

# Anthropogenic and biogenic carbon dispersion in urban environment: a case study in London

Linfeng Li  
([l.li20@imperial.ac.uk](mailto:l.li20@imperial.ac.uk))  
Jie Zheng, Fangxin Fang

AI4Urban  
Department of Earth Science and Engineering  
Imperial College London

# Motivation

- **Physical models** for carbon cycle and climate (CMIP)
- Carbon emission in **urban environment**: (anthropogenic)
  - Urban area accounts for 67 – 71% energy-related CO<sub>2</sub> emission in 2006 (IEA)
- **Biogenic** emission (source/sink):
  - Globally, burning of fossil fuel  $\sim 10.9 \text{ Pg C yr}^{-1}$ ,  
v.s. removal by terrestrial ecosystems  $3.4 \text{ Pg C yr}^{-1}$  ( $1 \text{ Pg} = 10^{15} \text{ g}$ )  
(without considering emission by land-use change)
- **Interplay** of biogenic and anthropogenic carbon emissions in urban environment
  - Fine-scale modelling of urban flow, emission
  - Biogenic models
  - Might provide new insights on urban carbon management

CMIP: Coupled Model Intercomparison Project, see Anav et al. 2013, *Journal of Climate* **26**(18): 6801–6843

IEA: International Energy Agency, see Dhakal 2010, *Current Opinion in Environmental Sustainability* **2**: 277–283

Global carbon budget: fossil fuel burning and terrestrial ecosystem update, see Byrne et al. 2023, *Earth Syst. Sci. Data* **15**: 963–1004,

# **Methodology**

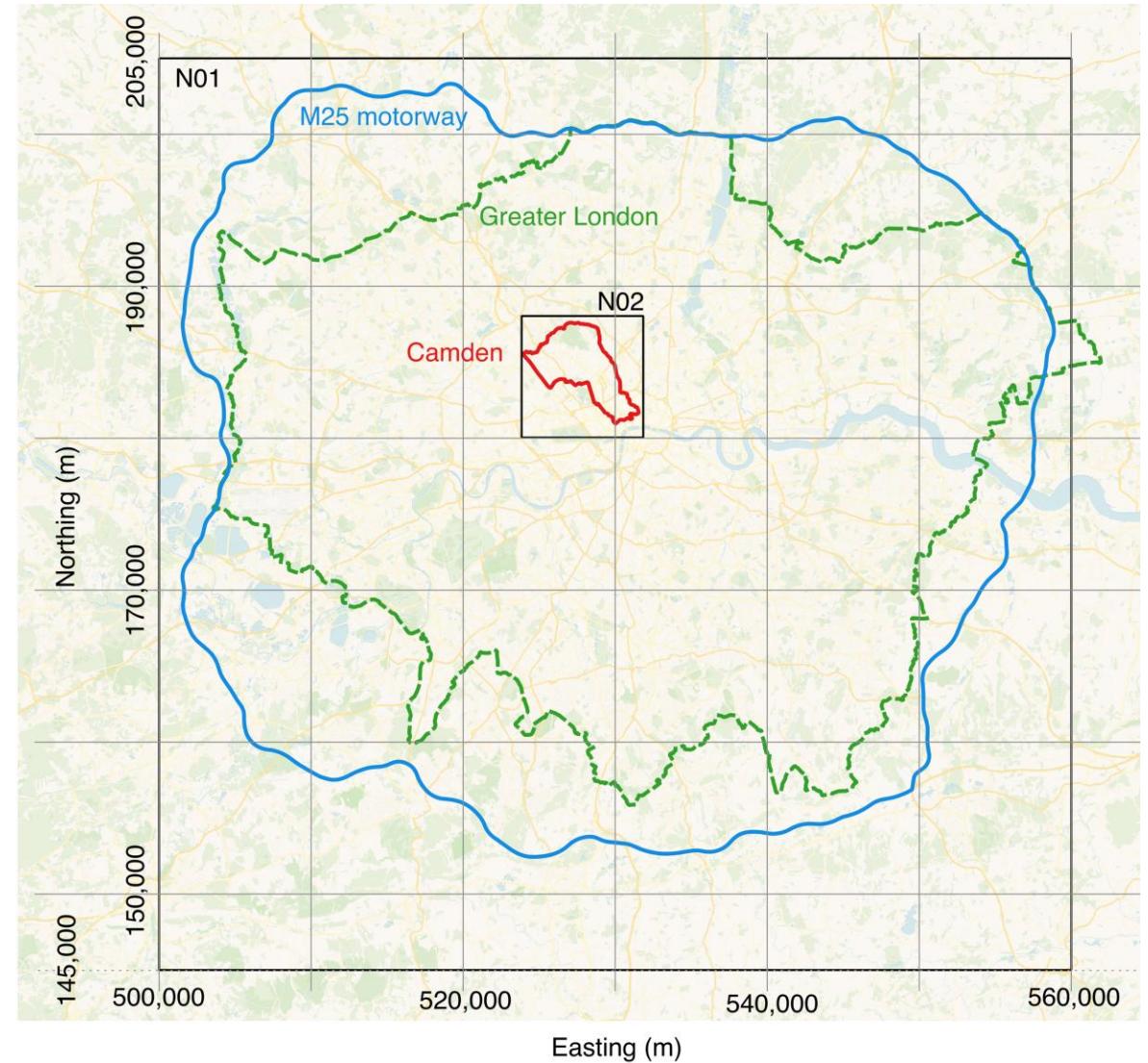
- Study area
- Input data
- Biogenic flux module

# Study area

- London borough of **Camden**
- M25 motorway (**Greater London**)

## Computational domain

- Two nested domain
  - Parent domain N01 (Greater London):
    - 60km x 60km
    - 3km in z-direction
  - Child domain N02 (Camden):
    - 8km x 8km
    - 1km in z-direction



# Case settings

- Spatial discretisation:

	Grid size	# of grid
Parent domain	100m x 100m x 50m	600 x 600 x 60
Child domain	10m x 10m x 10m	800 x 800 x 100

- Run on [archer2](#) (UK Tier 1 HPC)

- 10 nodes (1280 cores)
  - Depending on wind speed, 7 ~ 15 hr CPU time for 1 day simulation

