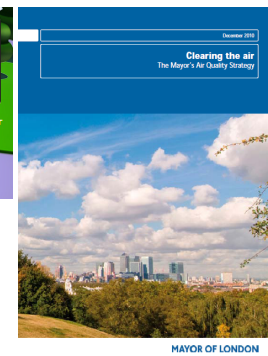


# Modelling human exposure: present and future

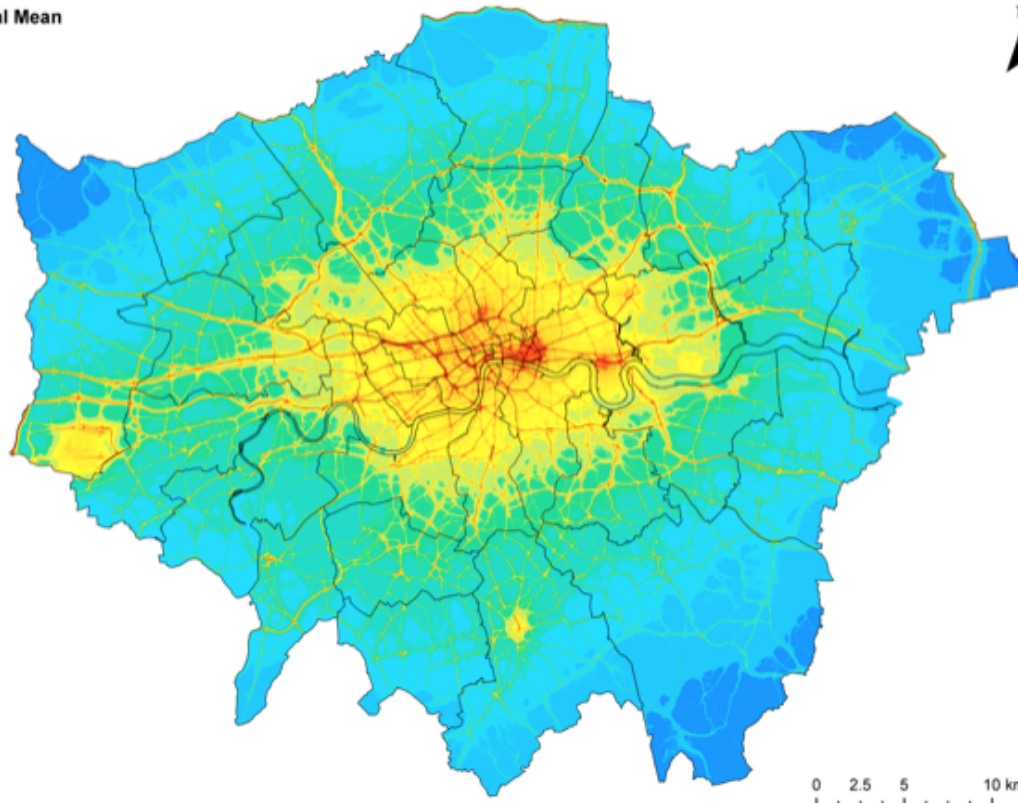
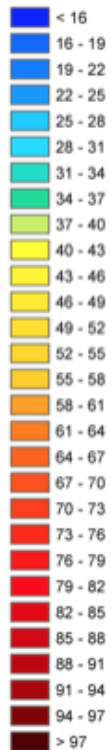
Sean Beevers  
King's College London

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# Local scale modelling



2008 NO<sub>2</sub> Annual Mean (µg m<sup>-3</sup>)



## Sources

- Road transport
- Aviation sources
- Passenger and commercial shipping
- Passenger and freight rail
- Large regulated industrial processes (Part A)
- Small regulated industrial processes (Part B)
- Gas heating (domestic and industrial-commercial)
- Oil combustion sources (domestic and large boiler plant), Coal combustion sources (domestic and commercial)
- Construction source (NRMM, construction/demolition)
- Others (agricultural, landfill, waste transfer, accidental fires and household sources)
- Biomass burning

London air quality model results - <http://data.london.gov.uk/laei-2008>

Uses:

Congestion charging, Low Emissions Zones, Mayor's Air Quality Strategy

(<http://www.london.gov.uk/sites/default/files/Air%20Quality%20Strategy%20v3.pdf>)

Epidemiological research and Health Impact assessments

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# Present: Static approach to exposure assessment



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# Future: Hybrid approach to exposure assessment



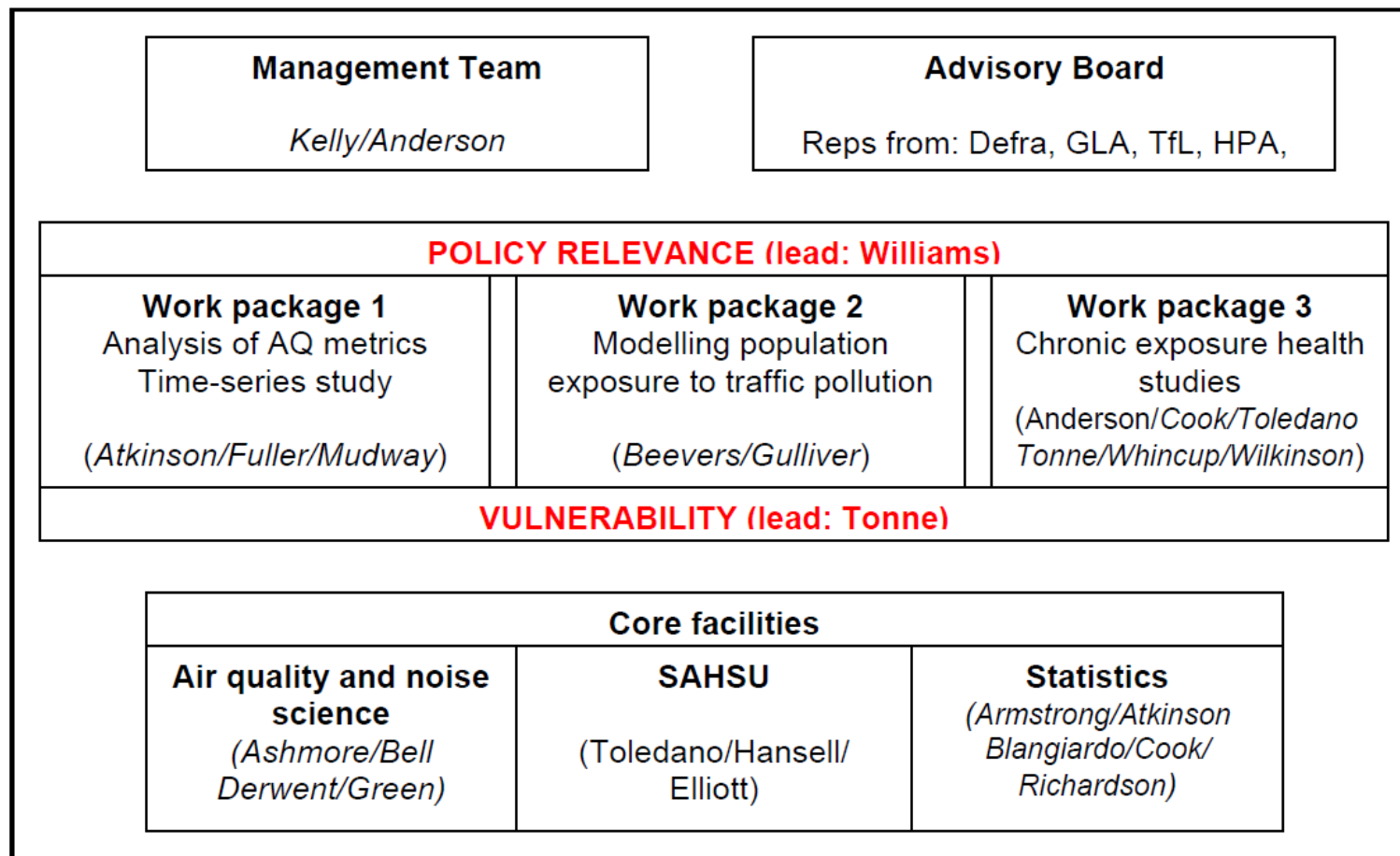
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# Static and Hybrid approaches to exposure assessment



