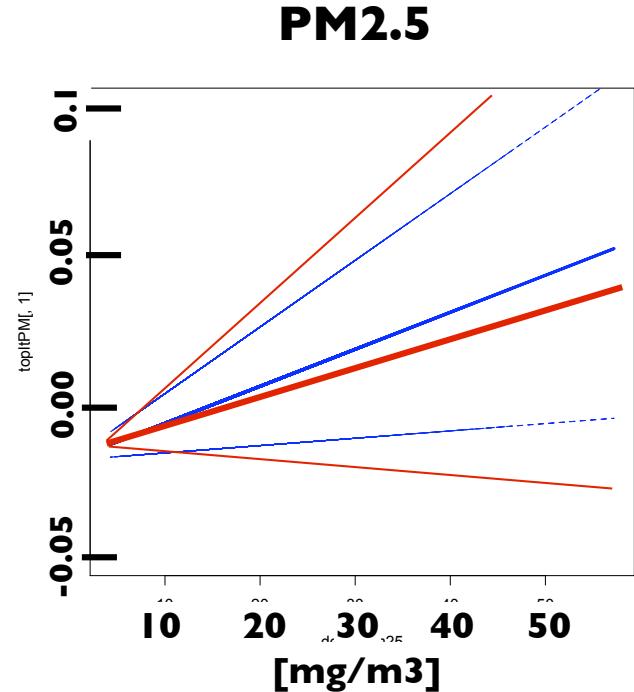
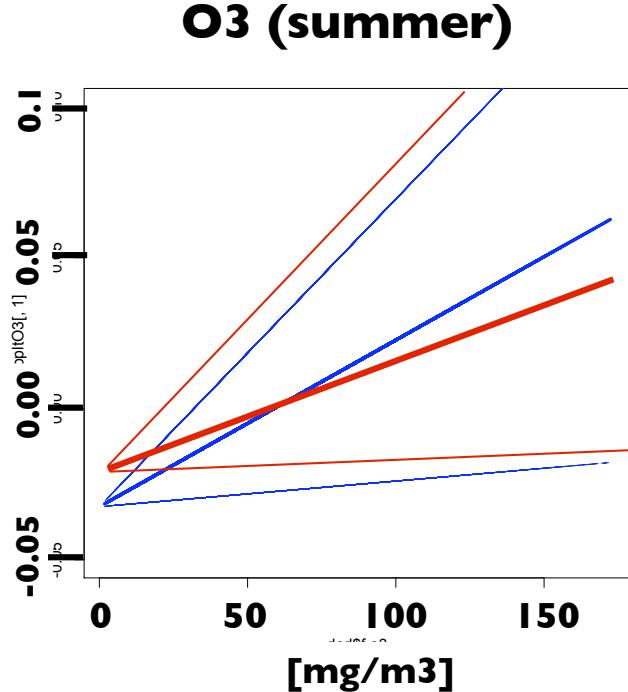
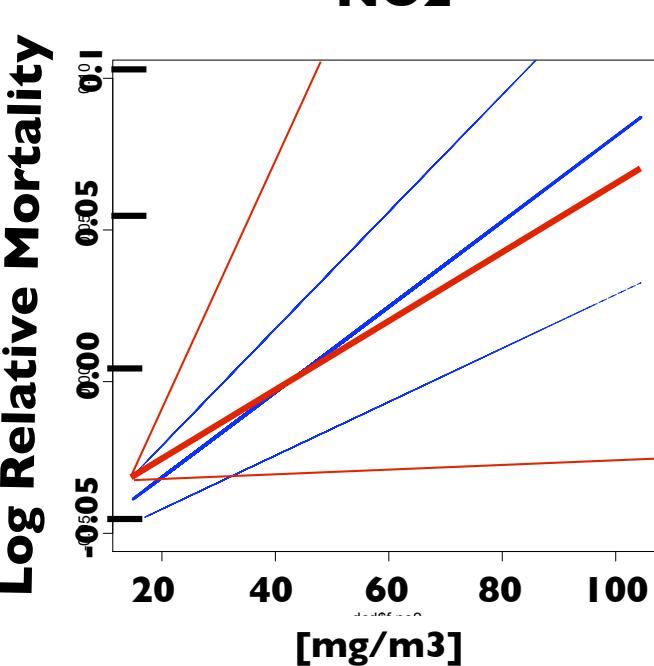
	<b>NO2</b>		<b>O3 (summer)</b>		<b>PM2.5</b>	
	<b>ERR (%)</b>	<b>95% CI</b>	<b>ERR (%)</b>	<b>95% CI</b>	<b>ERR (%)</b>	<b>95% CI</b>
MONITOR	1.4	[ 0.9; 1.9]	0.6	[ 0.1; 1.]	1.2	[ 0.2; 2.2]
CTM						
ACTIVITY						