- Activated physics model

- Urban surface (only in child domain)
  - Radiation (clear sky)
  - Land surface
  - Biogenic and anthropogenic CO<sub>2</sub> dispersion

# Static/dynamic driver

- Static driver

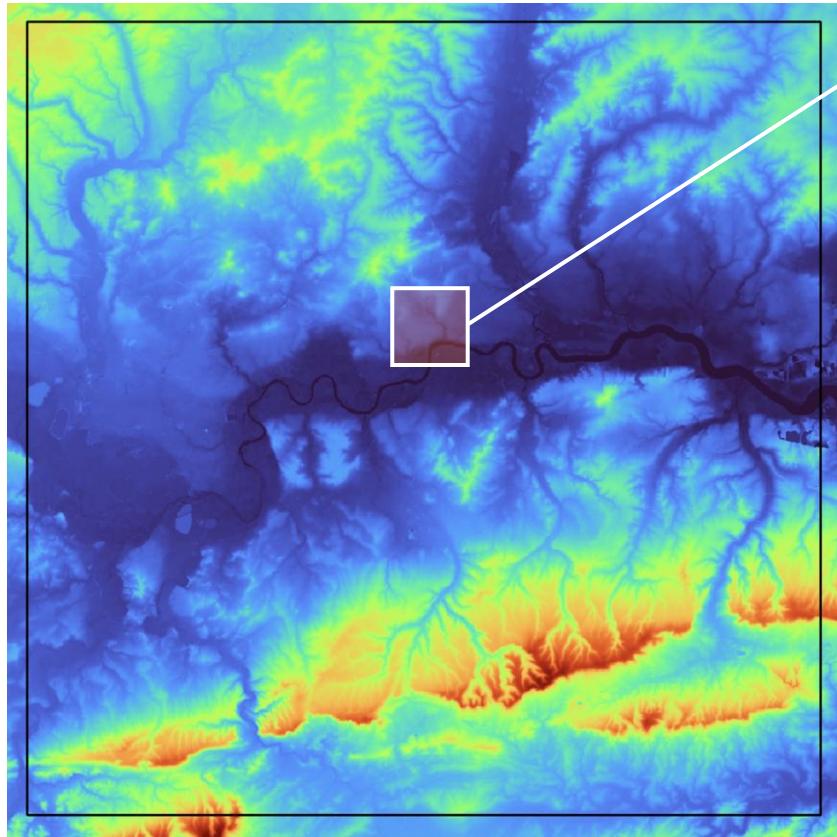
Type	Data source
Terrain height	Ordnance Survey @ 50m, National Lidar @ 1m
Buildings (shape and height)	Ordnance Survey topography map, OS Building height attribute
Landuse and vegetation type	ESA WorldCover @ 10m
EVI, LSWI	Sentinel-2 multispectral image @ 10m

- Dynamic driver

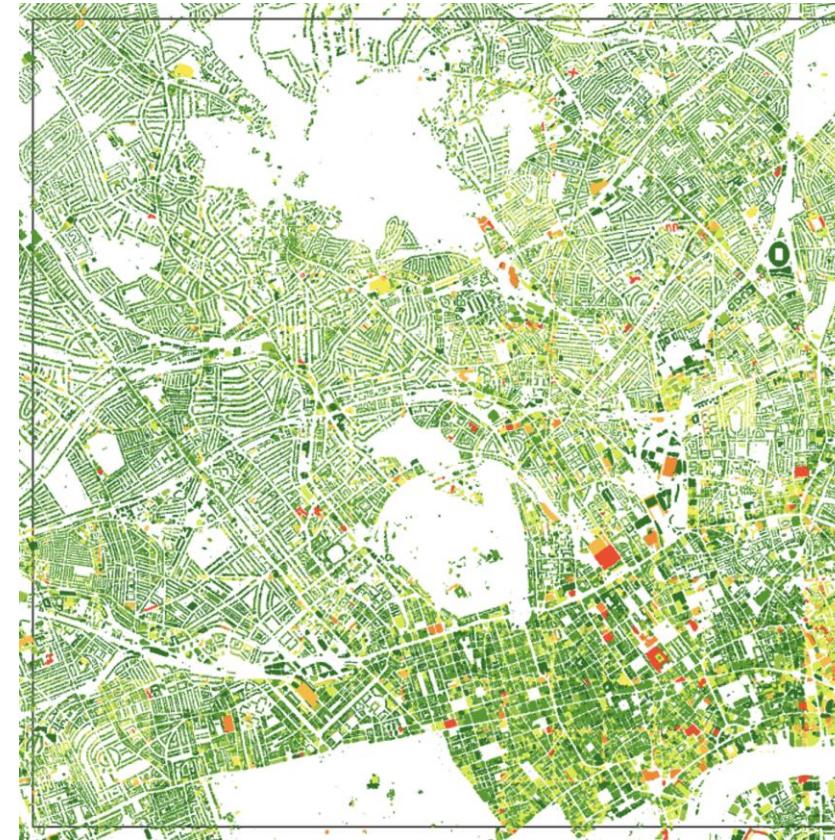
Type	Data source
Wind / pressure / humidity / temperature at pressure levels	ERA5 hourly data on pressure levels (reanalysis) @ 0.25 deg
Wind / pressure / humidity / temperature at ground level	ERA5-Land hourly data @ 0.1 deg
CO2 mixing ratio at pressure levels	CAMS global greenhouse gas reanalysis (EGG4) @ 0.75 deg 3-hourly