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# Traffic Pollution and Health in London project



<http://www.erg.kcl.ac.uk/ResearchProjects/Traffic/Default.aspx?DeptID=ResearchProjects&CategoryID=ResearchProjectsTraffic>

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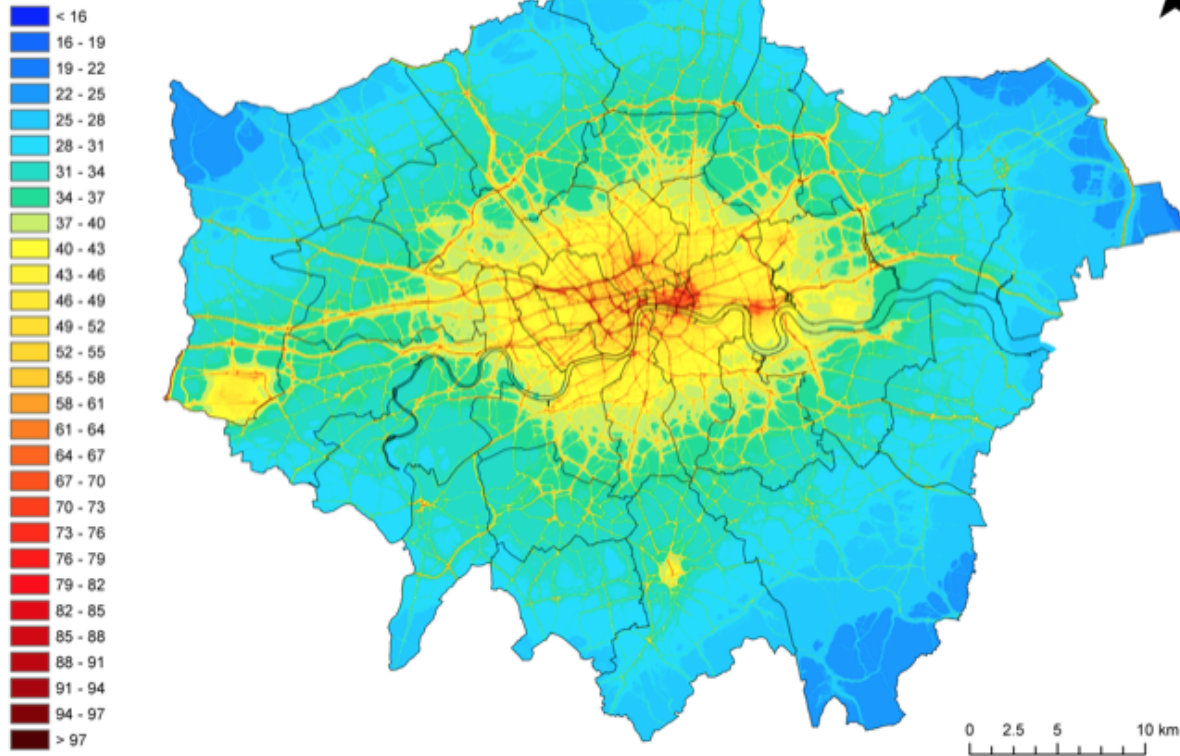