**single-pollutant**

	<b>NO<sub>2</sub></b>		<b>O<sub>3</sub> (summer)</b>		<b>PM<sub>2.5</sub></b>	
	<b>ERR (%)</b>	<b>95% CI</b>	<b>ERR (%)</b>	<b>95% CI</b>	<b>ERR (%)</b>	<b>95% CI</b>
MONITOR	1.4	[ 0.9; 1.9]	0.6	[ 0.1; 1.]	1.2	[ 0.2; 2.2]
CTM	1.1	[ 0.0; 2.3]	0.4	[ 0.0; 0.9]	0.9	[-0.5; 2.3]
ACTIVITY						

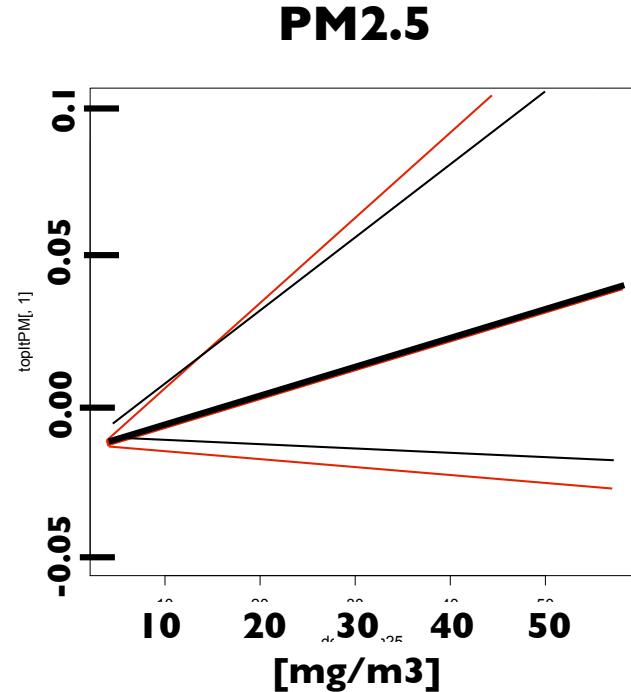
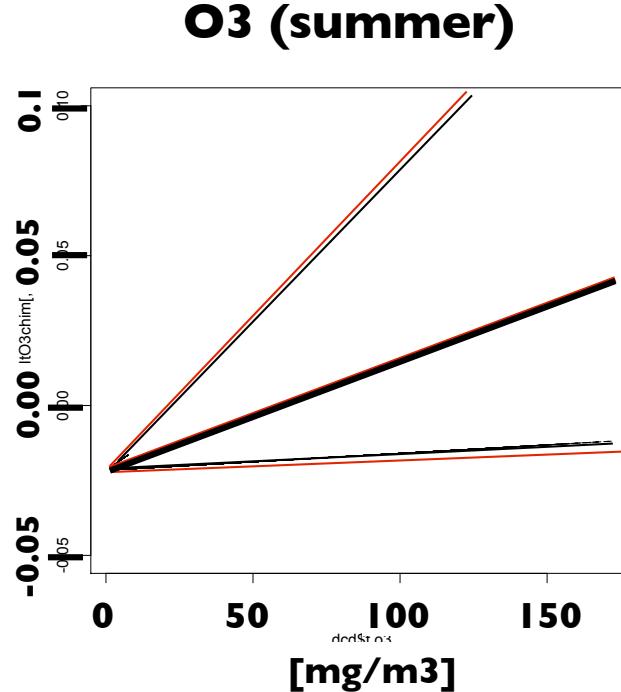
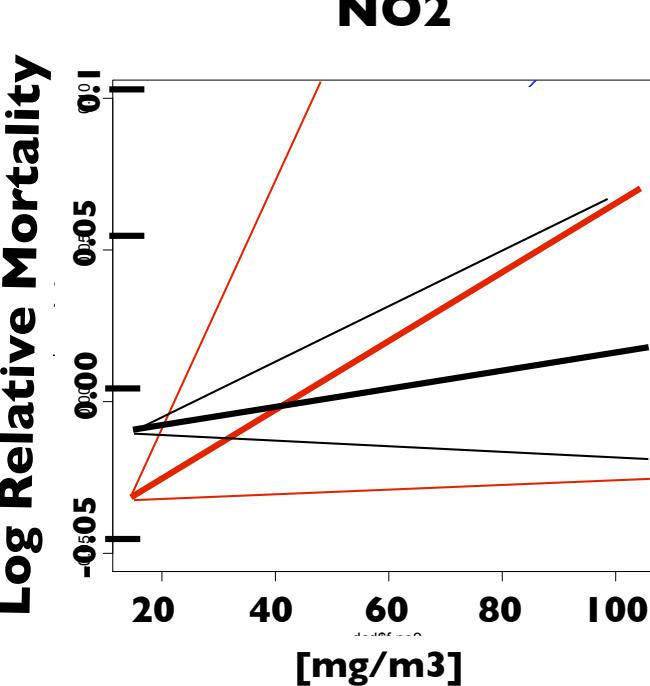
- Lower central estimates
- Larger uncertainty
- but... small differences