# Static/dynamic driver

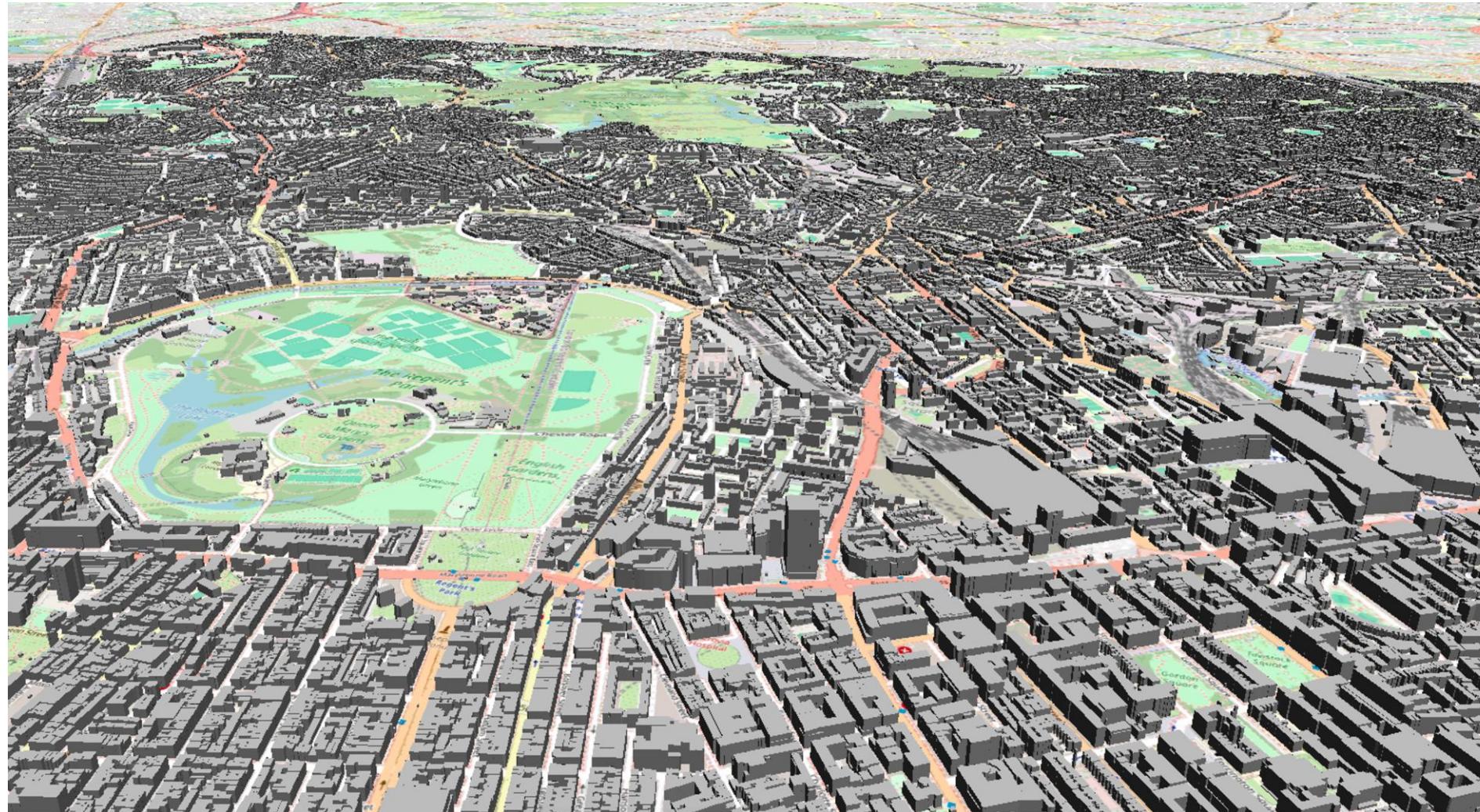
N01 Greater London



N02 Camden



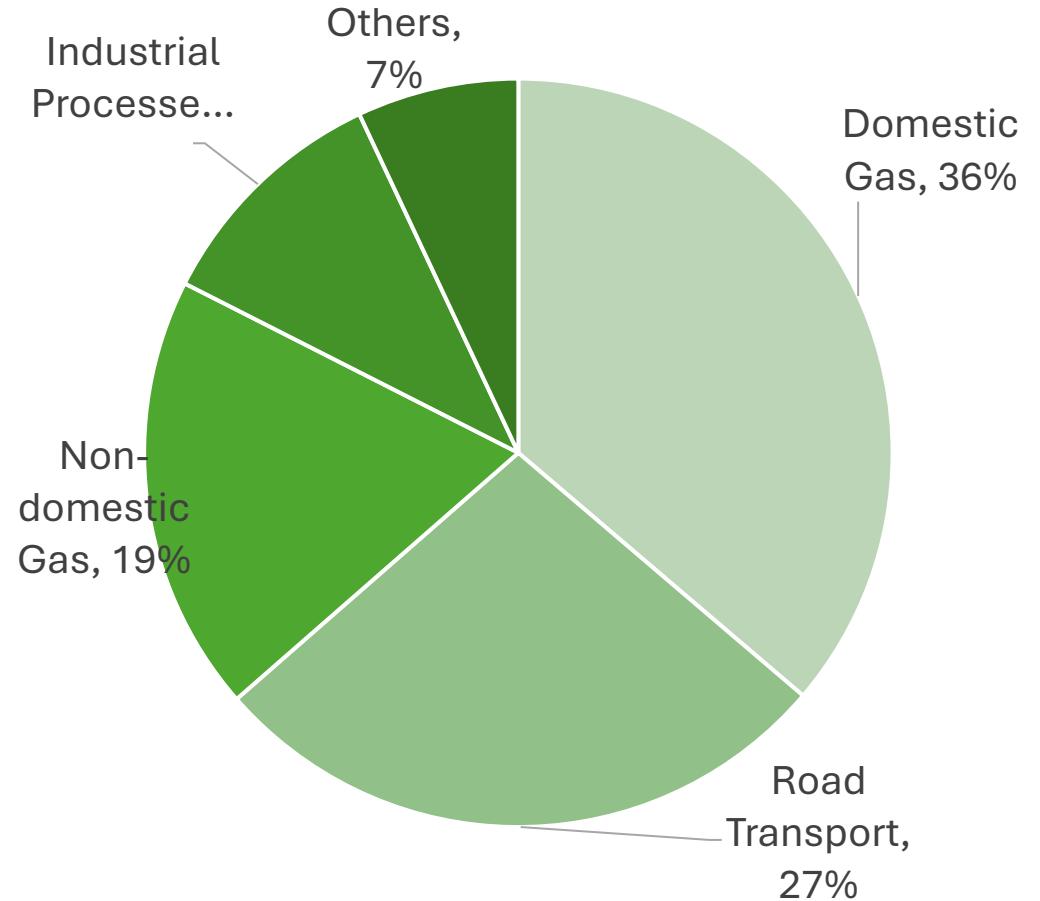
# Static/dynamic driver



3D Bird's-eye view of the child domain with buildings

# Anthropogenic emission

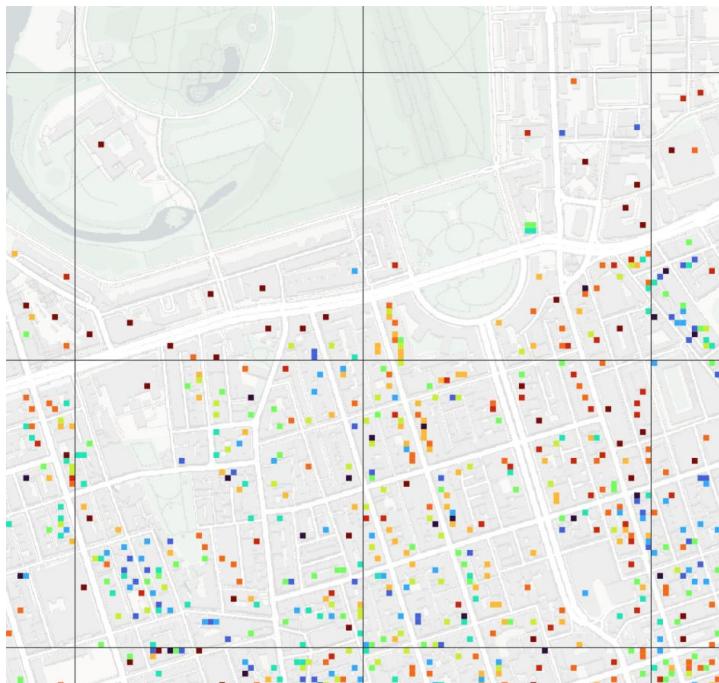
- Based on LAEI<sup>[1]</sup> inventory (1km by 1km), further disaggregate activity data at **high resolution** 10m by 10m.
- Domestic **gas emission**: distribute using EPC records
- **Non-domestic gas emission**: using non-domestic EPC and DEC records
- **Road transport**: LAEI provides line shapefile and road section emission
- Other sectors: disaggregate evenly
- **Temporal** disaggregation: from annual total to hourly, using CAMS-TEMPORAL profile<sup>[2]</sup>