# Static modelling for “Traffic”

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# Local scale modelling

2008 NO<sub>2</sub> Annual Mean  
( $\mu\text{g m}^{-3}$ )



## Epidemiology:

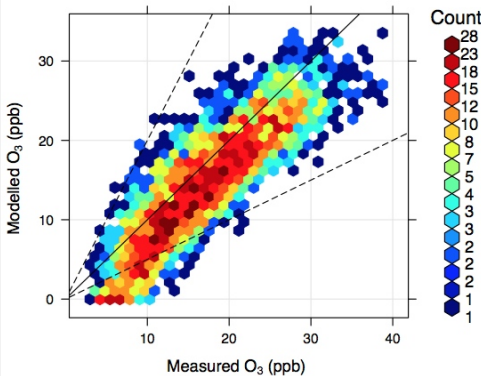
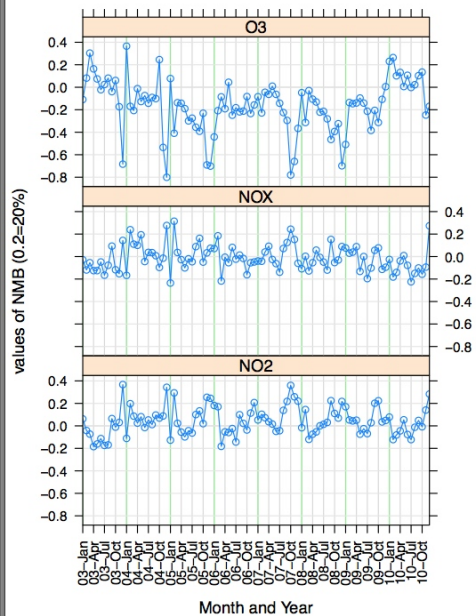
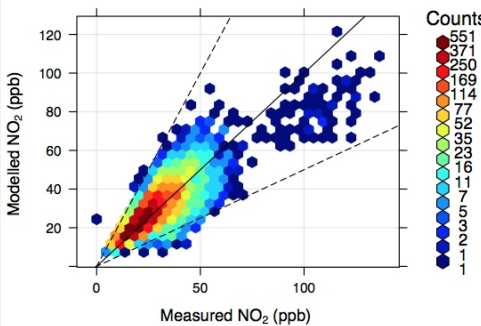
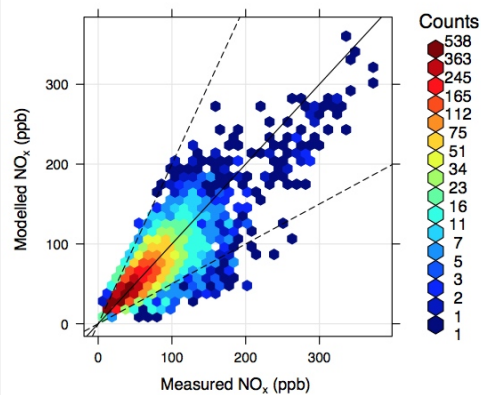
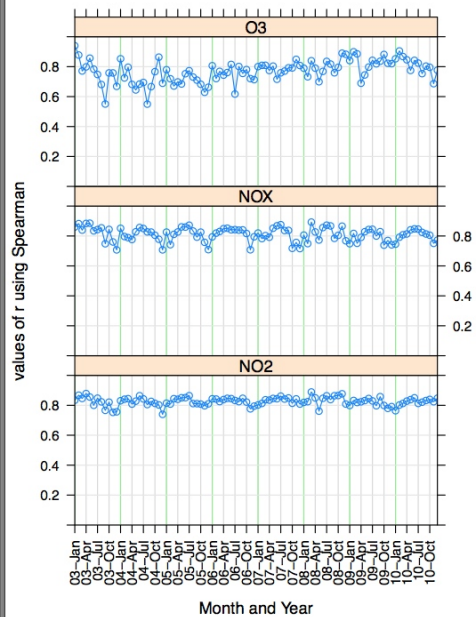
As part of the “Traffic” air quality modelling predictions (2003 – 2010) being used to investigate spatio-temporally a range of health outcomes including:

Child lung function and cardiovascular risk markers, primary care consultations, adverse reproductive outcomes, hospital admissions, acute coronary syndrome and mortality.

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Monthly values of r and normalised mean bias (NMB) for NOx, NO2 and O3 – All Sites



# Monthly Model Evaluation

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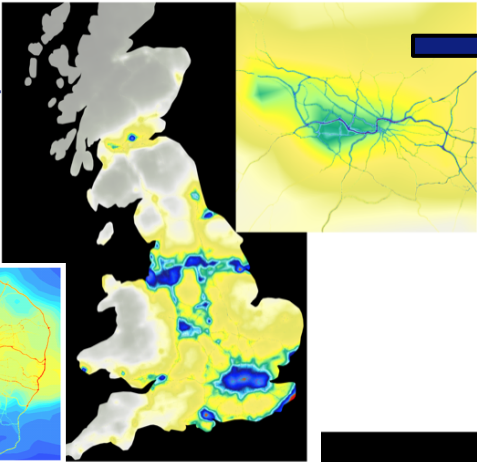
# Hybrid modelling for “Traffic”

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# Hybrid exposure model

CMAQ-urban air quality model

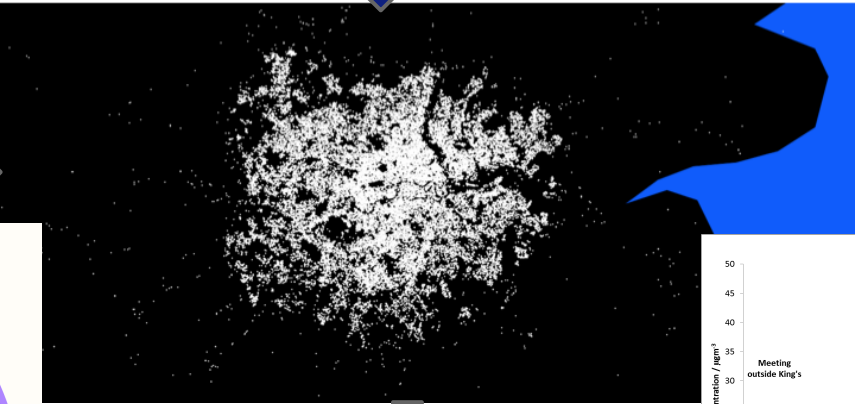
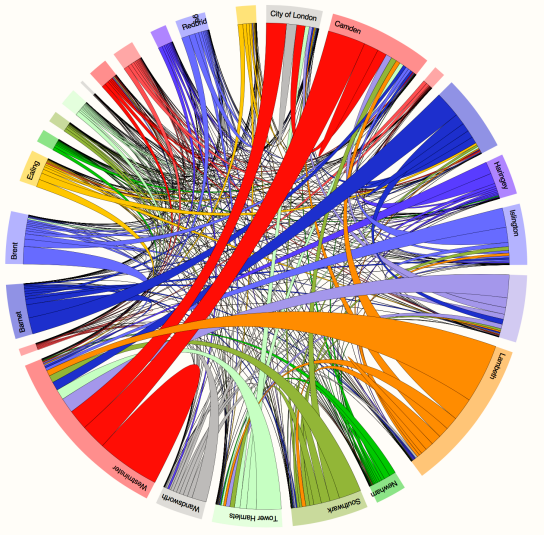


Micro-environmental modelling: in-vehicle (bus, car, train, tube), cycle, walk, indoors (I/O exchange)

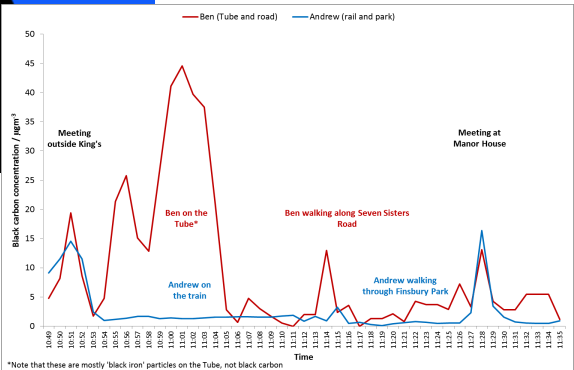
$$\frac{dC_{in}}{dt} = \lambda_{win}(C_{out} - C_{in}) - n\lambda_{HVAC}C_{in} - V_g \left(\frac{A}{V}\right) C_{in} + \frac{Q}{V}$$