**single-pollutant**

	<b>NO<sub>2</sub></b>		<b>O<sub>3</sub> (summer)</b>		<b>PM<sub>2.5</sub></b>	
	<b>ERR (%)</b>	<b>95% CI</b>	<b>ERR (%)</b>	<b>95% CI</b>	<b>ERR (%)</b>	<b>95% CI</b>
MONITOR	1.4	[ 0.9; 1.9]	0.6	[ 0.1; 1.]	1.2	[ 0.2; 2.2]
CTM	1.1	[ 0.0; 2.3]	0.4	[ 0.0; 0.9]	0.9	[ -0.5; 2.3]
ACTIVITY	0.3	[ -0.4 ; 1.0]	0.4	[ 0.0 ; 0.8]	0.9	[ -0.2 ; 2.0]

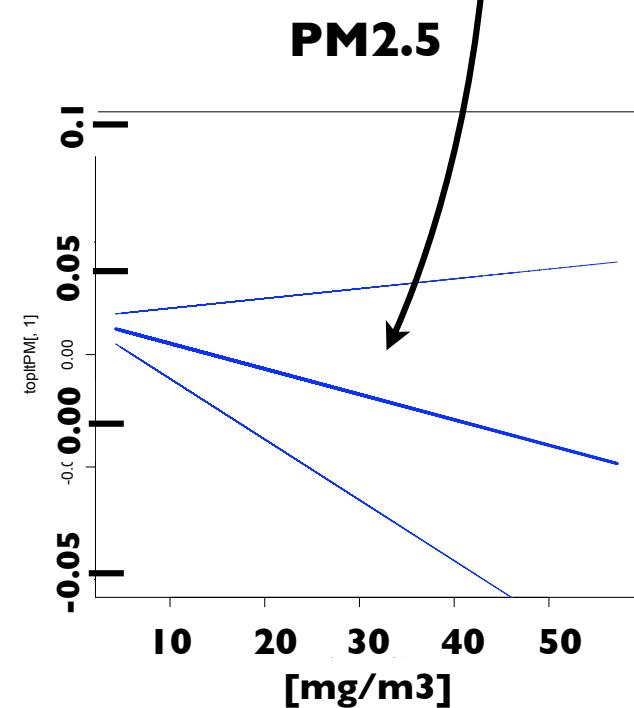
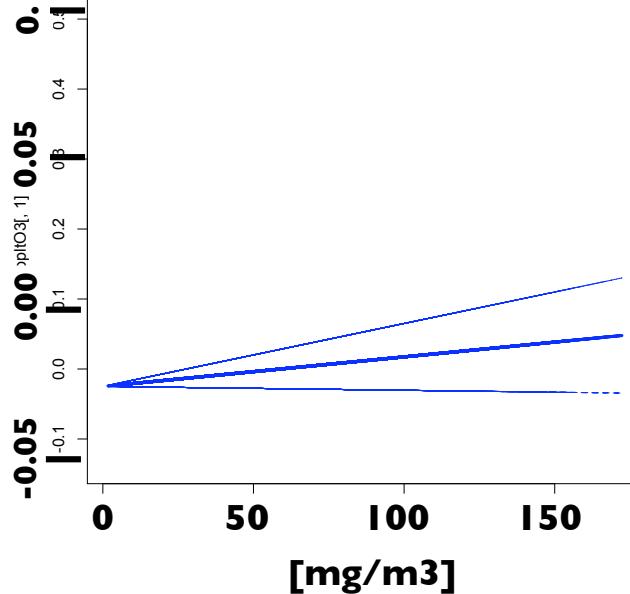
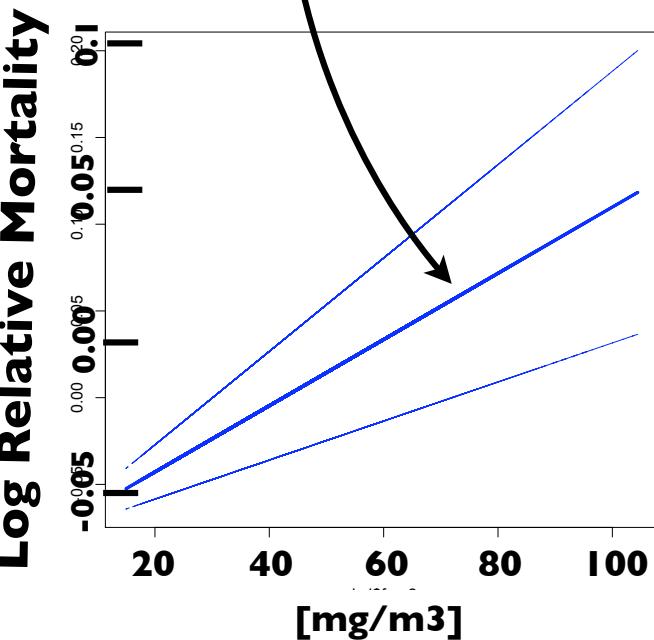
**Similar results  
Smaller uncertainties**