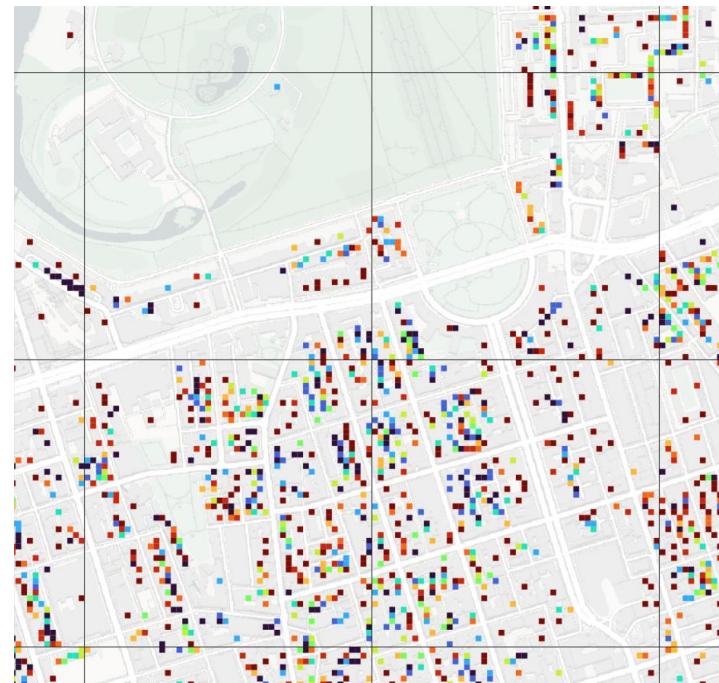
Major emission sectors in Greater London<sup>[1]</sup>

# Anthropogenic emission

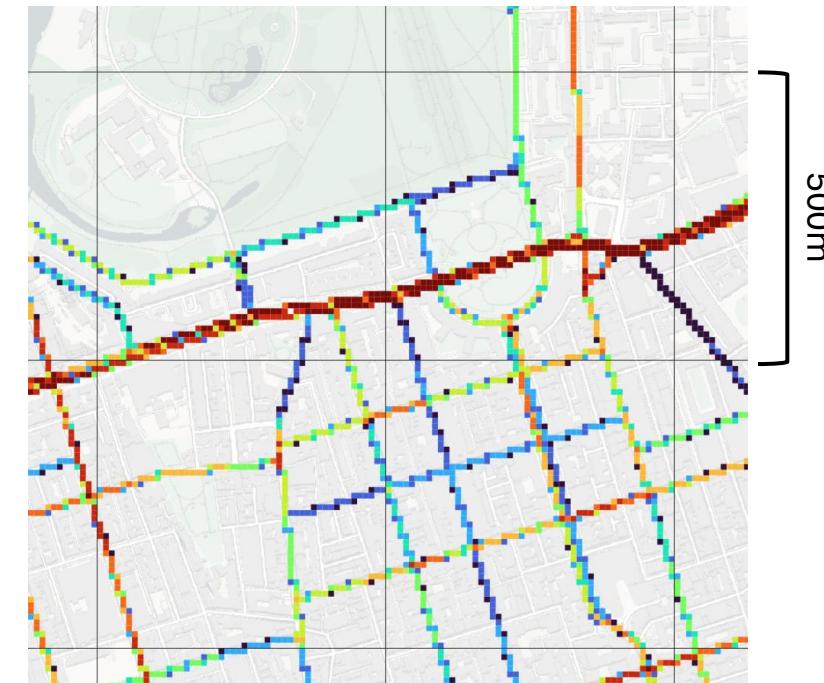
High spatial resolution (10m by 10m) CO<sub>2</sub> emission grid map for London



Non-domestic gas consumption  
emission (tonCO<sub>2</sub>/yr)



Domestic gas consumption  
emission (tonCO<sub>2</sub>/yr)



Major road traffic emission  
(tonCO<sub>2</sub>/yr)

# Biogenic emission

- Biogenic CO<sub>2</sub> model based on WRF

## Gross ecosystem exchange (photosynthesis)

$$GEE = \lambda \times T_{scale} \times P_{scale} \times W_{scale} \times EVI \times \frac{1}{1 + PAR/PAR_0} \times PAR$$

Temperature coeff.

