

**Imperial College  
London**

**Spatial approaches to epidemiology  
and public health: experiences from  
SAHSU, UK**

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# The Small Area Health Statistics Unit (SAHSU)

- Commenced in 1987
  - following a recommendation of the Black Inquiry

*“... encouragement should be given to an organisation ... to co-ordinate centrally the monitoring of small area statistics around major installations producing discharges that might present a carcinogenic or mutagenic hazard to the public. In this way, early warning of any untoward health effect could be obtained.”*

*London, HMSO, 1984*

- London School of Hygiene and Tropical Medicine
- Imperial College London since 1996

## SAHSU's terms of reference include:

- To develop and maintain databases of health data, environmental exposures as required to meet a specific need, and social confounding factors at the small-area level;
- To respond rapidly, with expert advice, to *ad hoc* queries from the funding departments about unusual clusters of disease, particularly in the neighbourhood of industrial installations;
- To develop the methodology for analysing and interpreting statistics relating to small areas

# Examples of recent and current projects

## SAHSU projects:

- Chronic health effects of air pollution: SO<sub>2</sub> and black smoke
- Health effects of chlorination by-products in drinking water
- Multiple deprivation: environmental inequities and health implications
- Health effects in populations exposed to chemical industry emissions
- Health risks in populations living close to landfill sites

## SAHSU-related projects

- Childhood cancer and leukaemias around mobile phone masts
- Adult cancers in populations living close to powerlines
- Air Pollution Modelling for Support to Policies on Health and Environmental Risks in Europe (APMoSPHERE)
- Health effects of air pollution episodes (part of Global Environmental Monitoring with Satellites study – GEMS)
- Integrated Assessment of Health Risks from Environmental Stressors in Europe (INTARESE)
- Health Effects and Risks of Transport Systems (HEARTS)
- Health and environment integrated methodology and toolbox for scenario assessment (HEIMTSA)
- The Rapid Inquiry Facility (RIF)



# Methods for research: GIS functionality

- Capture geographic data
- Integrate data into a common geographic form
- Provide a means for data validation & quality control
- Generate maps of disease, environmental hazards and socio-economic factors
- Enable modelling of unmeasured characteristics
- Allow linkage or integration of models
- Provide a basis for exposure assessment

# Determinants of exposure

- Hazard intensity
  - Spatial distribution
  - Temporal variability
  - Micro-environment
- Population distribution
  - Population pattern
  - Time-activity
- Behaviour
  - Consumption
  - Activity level
  - Lifestyle
- Physiography
  - Stature
  - Age
  - Gender

Exposure occurs as people move through, and reside within, a changing hazard field

# How can we assess exposures?

- Direct methods
  - Bio-monitoring
  - Personal exposure
  - Self-reporting
- Indirect methods
  - Natural recorders
  - Exposure proxies
  - Spatial modelling
  - Process modelling

Typically environmental exposure assessment is based on the use of routine monitoring sites



# Sources of data for exposure modelling

- Environmental surveys
  - Soils, geology etc
- Ground-based monitoring
  - Routine monitoring networks
  - Purpose-designed surveys
  - Natural monitors
- Earth observation
  - Satellites
  - Airborne monitors
- Census data
  - Population censuses

# Exposure modelling

- Monitoring station
- Indicators
- **Source-receptor modelling**
  - Models exposures by simulating relationships between source and receptor
- **Interpolation**
  - Models spatial patterns of exposure on the basis of monitored (georeferenced) data (with or without covariates)

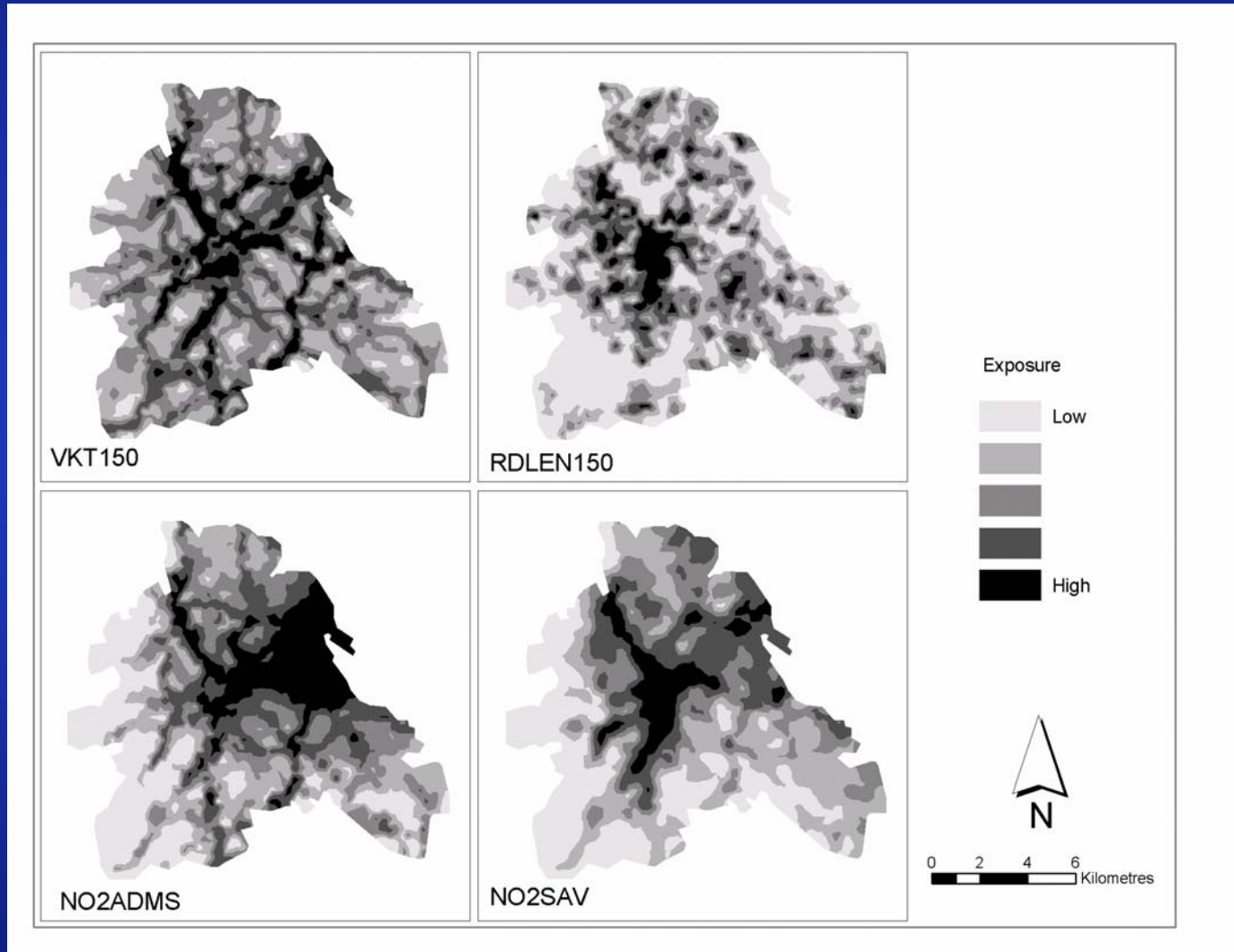
## Example: exposure to air pollution

- Air pollution has been a policy concern in Europe since the late 1970s
- Historically, episodes associated with fossil fuel combustion provided evidence of adverse health effects
  - London 1952 and 1962
- Today, the focus is on traffic-related air pollutants (e.g.  $PM_{10}$  and  $NO_x$ )
- WHO global burden of disease estimated 800,000 premature deaths worldwide in 2000
  - Western Europe: 12,000 (men) and 11,000 (women)