**multi-pollutant**

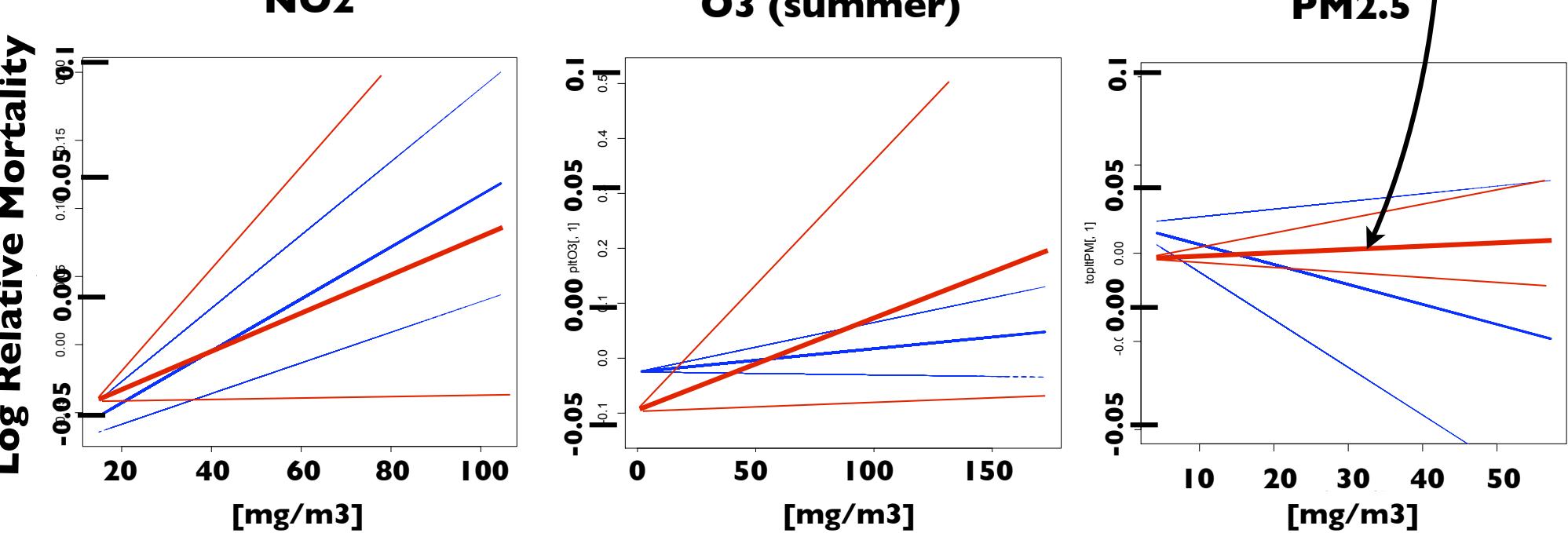
	NO <sub>2</sub>		O <sub>3</sub> (summer)		PM <sub>2.5</sub>	
	ERR (%)	95% CI	ERR (%)	95% CI	ERR (%)	95% CI
MONITOR	1.9	[ 1.1; 2.7]	0.4	[ 0.0; 0.9]	-1.1	[-2.6; 0.5]
CTM						
ACTIVITY						