London Travel Demand Survey: Trips by transport mode: Sex, age, gender and socio-economic status

Oyster card data

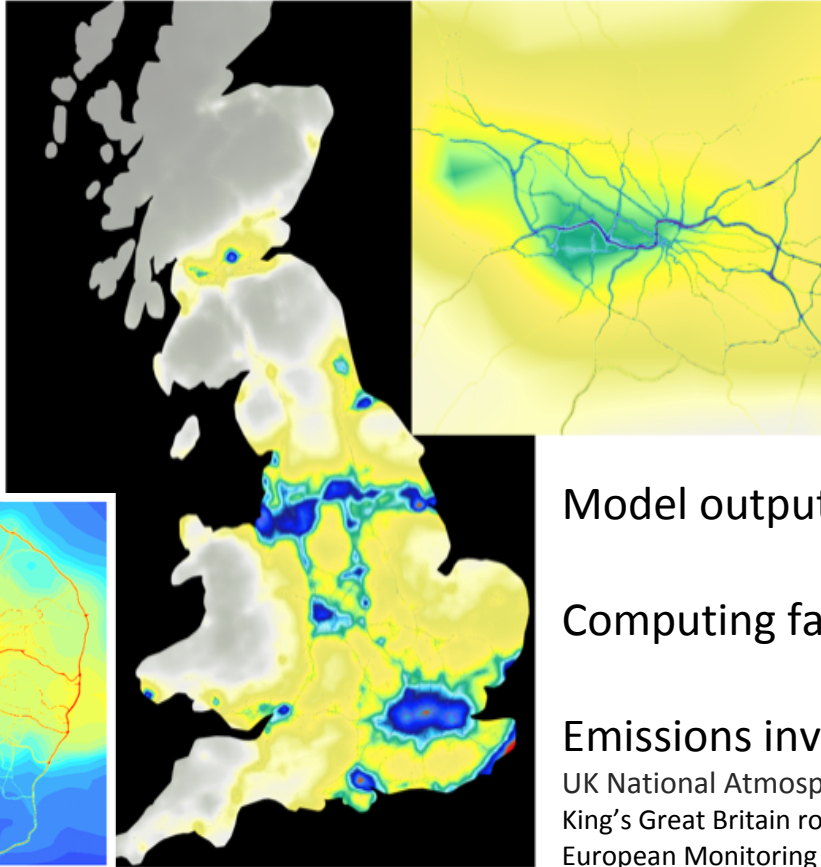


Detailed human exposure



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# Coupled local/regional scale modelling (CMAQ-urban)



Model outputs: NO<sub>x</sub>, NO<sub>2</sub>, O<sub>3</sub>, PM components

Computing facilities.....you can't have enough

## Emissions inventories

UK National Atmospheric Emissions Inventory (NAEI)

King's Great Britain road traffic emissions

European Monitoring and Evaluation Programme (EMEP, <http://www.ceip.at/>)

European Pollutant Release and Transfer Register (EPRTTR)

Biogenic Emission Inventory System (BEIS v3.14) VOC and soil NO

Eclipse - IIASA

Beevers SD, Kitwiroon N, Williams ML, Carslaw DC. 2012. One way coupling of CMAQ and a road source dispersion model for fine scale air pollution predictions. Atmospheric Environment 59, pp 47-58

## Boundary conditions

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# The London Travel Demand Survey (LTDS) from TfL – it's anonymised

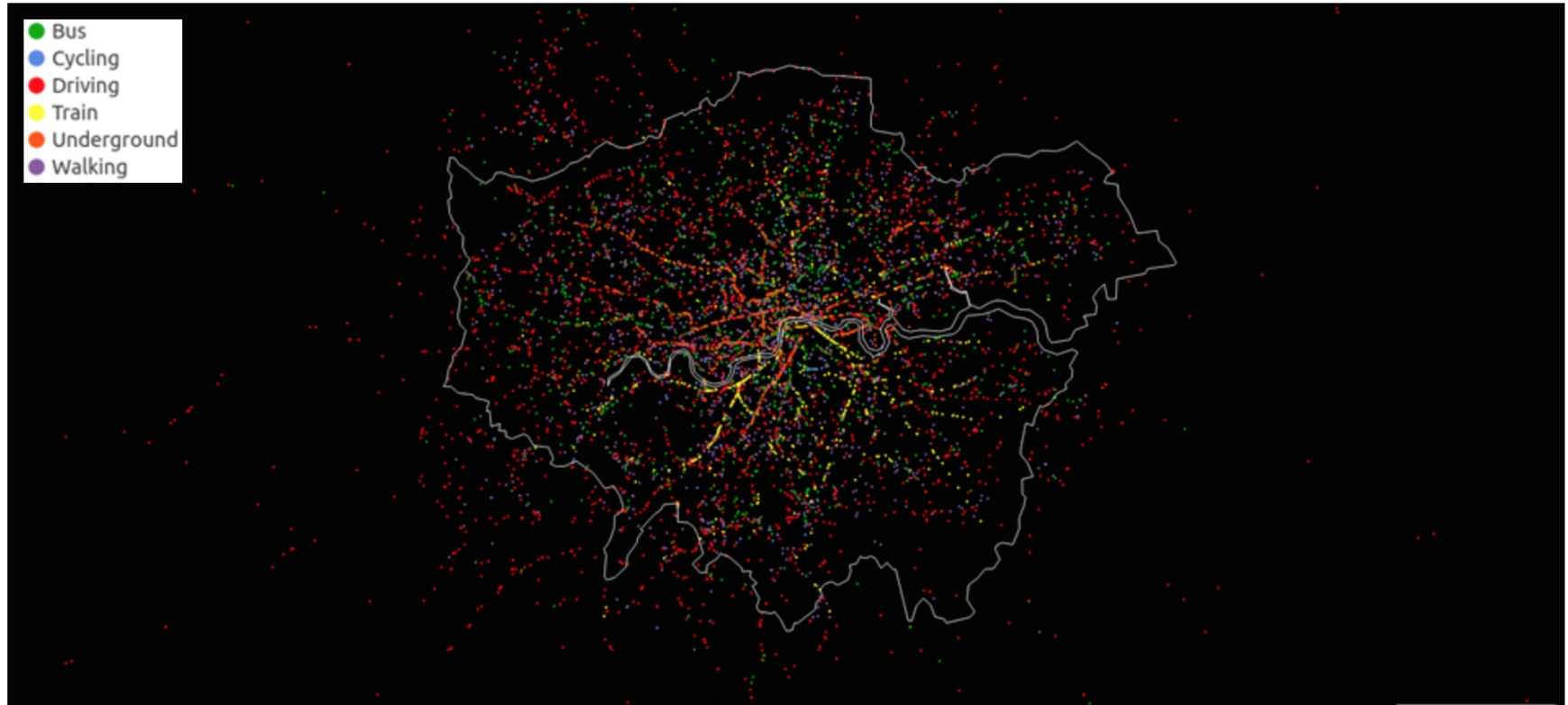
Using the LTDS however, we have data on 85,000 people journeys for 24 hours