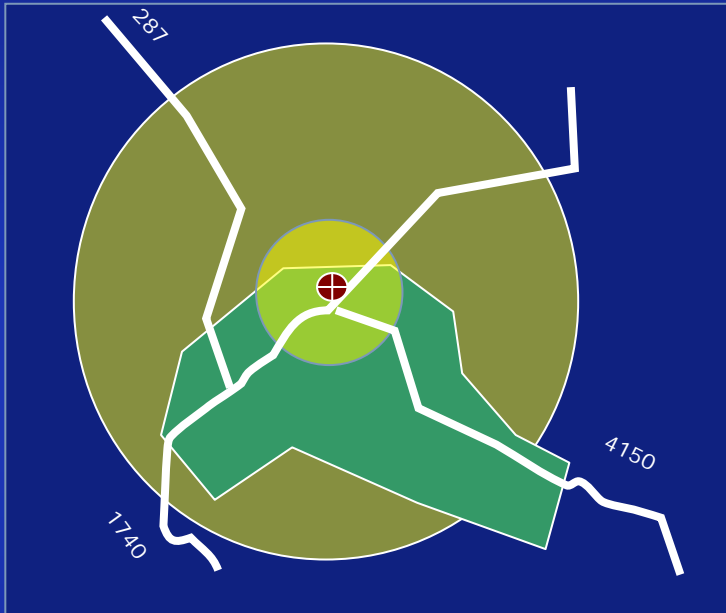
# Indicators of traffic-related air pollution

- Distance to nearest (main) road
- Road density within X (e.g. 150) metres
- Traffic volume on nearest (main) road
- Traffic volume on nearest main road/distance
- Traffic volume in neighbourhood (e.g. census tract)
- Vehicle kilometres travelled on all roads within radius of X (e.g. 150) metres
- Emissions from road traffic within X (e.g. 150) metres
- Modelled concentrations of marker pollutant (e.g. NO<sub>2</sub>)

# Comparison of exposure maps: traffic-related air pollution, Sheffield



# Land use regression



1. Buffer around each monitoring site at pre-defined distances
2. Extract measures of predictors (e.g. traffic volume, land cover) for each buffer zone
3. Use multiple regression to develop predictive model

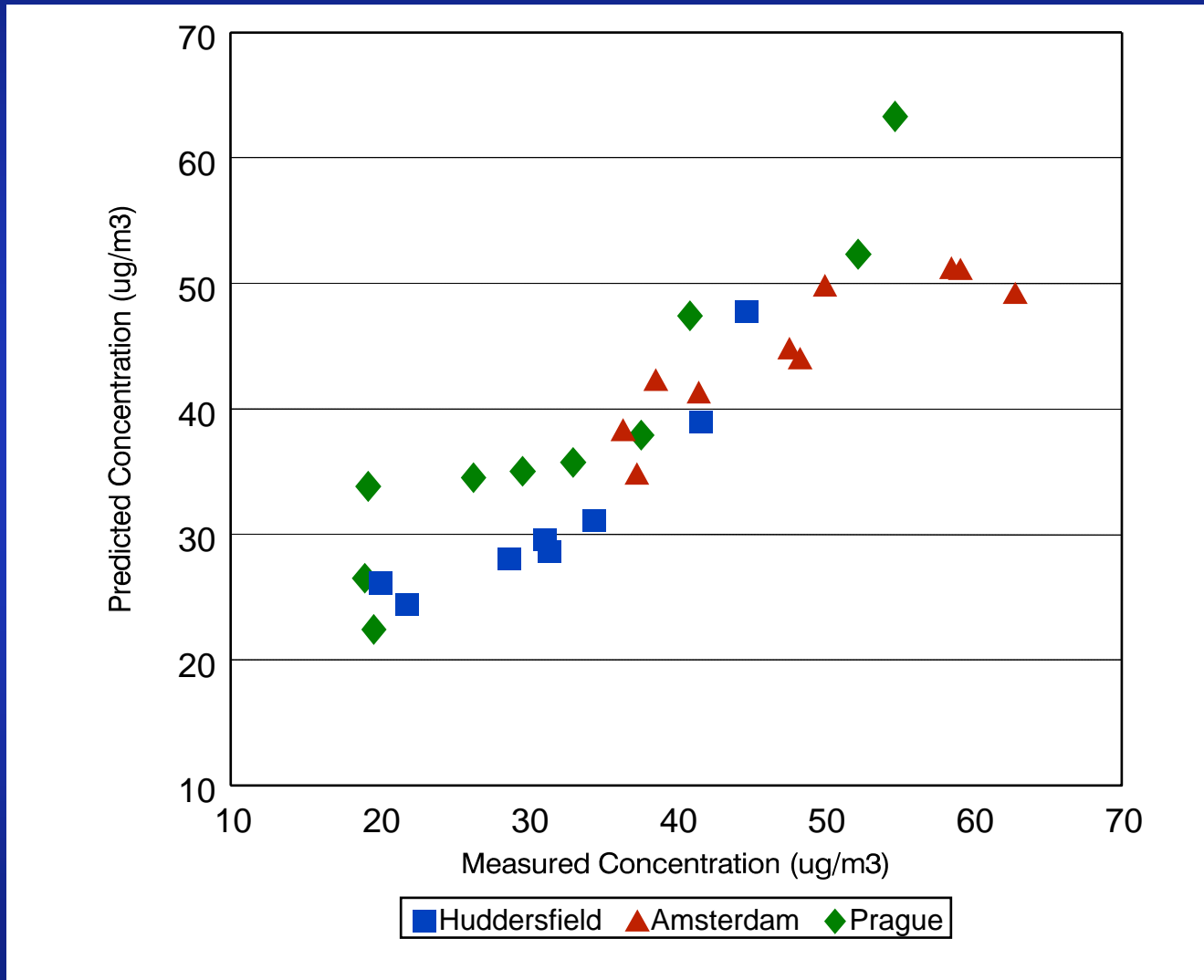
$$C = 38.5 + .003705 * \text{Traff} + 0.232 * \text{Land} - 5.673 * \log_{10} \text{Alt}$$

where:

$$\text{Traff} = 18 * \text{Tvol}_{0-40} + \text{Tvol}_{40-300}$$

$$\text{Land} = 8 * \text{HDH}_{0-300} + \text{Ind}_{0-300}$$

# The SAVIAH study: model validation

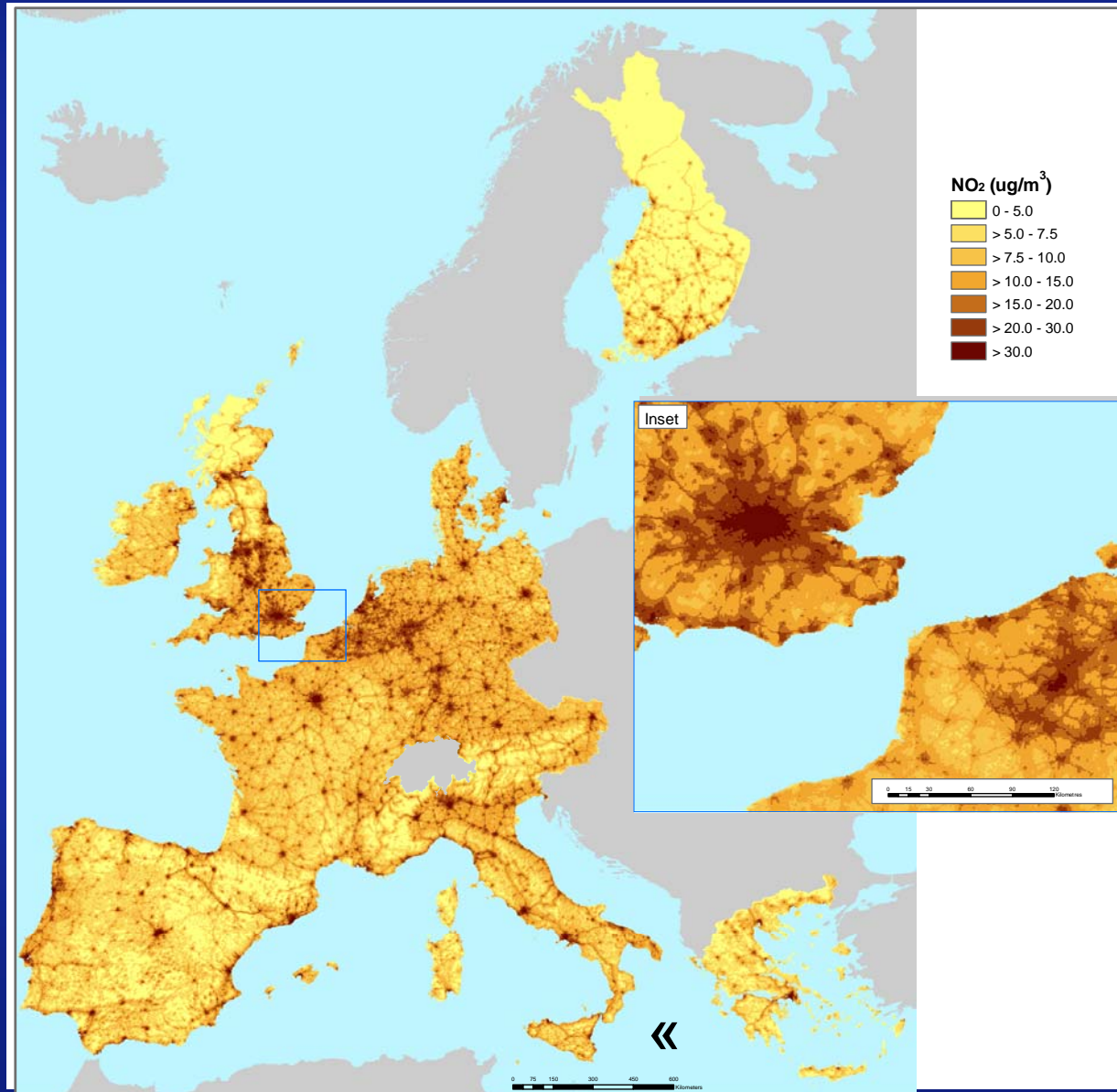


## Performance of four exposure models: Huddersfield

Method	$r^2$ (n=8)	SEE ( $\mu\text{g}/\text{m}^3$ )	Mean exposure ( $\mu\text{g}/\text{m}^3$ )	% exceedance (NAQS)
Kriging	0.44	6.45	31.6	8.0
Dispersion modelling	0.63	5.25	27.1	4.3
Moving window	0.67	4.92	26.9	2.9
Regression	0.82	3.68	30.0	7.5