Leafy degree coeff.  
(computed from EVI)

Water coeff.  
(computed from LSWI)

Radiation  
(computed from  
shortwave radiation)

## Respiration rate

$$RESP = \alpha T_{air} + \beta$$

## Net ecosystem exchange

$$NEE = -GEE + RESP$$

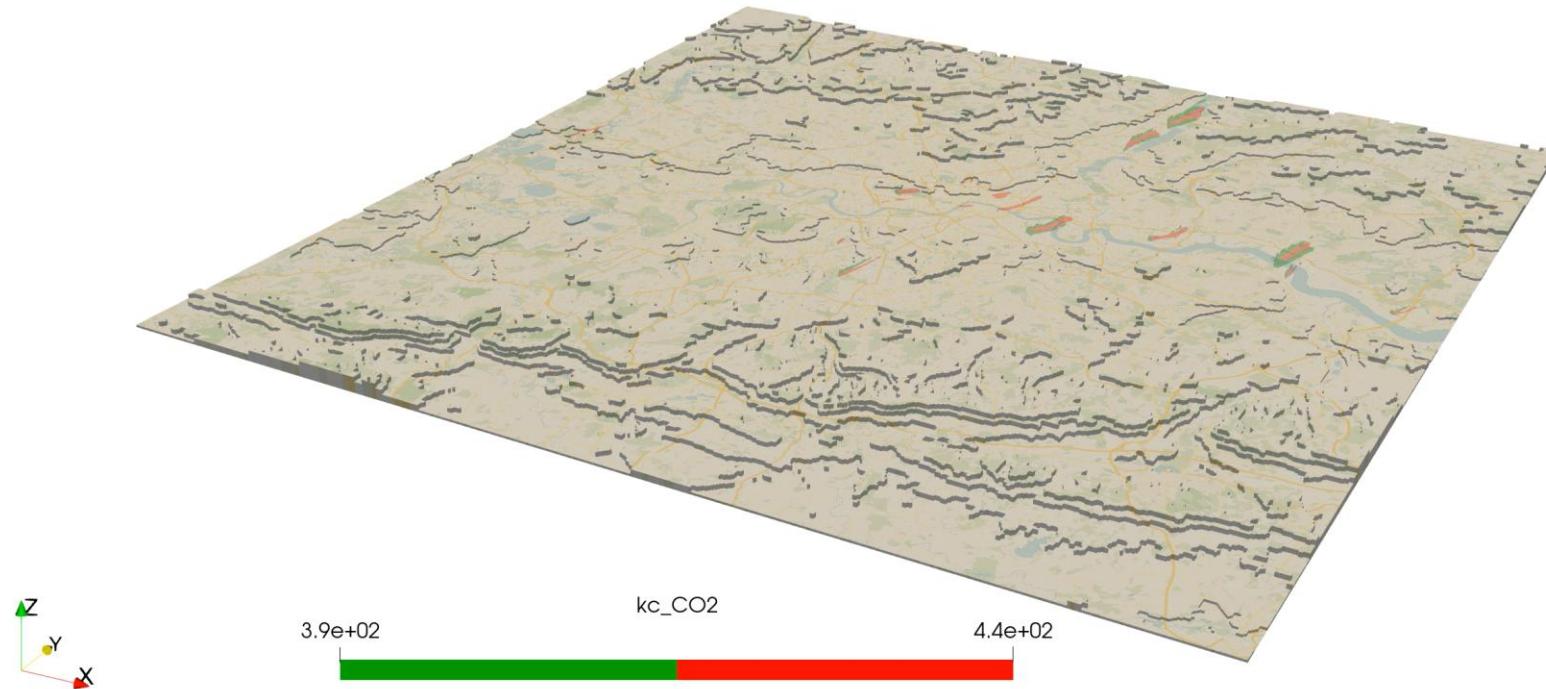
# Results

# Overview (Greater London in Summer)

Green – 390 ppm iso-surface  
(lower than background ~ 410 ppm)  
showing biogenic take-in

2019-07-16 00:30:10

Red – 440 iso-surface  
(higher than background)  
showing anthropogenic  
emission