2005/2006	5008 households, 11583 people, 29,797 trips, 61,542 stages
2006/2007	8005 households, 18241 people, 47,029 trips, 95,930 stages
2007/2008	7873 households, 17926 people, 44,828 trips, 91,967 stages
2008/2009	8134 households, 18975 people, 43,076 trips, 89,701 stages
2009/2010	8290 households, 19187 people, 43,475 trips, 92,121 stages
2010/2011	Will get data soon
2011/2012	Will get data soon

Lots of data (!)

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# London journeys



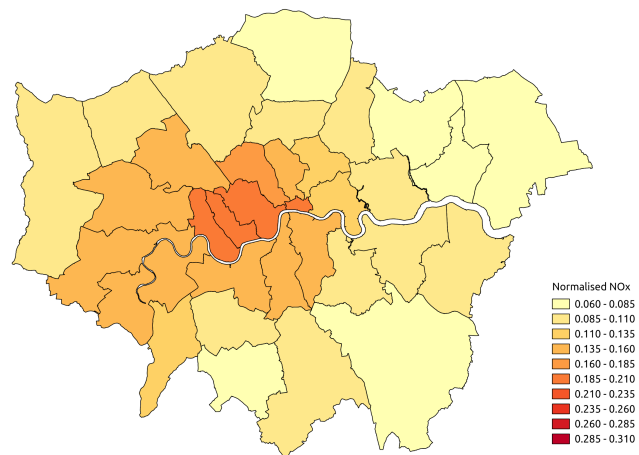
Location of Londoners on a typical day as at **0816**



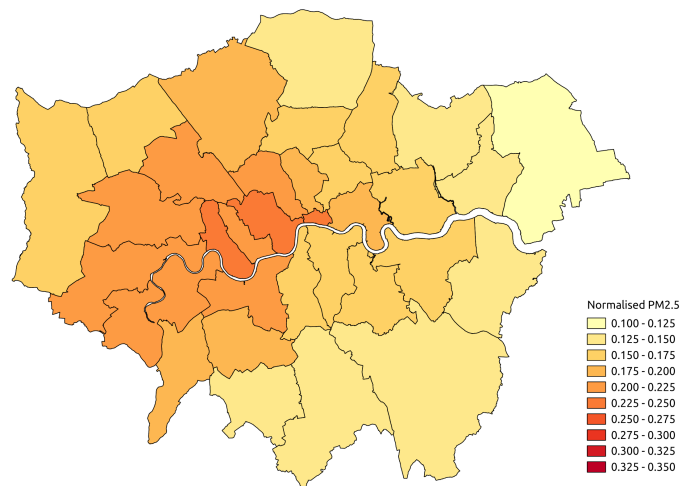
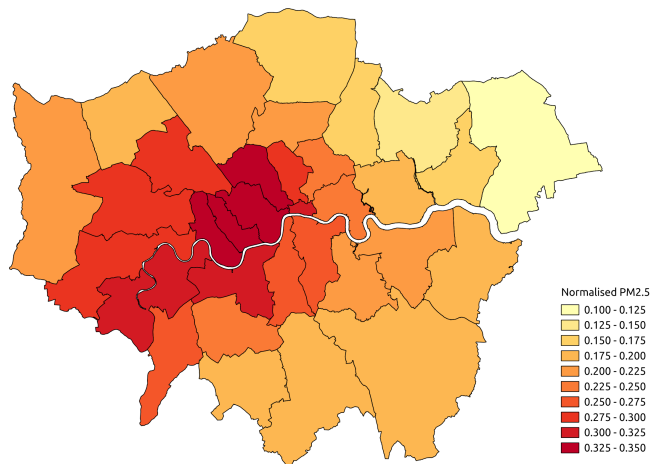
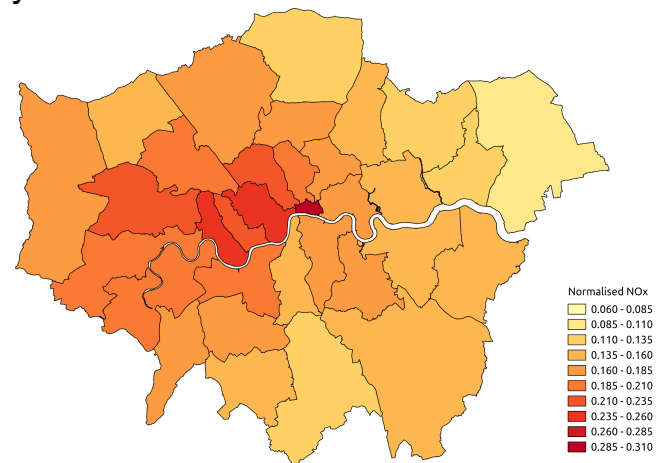
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# Geographic exposure to NO<sub>x</sub> (top) and PM<sub>2.5</sub> (bottom)