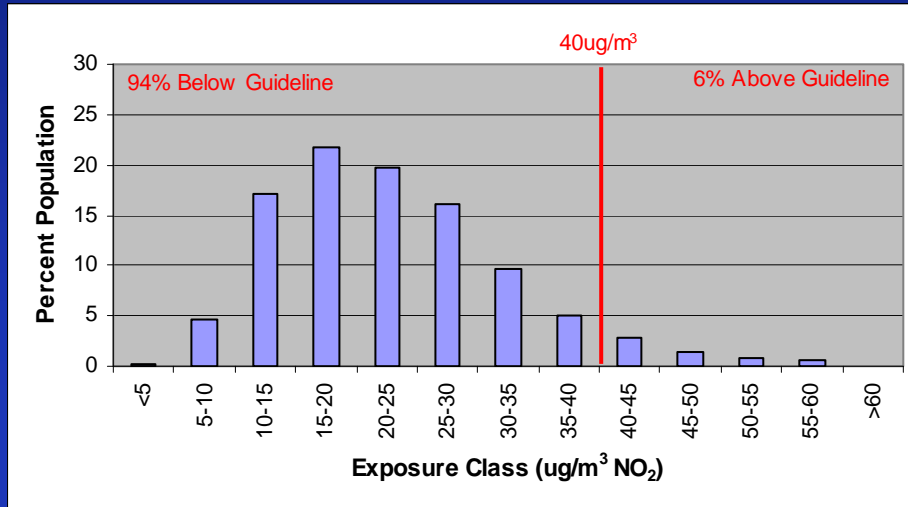


# NO<sub>2</sub> EU-wide

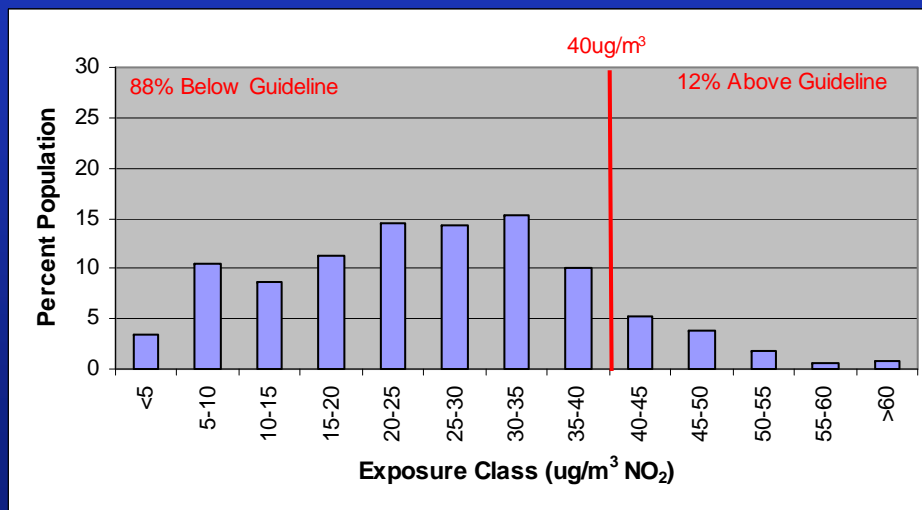


Modelled 2001  
annual mean  
background  
NO<sub>2</sub> Concentrations

# Exposure: EU level

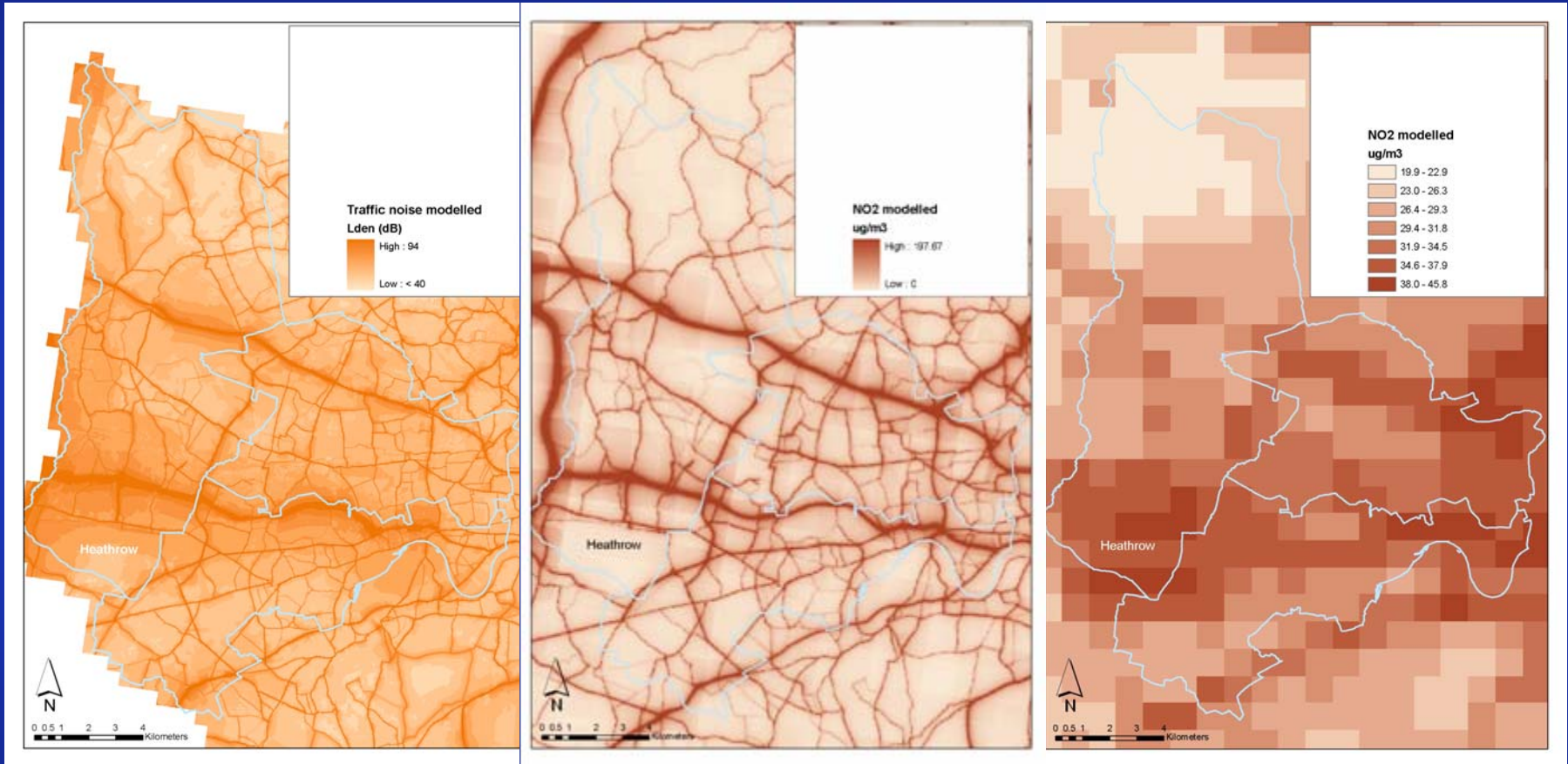


NO<sub>2</sub> – Modelled