**NO<sub>2</sub> absorbs the effect of PM**



multi-pollutant	NO2		O3 (summer)		PM2.5	
	ERR (%)	95% CI	ERR (%)	95% CI	ERR (%)	95% CI
MONITOR	1.9	[ 1.1; 2.7]	0.4	[ 0.0; 0.9]	-1.1	[-2.6; 0.5]
CTM	1.4 <span style="color:red">X</span>	[ -0.3; 3.1]	1.6 <span style="color:red">X</span>	[ 0.1; 3.1]	0.2 <span style="color:red">X</span>	[-0.5; 1.0]
ACTIVITY						

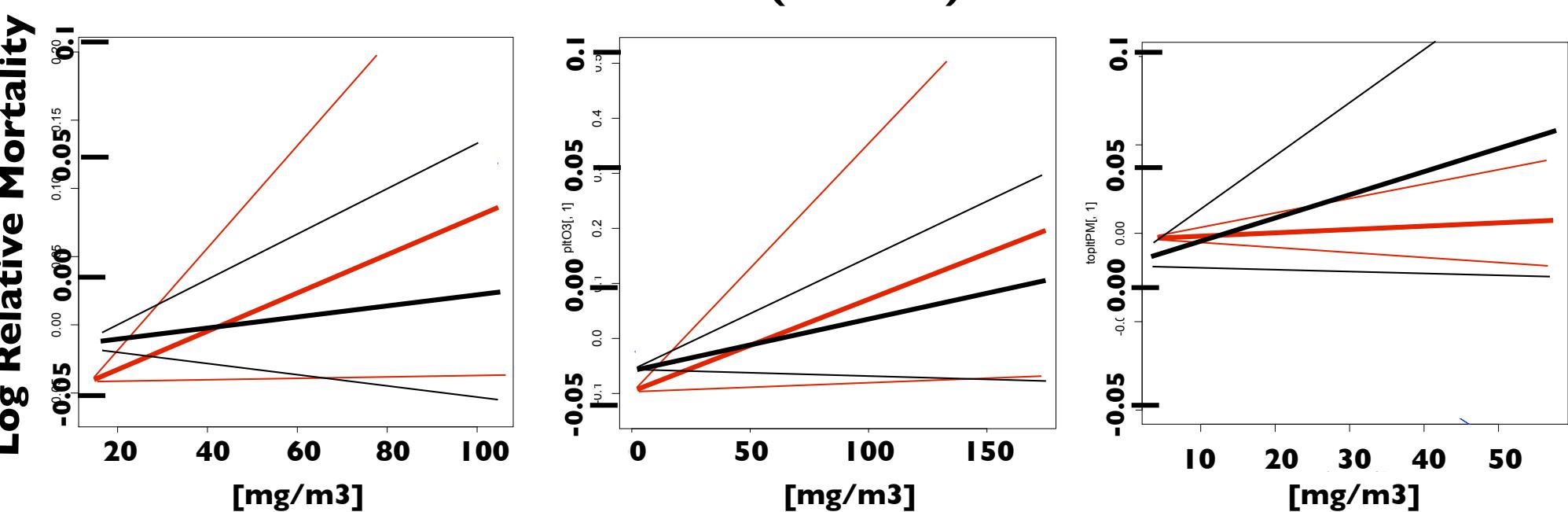
similar bias for CTM modelled concentrations



**multi-pollutant**

	NO2		O3 (summer)		PM2.5	
	ERR (%)	95% CI	ERR (%)	95% CI	ERR (%)	95% CI
MONITOR	1.9 <span style="color:red">X</span>	[ 1.1; 2.7]	0.4	[ 0.0; 0.9]	-1.1 <span style="color:red">X</span>	[-2.6; 0.5]
CTM	1.4 <span style="color:red">X</span>	[ -0.3; 3.1]	1.6 <span style="color:red">X</span>	[ 0.1; 3.1]	0.2 <span style="color:red">X</span>	[-0.5; 1.0]
ACTIVITY	0.4 <span style="color:green">✓</span>	[ -0.6 ; 1.4]	0.9 <span style="color:green">✓</span>	[ -0.4 ; 1.2]	1.3 <span style="color:green">✓</span>	[ -0.0 ; 2.7]

All estimates are positive when activity data are accounted for



# **What should be kept in mind?**

- Air-quality model provides reasonable effect estimates when used in the same way as monitor data
- Similar problems are encountered when monitor or ‘simple’ CTM concentrations are used in a multi-pollutant health study design
- Only when activity data are accounted for do co-pollutants effects be separated