Static model

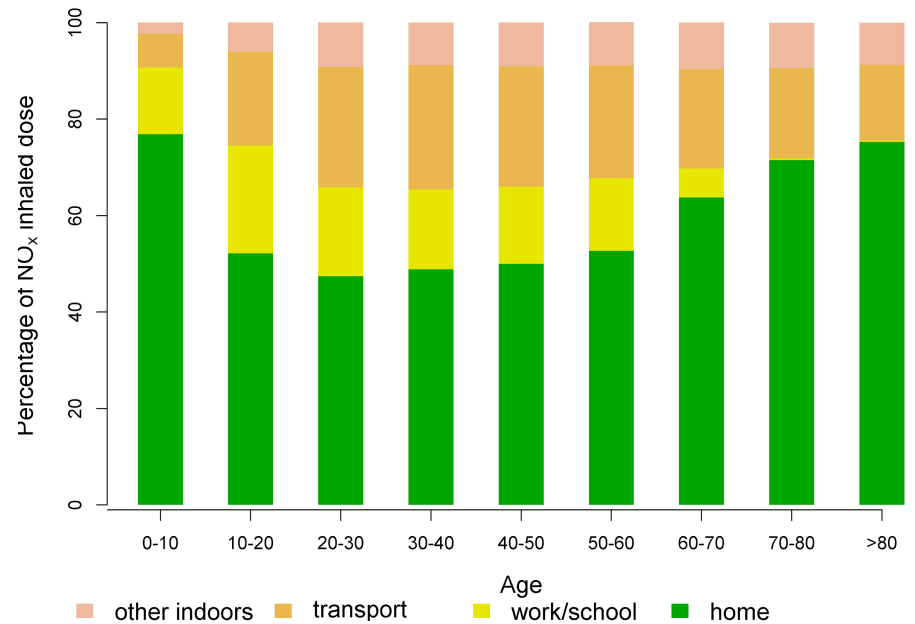
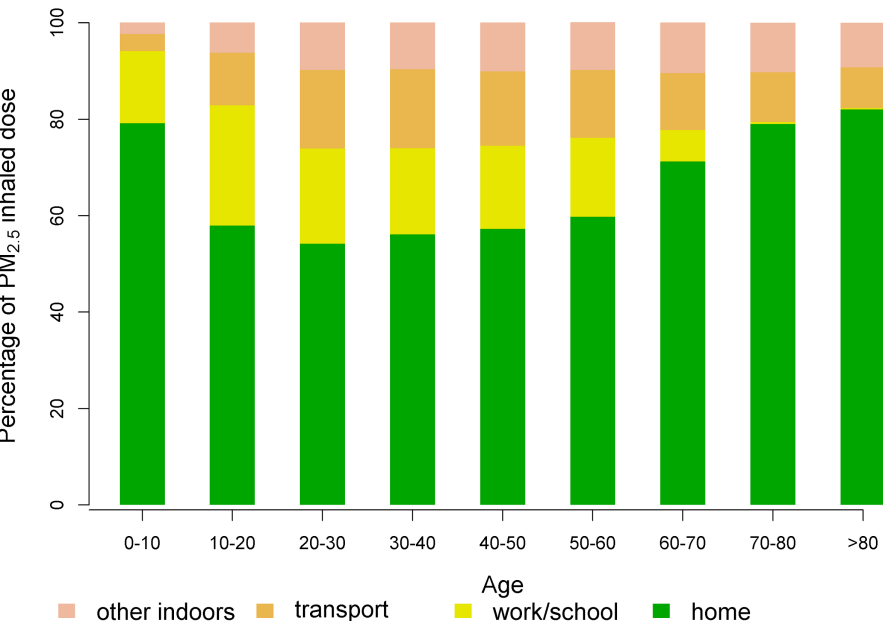


Hybrid model



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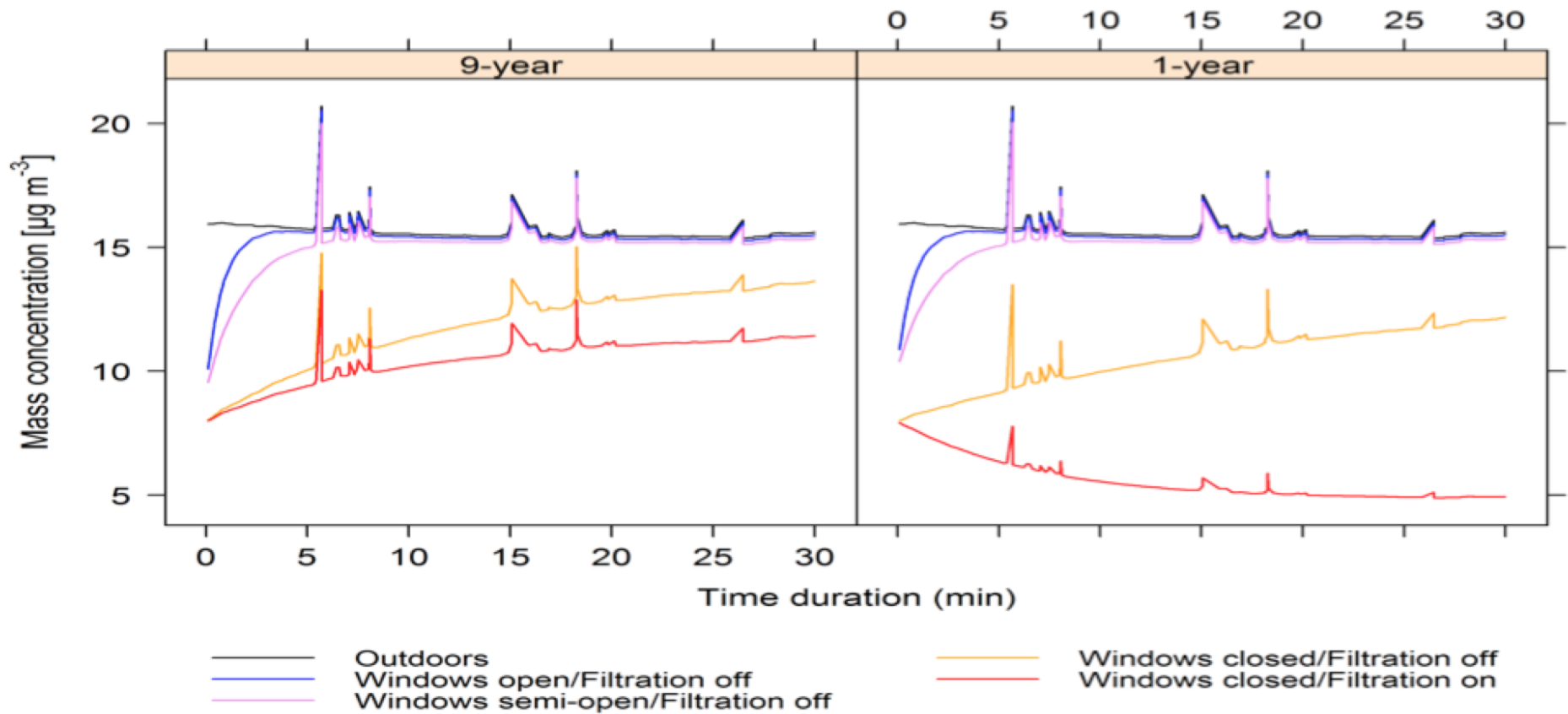
# NO<sub>x</sub> and PM<sub>2.5</sub> Dose by age group