NO<sub>2</sub> – Nearest Monitor

# Air and noise pollution

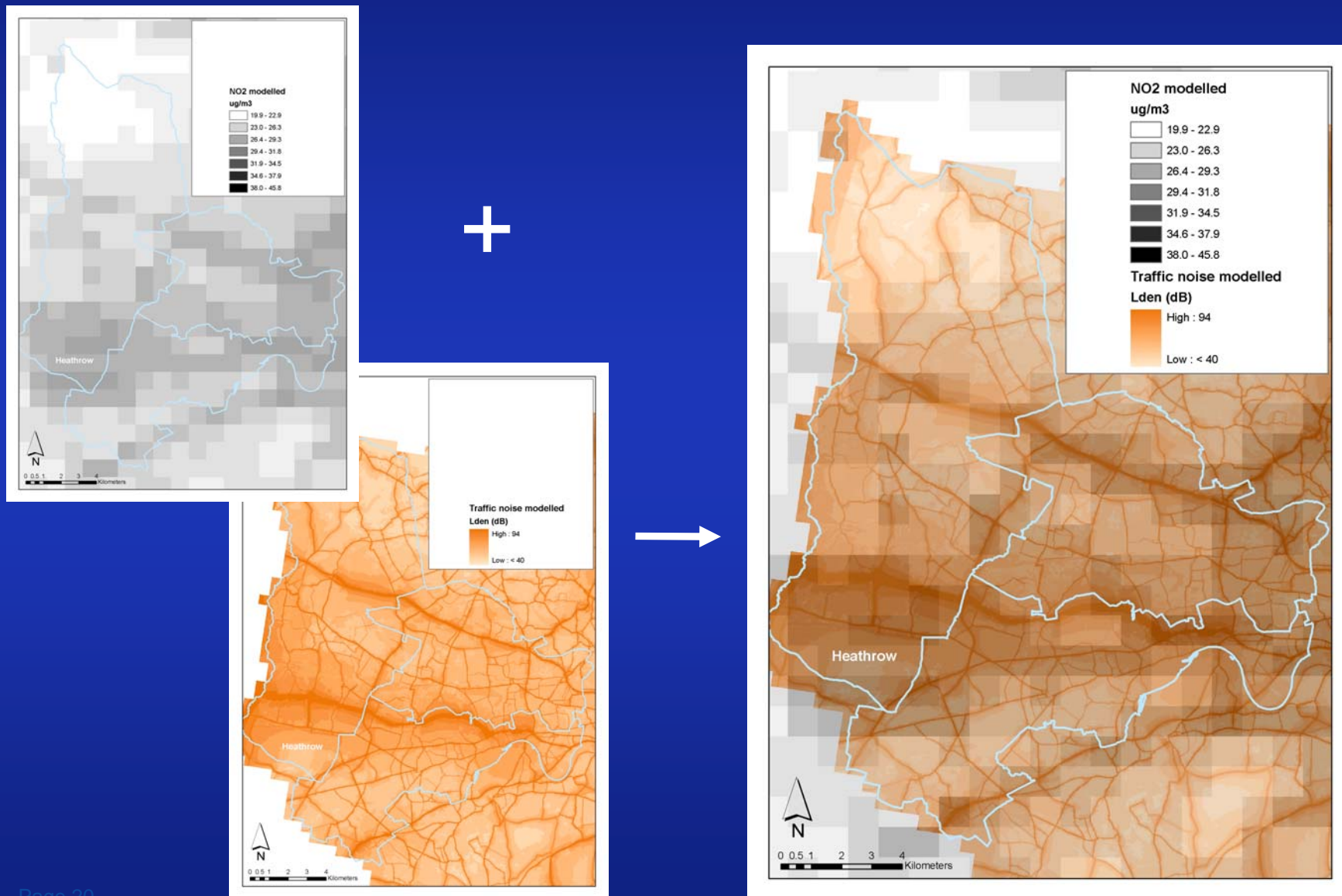


Road traffic Noise  
Lden

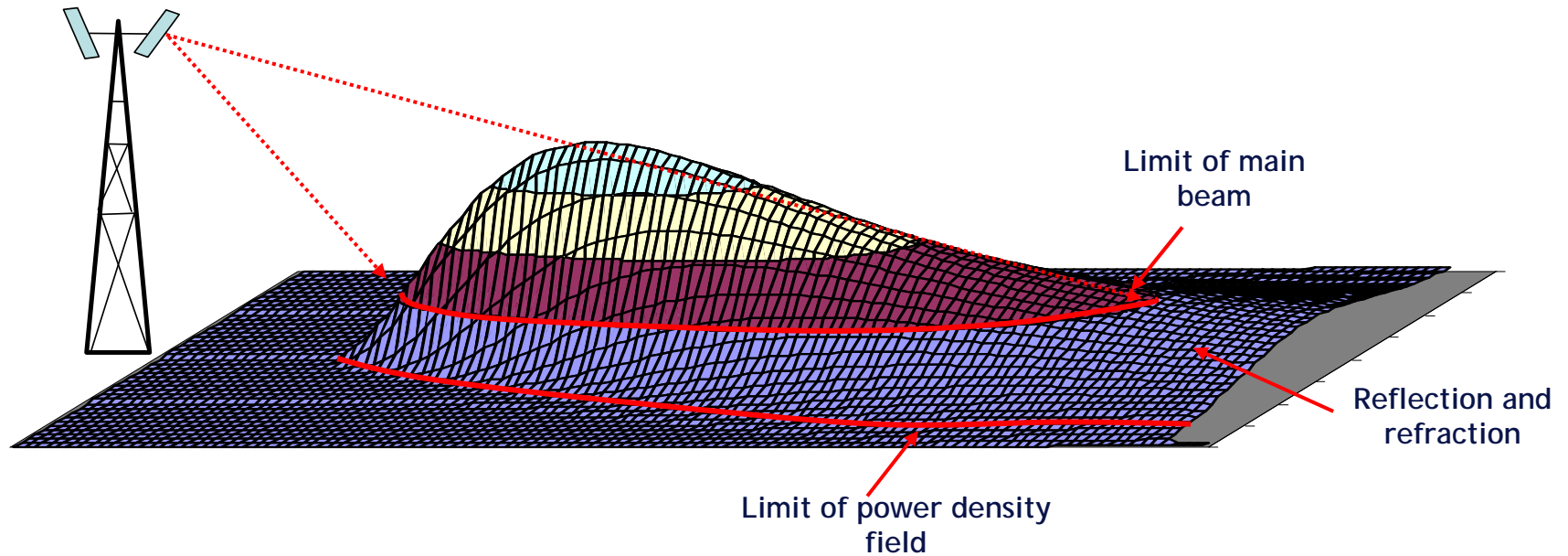
NO2 modelled  
ADMS-Urban

NO2 modelled  
APMoSPHERE

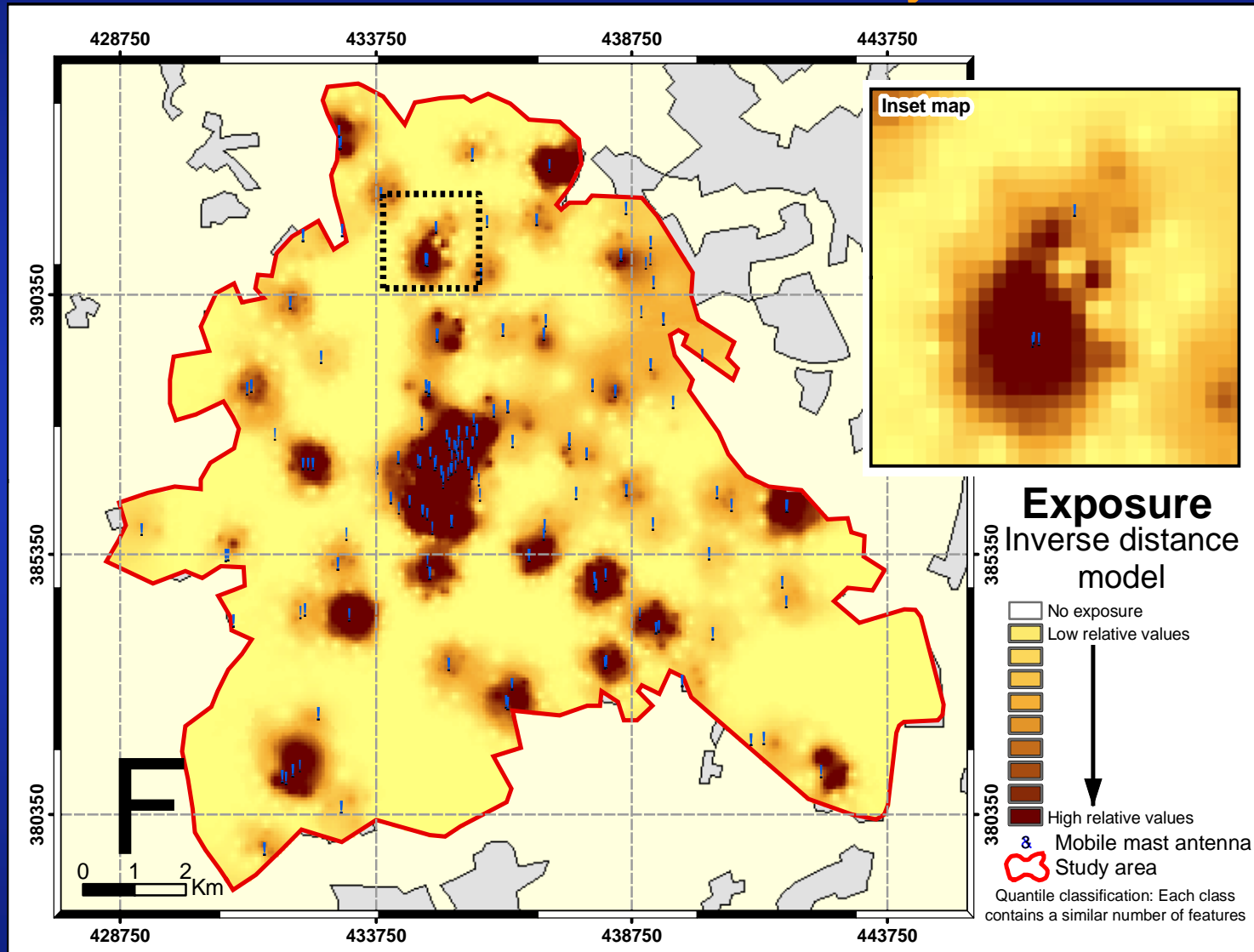
# Noise and air pollution – Heathrow, UK