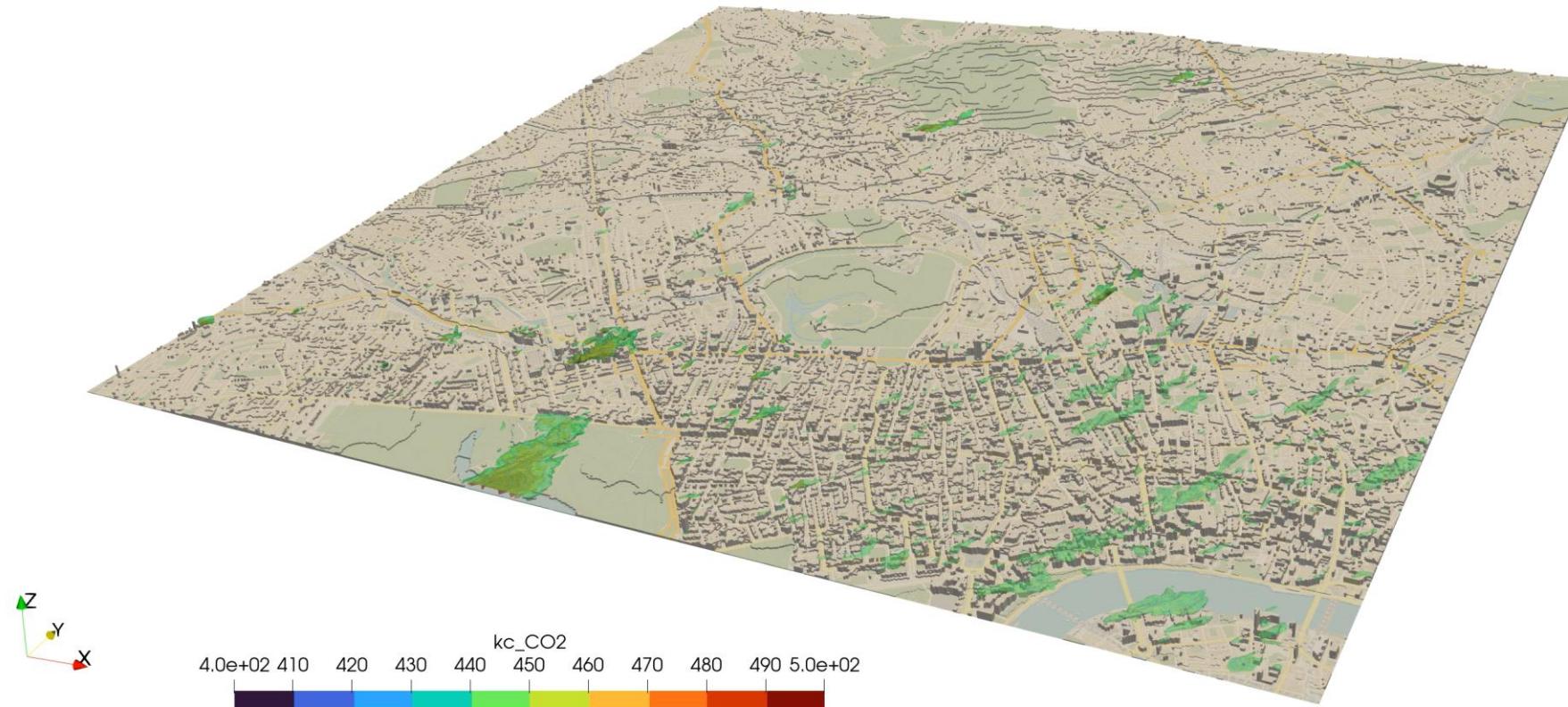


z direction scaled up x5

# Overview (Camden in Summer)

Iso-surfaces – from green to red,  
440 to 500 ppm  
(all surfaces larger than background)

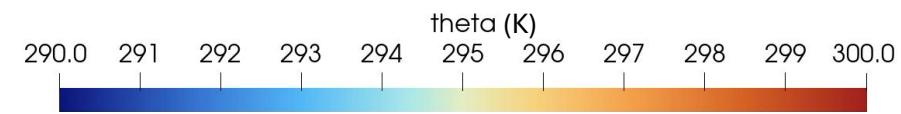
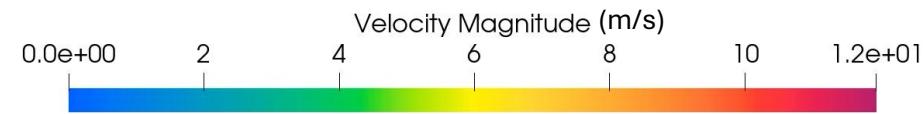
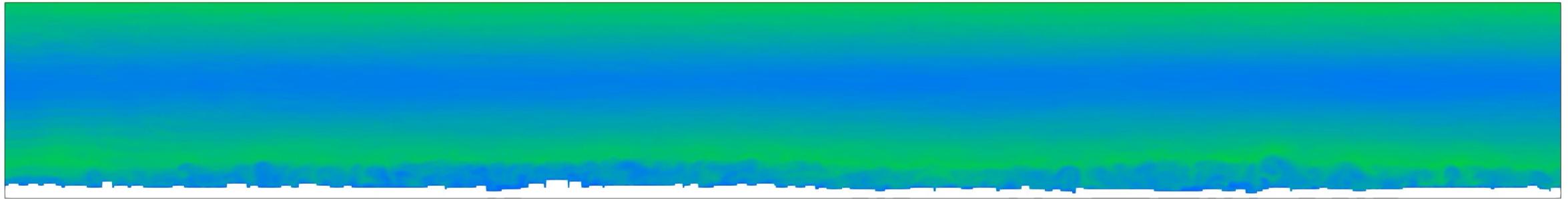
2019-07-16 00:30:10



# Urban boundary flow

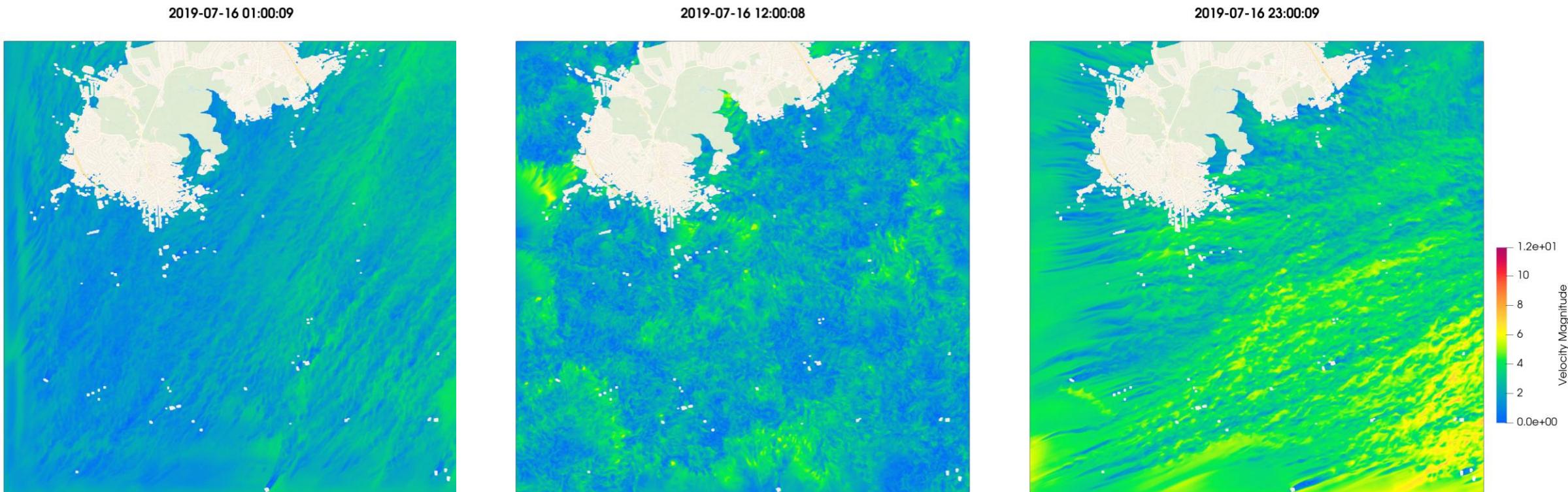
$y = 4000 \text{ m}$

2019-07-16 00:30:10



# Urban boundary flow

Velocity magnitude contour on  $z = 100$  m at 1:00, 12:00 and 23:00

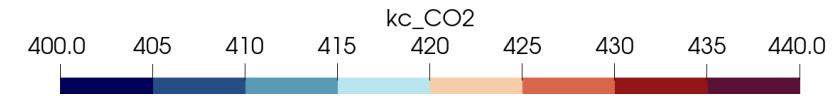


At the same height,  
Night      lower boundary layer, forced circulation  
Day      higher boundary layer, thermal-driven