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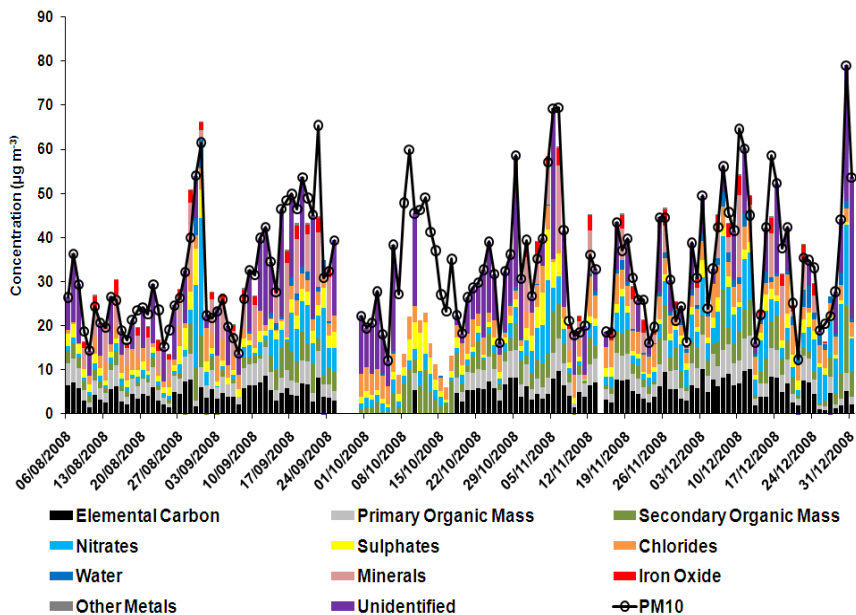


# In-car PM<sub>2.5</sub> results



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# CMAQ-urban Model evaluation

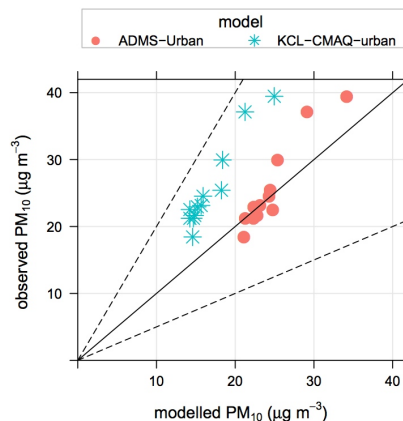


PM components (nitrate, sulphate, organic aerosol etc)

Underestimates PM

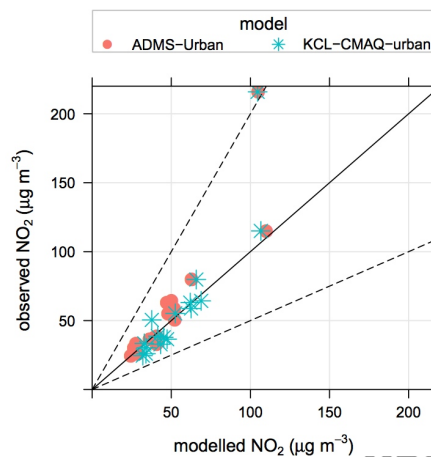
NO<sub>x</sub> - NO<sub>2</sub> - O<sub>3</sub> reasonably well predicted

## PM<sub>10</sub> (top) and NO<sub>2</sub> (bottom)



Performance of ADMS-Urban and KCL CMAQ-Urban for PM<sub>10</sub>

variable	ADMS-Urban	KCL-CMAQ-urban
n	91735.00	95973.00
FAC2	0.88	0.64
MB	-0.48	-8.68
MGE	8.35	11.09
NMB	-0.02	-0.34
NMGE	0.33	0.43
RMSE	13.12	15.91
r	0.63	0.62
COE	0.30	0.10



Performance of ADMS-Urban and KCL CMAQ-Urban for NO<sub>2</sub>

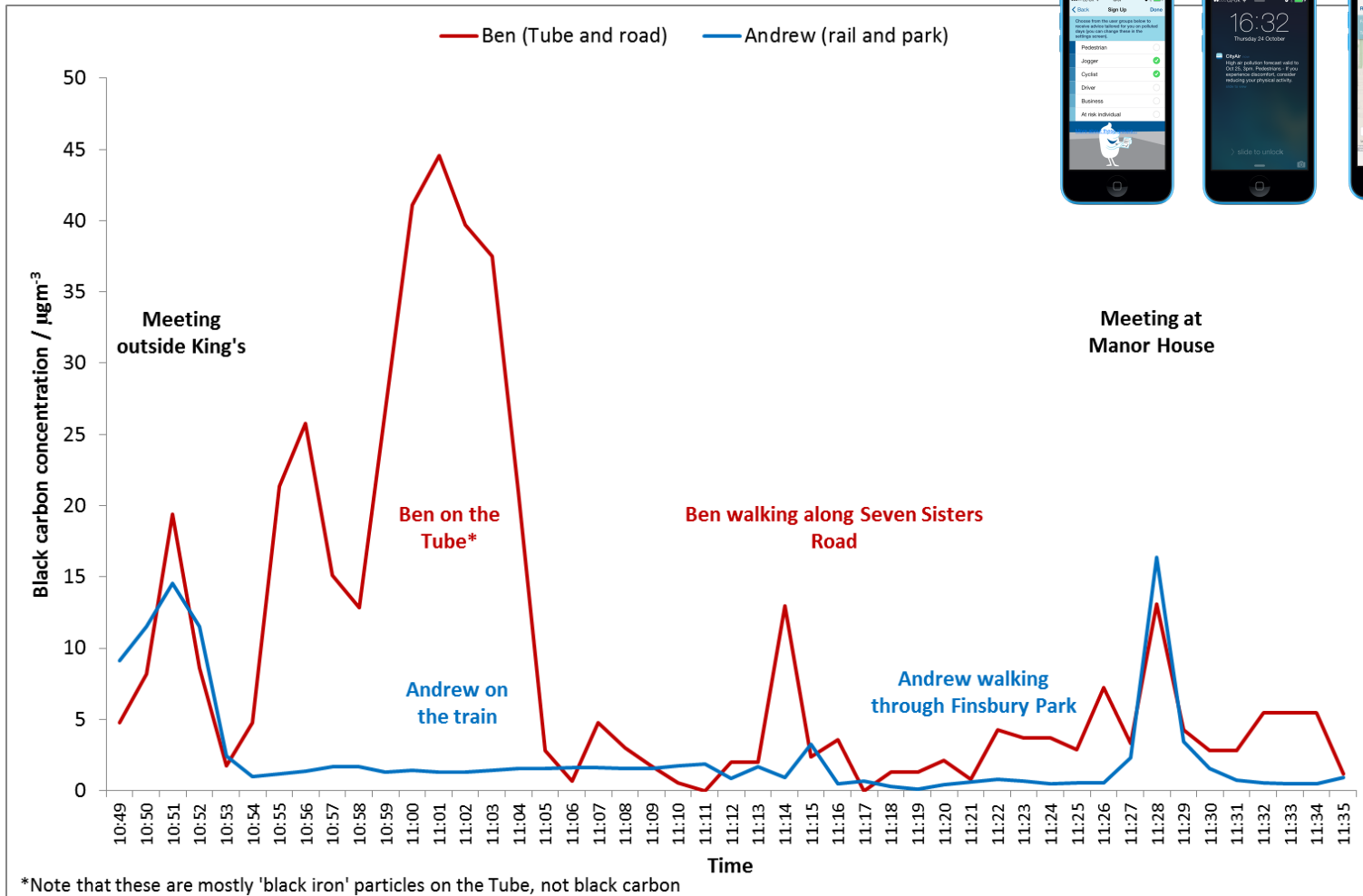
variable	ADMS-Urban	KCL-CMAQ-urban
n	127477.00	133115.00
FAC2	0.81	0.81
MB	-9.84	-5.36
MGE	23.41	23.53
NMB	-0.17	-0.09
NMGE	0.39	0.39
RMSE	43.45	43.68
r	0.71	0.69
COE	0.38	0.38