# EMF exposures around a mobile phone mast



# Modelled EMF: Mobile masts study

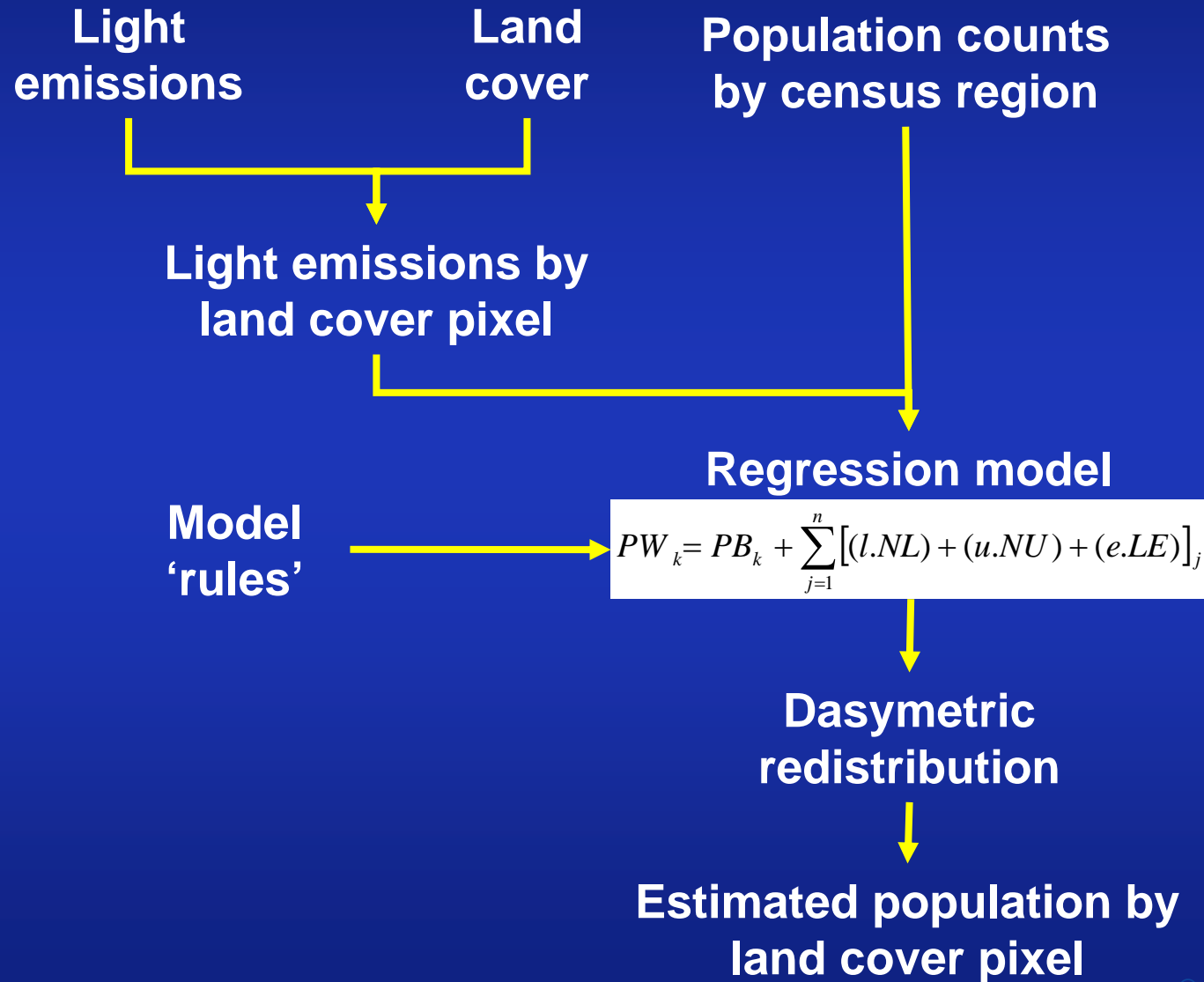


# Population data

- Reliable population data are essential both as a basis for exposure assessment and risk assessment.
- Census data are often available at a relatively detailed level of disaggregation (e.g. ward, census tract), but in many countries census tracts are large, population data are not released, and censuses are unreliable.
- Data are also often needed for geographical zones that do not correspond to administrative boundaries
- Populations change over time – including between censuses

Errors/variations in small-area population counts can create major uncertainties, especially where health events are rare

# Dasymetric Mapping Method

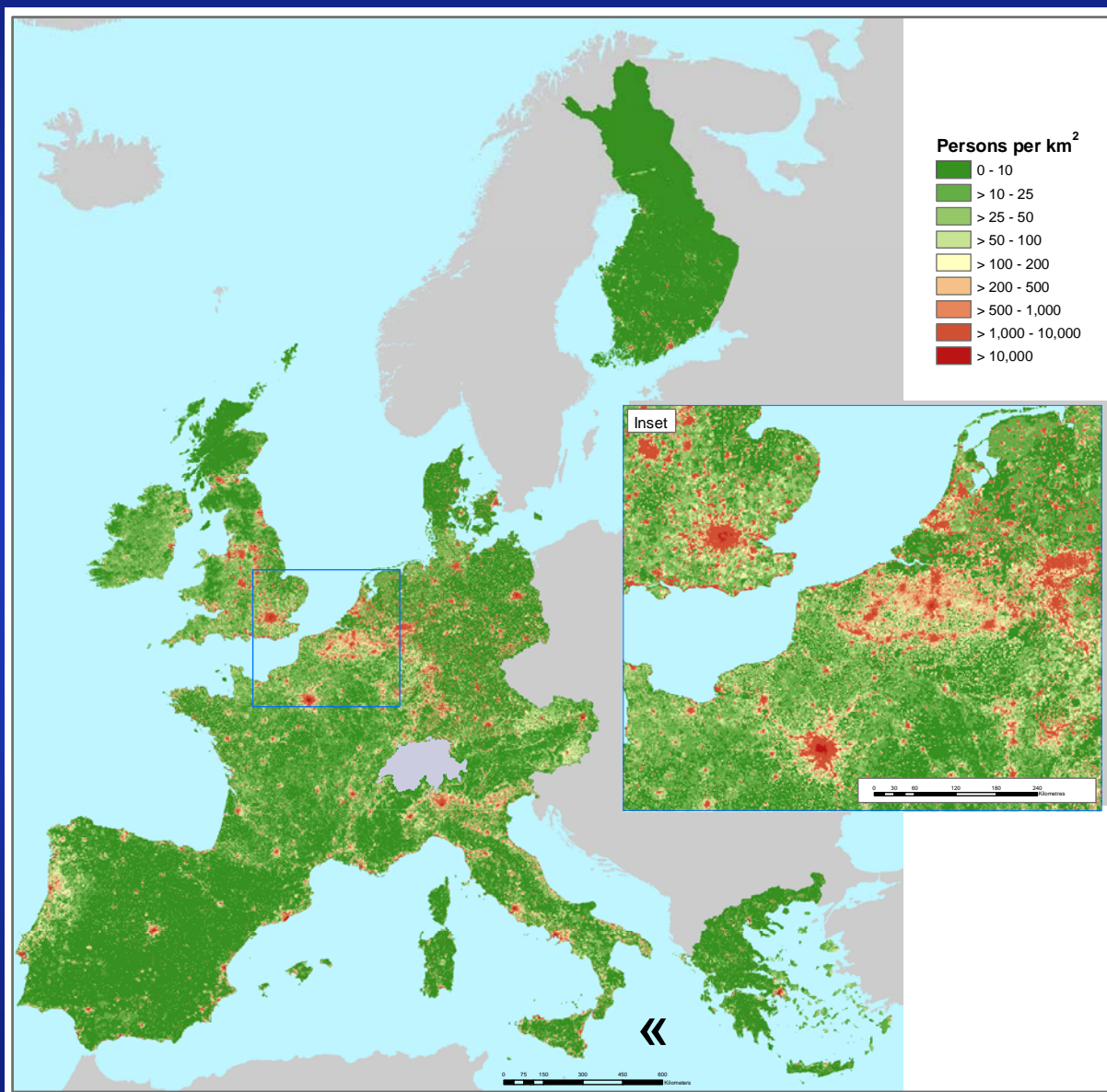




A satellite-style map of Europe at night, showing light emissions from cities and urban areas. The map is dark with numerous bright yellow and white spots representing city lights. The text "Night-time light emissions map of Europe" is overlaid in orange on the right side of the map.

## Night-time light emissions map of Europe

# EU-wide population density map

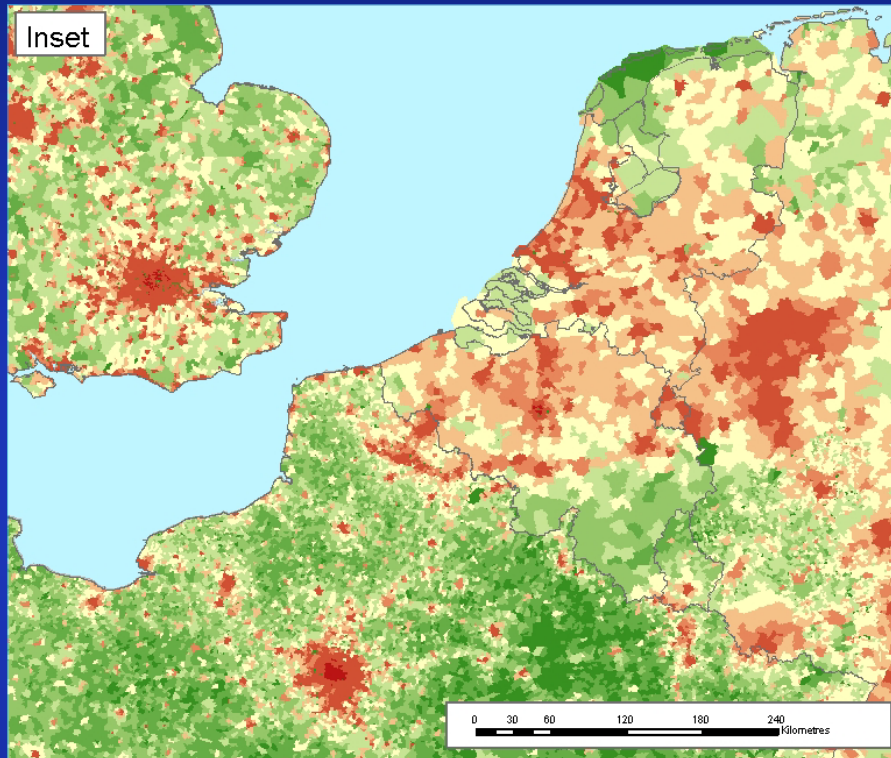


Validated in GB using postcode data for 1991 and 2001.