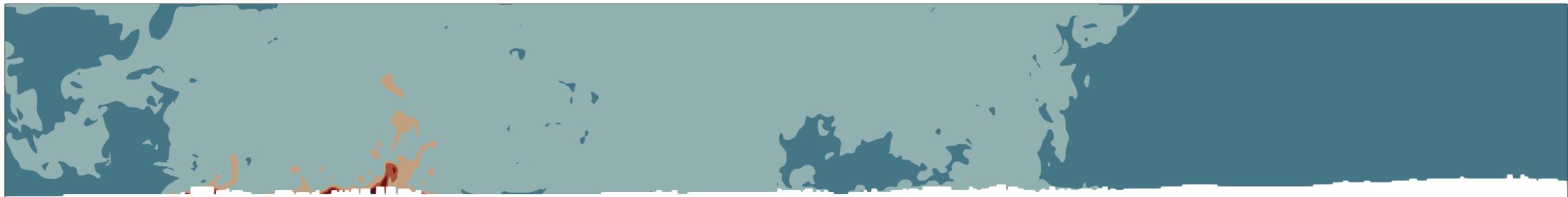
# CO2 mixing ratio diurnal variation

x = 4000 m cross-section CO2 mixing ratio in summer

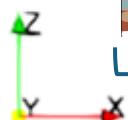
2019-07-16 03:00



2019-07-16 12:00



2019-07-16 23:00



Hyde Park

Marylebone

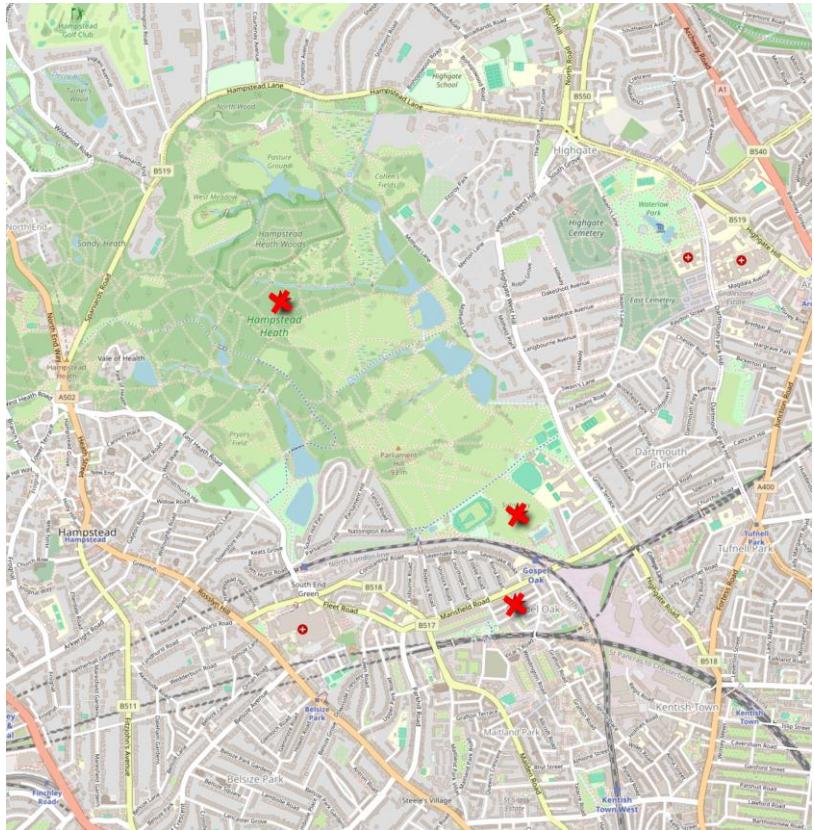
Regent's Park

Camden Town

Hampstead Heath

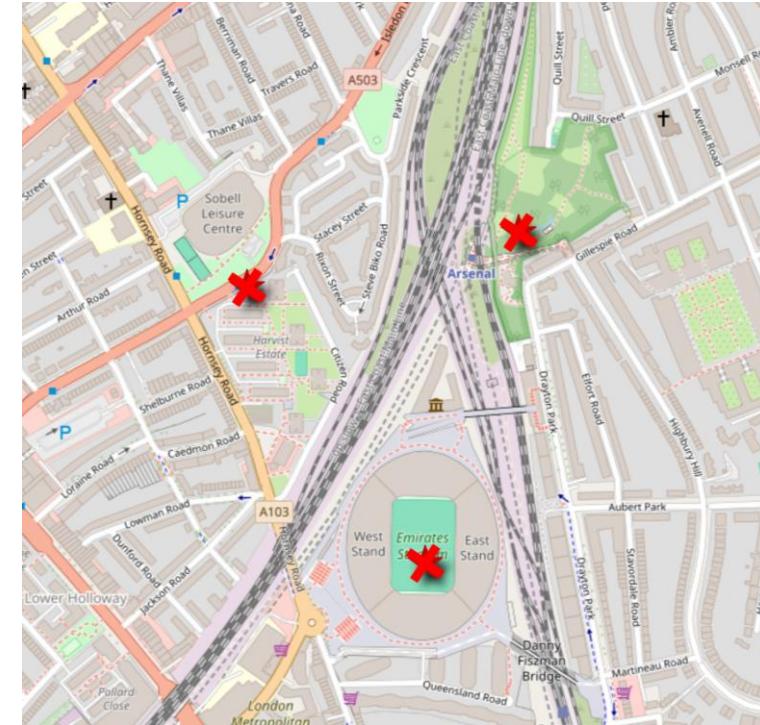