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[http://uk-air.defra.gov.uk/assets/documents/reports/cat20/1312021020\\_131031urbanPhase2.pdf](http://uk-air.defra.gov.uk/assets/documents/reports/cat20/1312021020_131031urbanPhase2.pdf)

# Exposure measurements

<http://www.londonair.org.uk/london/asp/news.asp?NewsId=CityAirpressrelease>



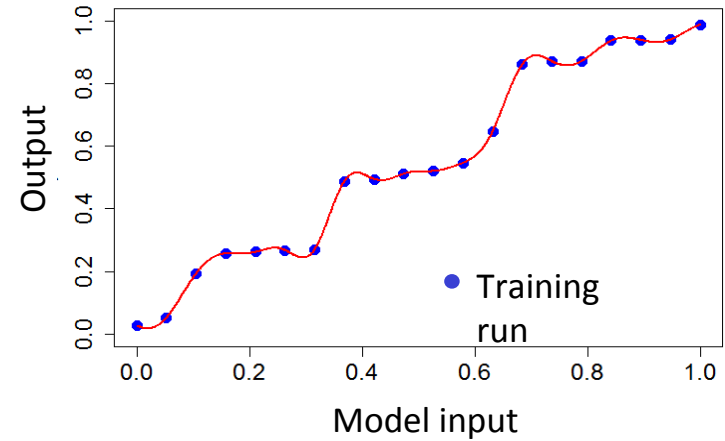
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# Uncertainty Analysis in Atmospheric modelling

Quantifying model uncertainty becomes prohibitive for models with long run times.

Reduce the number of parameters through sensitivity analysis (214 to 31)

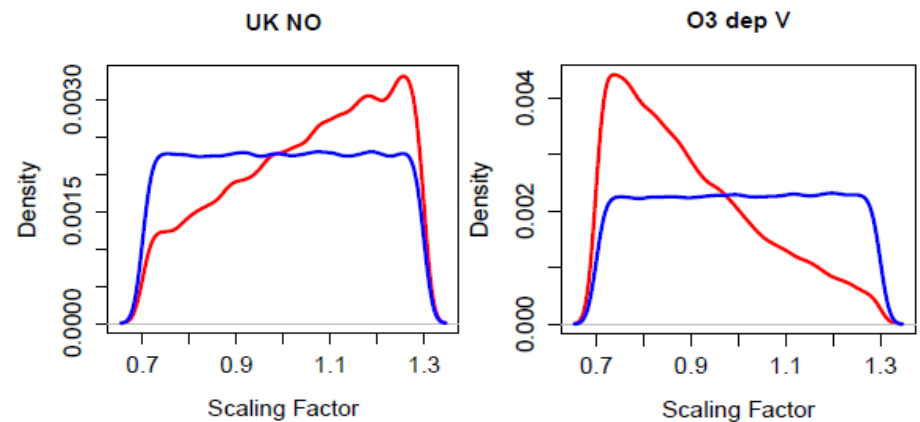
Our solution is to build an 'emulator'



## Bayesian Calibration

Each Monte Carlo run is weighted according to its probability of corresponding to observational data

This shifts the mean of the uncertainty distribution towards the observed value and reduces its standard deviation



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# National Institute for Health Research (NIHR)

Public health air pollution impacts of different pathways to meet the UK Climate Change Act commitment to 80% reduction of CO<sub>2</sub> and other greenhouse gas emissions by 2050

- Based on NAEI and DECC carbon budget forecasts (2030)
- Predict to 2050
- Use CMAQ-urban and met. office HadGem future met. predictions
- Look at human exposure and health costs of future scenarios (using hybrid model)

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# The future....

**Indoor model** - important addition to the current hybrid model

**Model evaluation** - MRC funded project, Characterising COPD Exacerbations using Environmental Exposure Modelling (COPE) project

**Uncertainty** of the hybrid approach

Develop **sources** within the model that are currently poorly understood - non-exhaust emissions, biomass burning, cooking etc

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# Thanks for your attention...

Thanks to colleagues ERG modelling:

Nutthida Kitwiroon, David Dajnak, Andrew Beddows, Christina Mitsakou, James Smith and Gregor Stewart

London Boroughs, Transport for London, DEFRA and the Greater London Authority

We thank the Natural Environment Research Council, Medical Research Council, Economic and Social Research Council, Department of Environment, Food and Rural Affairs and Department of Health for the funding received for the Traffic Pollution and Health in London project (NE/I008039/1), funded through the Environmental Exposures and Health Initiative (EEHI). The research was also supported by the National Institute for Health Research (NIHR) Biomedical Research Centre based at Guy's and St Thomas' NHS Foundation Trust and King's College London.

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