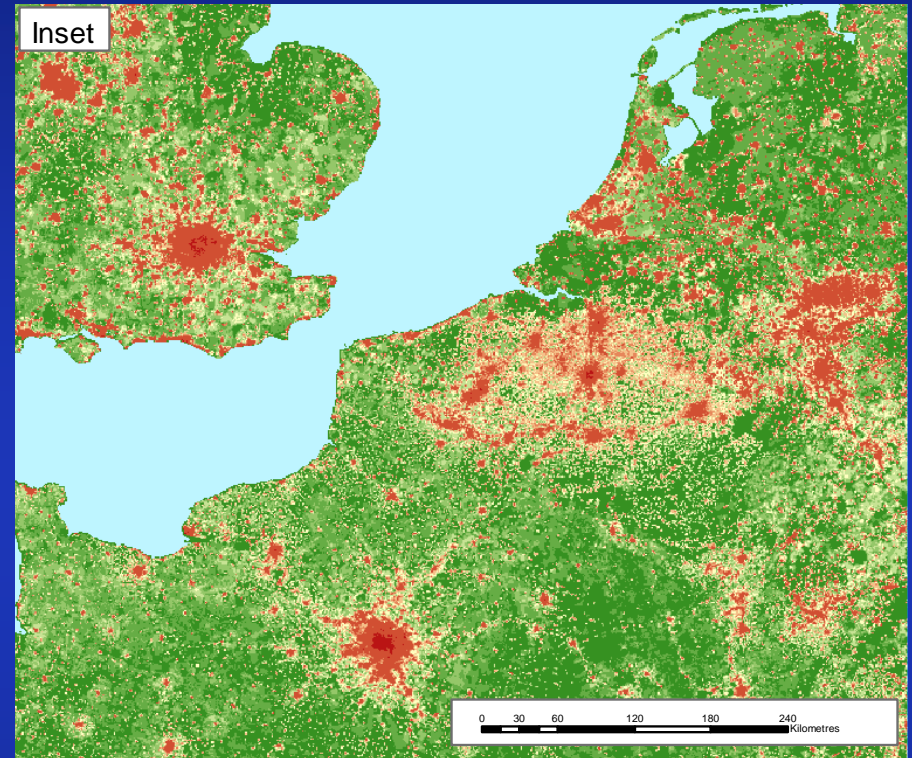
GB Strategy 1:  
 $R^2 = 0.92$  (1991)  
 $R^2 = 0.90$  (2001)

EU Strategy 1:  
 $R^2 = 0.88$  (1991)  
 $R^2 = 0.87$  (2001)

# Population density



NUTS 5

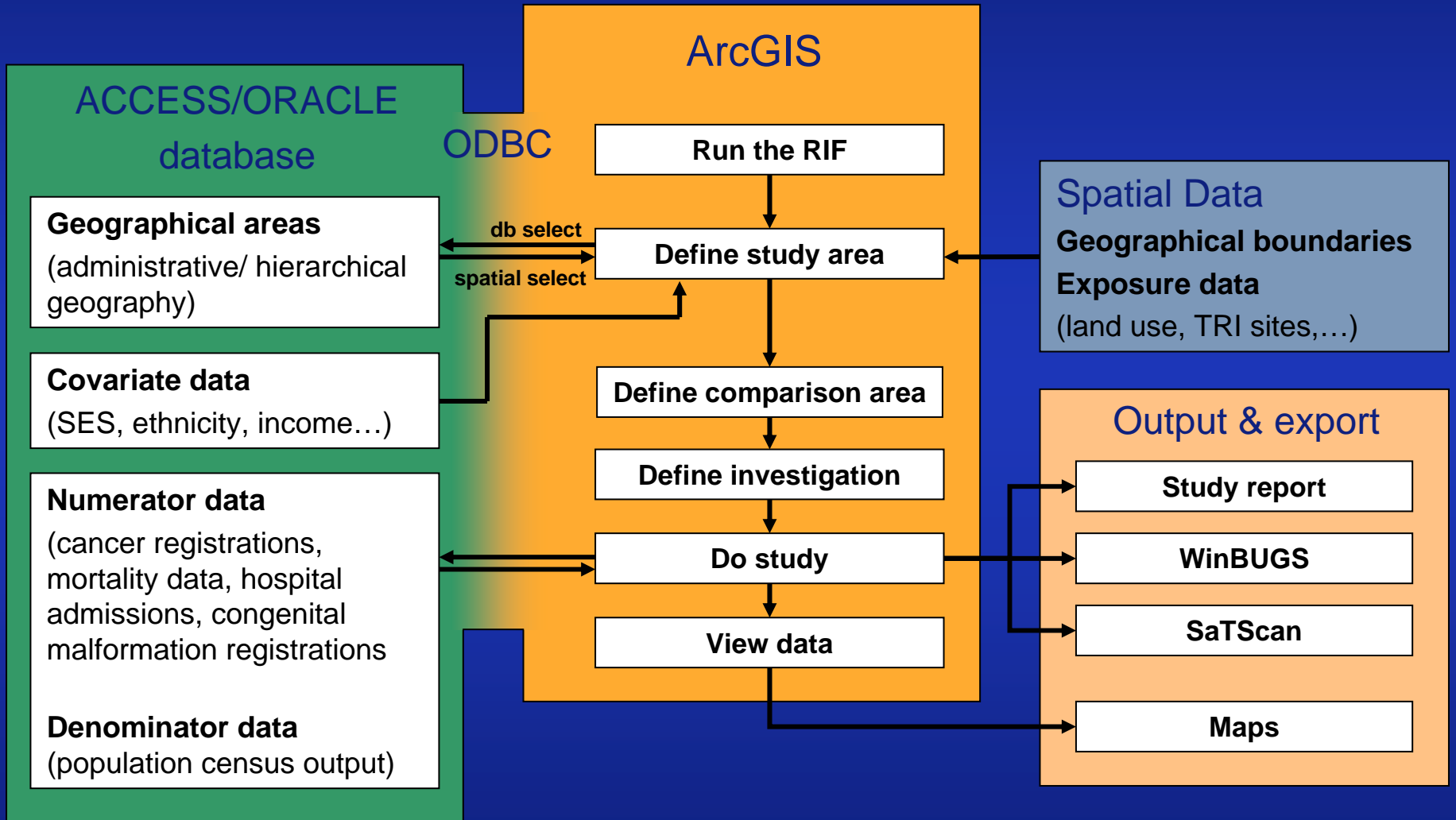


1km

# Linking environmental exposures, health outcomes and risk

- The RIF is a tool that allows users to assess relationships between the environment and health
  - Embedded in ESRI® ArcGIS
  - Links spatial and non-spatial data
  - Risk analysis around putative hazardous sources
  - Disease mapping
- It aims to provide improved understanding of the links between environmental exposures, health outcomes and risk

# Outline of RIF



# RIF analysis

- **Risk exposure analysis** allows assessment as to whether a risk factor has a statistical association with a health outcome in a local population, producing:
  - directly standardised rates and indirectly standardised rate ratios
  - in user defined distance bands around one or more user defined point or area sources
- The **disease mapping** functionality of the RIF allows a user to visualise mortality or morbidity rates and spatial patterns of health outcomes.
  - maps of directly and indirectly standardised rate ratios
  - smoothing of indirectly standardised rate ratios via empirical Bayesian estimation.

# Disease Mapping

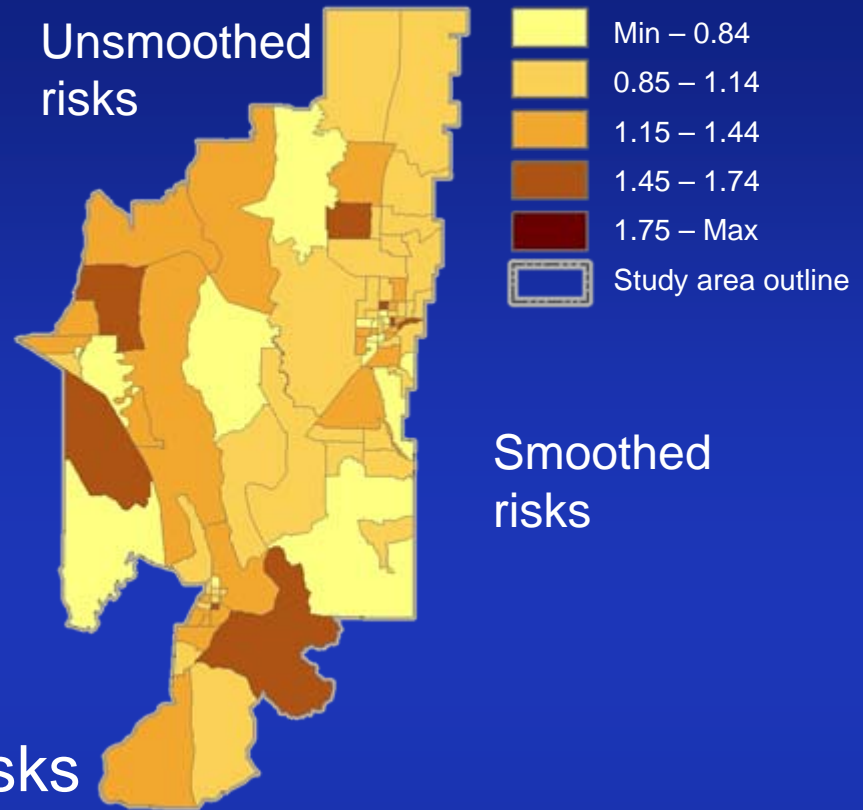
- Small areas/rare diseases... risks become unstable

If  $E=0.2$ ,

risk = 0 if 0 cases observed

risk = 5 if 1 case observed

- Smoothing methods shrink risks towards the global or local average risk
- The higher the uncertainty associated with the risk, the higher its shrinkage

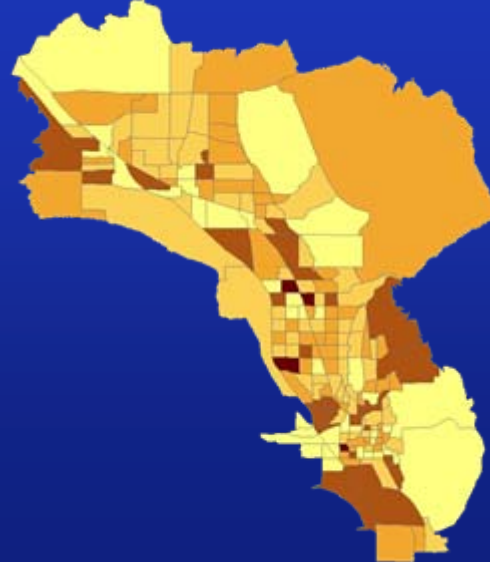


# Risk analysis

- Select on screen or import a shapefile
  - Select points or areas
  - defined distance bands
  - Input output from dispersion models
  - Classify by shapefile attributes



- Select by geographical area e.g. census block group
  - Classify by a covariate





# Data issues

- Data completeness
- Data ascertainment levels
- Measurement errors, reporting errors, detection limits
- Changes in data collection over time
- Timeliness of data
- Appropriateness of data
- Error propagation (errors multiply within studies)

# Exposure and population data issues

- Exposure data :
  - Derived from common methods and datasets across large areas to support large cohort studies
  - Consistent and high-resolution to support epidemiological research and facilitate comparison across e.g. the EU, USA etc
- Population data
  - Adequacy of population data will be dependant on:
    - Errors, Specificity (who are the targets?), Timeliness
  - Scale and generalisation
    - Individual versus area, small number problems
  - Population mobility
    - Is place of residence an adequate basis for exposure modelling and health mapping? Past exposures and past locations (latency)

# Conclusions

- Data availability and quality are crucial limitations
- Designing valid spatial epidemiological and public health studies needs care
- Spatial representation is usually the decision of the analyst, not an inherent characteristic of the feature
- Computing does not equal accuracy
- Errors can occur at any stage in a project and may relate to different factors
- The way data is mapped can mask, amplify or compound errors arising from data use/mis-use
  - “a good map of bad data looks better than a bad map of good data”
  - We need good data and valid methods to produce good maps

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# Literature

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- Jarup L; Best N; Toledano MB; Wakefield J; Elliott P. (2002) Geographical epidemiology of prostate cancer in Great Britain. *Int J Cancer*. 97: 695-699
- Jarup L; Briggs D; de Hoogh C; Morris S; Hurt C; Lewin A; Maitland I; Richardson S; Wakefield J; Elliott P. (2002) Cancer risks in populations living near landfill sites in Great Britain. *Br J Cancer*. 86: 1732-1736
- Briggs D, Gulliver J, Fecht D, Vienneau D, (2007), Dasymetric modelling of small-area population distribution using land cover and light emissions data, *Remote sensing of Environment* (*in press*)

# Extra slides

# The GEMS Project

## 1. Background

- EU funded project; started March 2005; ends March 2009
- Aim is to test and evaluate the use of Earth Observation data for environmental and health applications

## 2. Methods

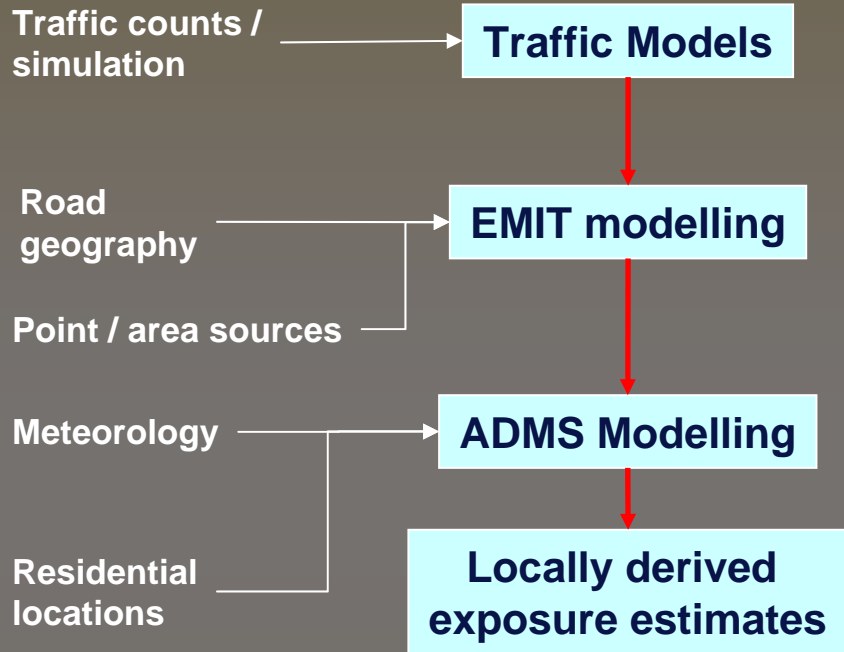
- Case-crossover design to examine associations between air pollution/temperature and mortality during major episodes (2003) compared with synoptically matched control periods in 2002
- Air pollution initially being modelled on basis of local dispersion models + long-range models (informed by weather data from satellites)
- Later analysis to attempt to use direct observations of air pollution from satellites
- Future work aimed at exploring capability to predict health impacts of impending air pollution episodes (as early warning for public and health services) – e.g. 3-5 days in advance

## 3. Issues/problems

- Poor resolution of satellite data both horizontally and vertically (integration through deep column of atmosphere)
- Interactions between local and long-range components of PM mix, and with temperature?
- Complex patterns of health effects during long episodes due to harvesting, adaptation (e.g. medication use, change in behaviour patterns)

# GEMS UK health study

## Locally derived PM modelling



## Long-range PM modelling