Highgate

# CO<sub>2</sub> mixing ratio diurnal variation



3 points in Hampstead Heath

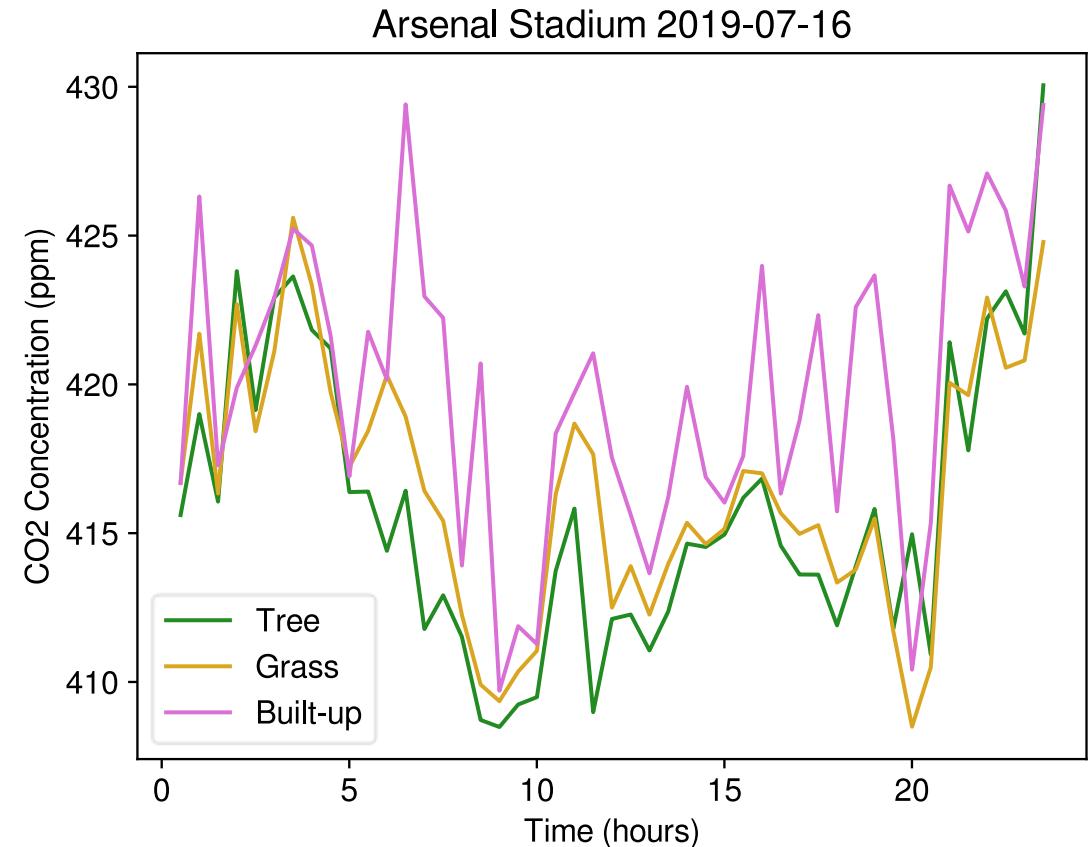
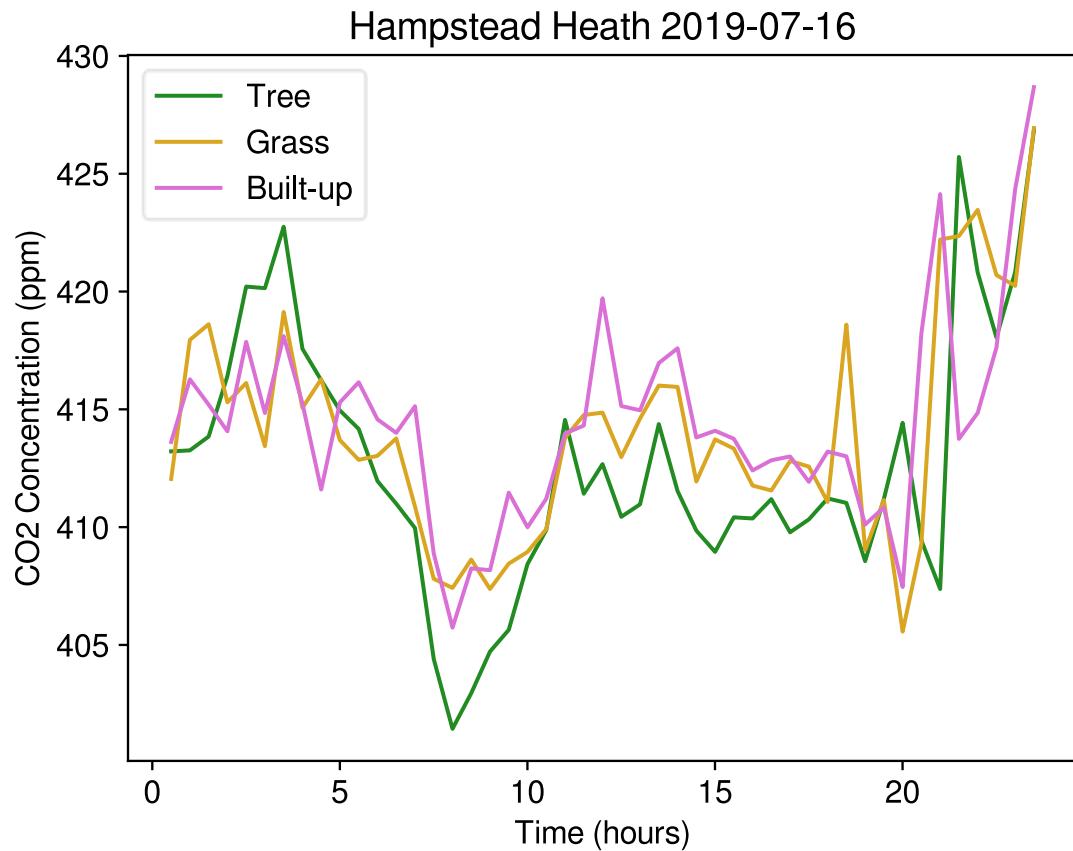
- Large natural park
- Nearby residential areas



3 points in/around Arsenal Stadium

- Artificial land cover
- Grassland in stadium

# CO2 mixing ratio diurnal variation (summer)

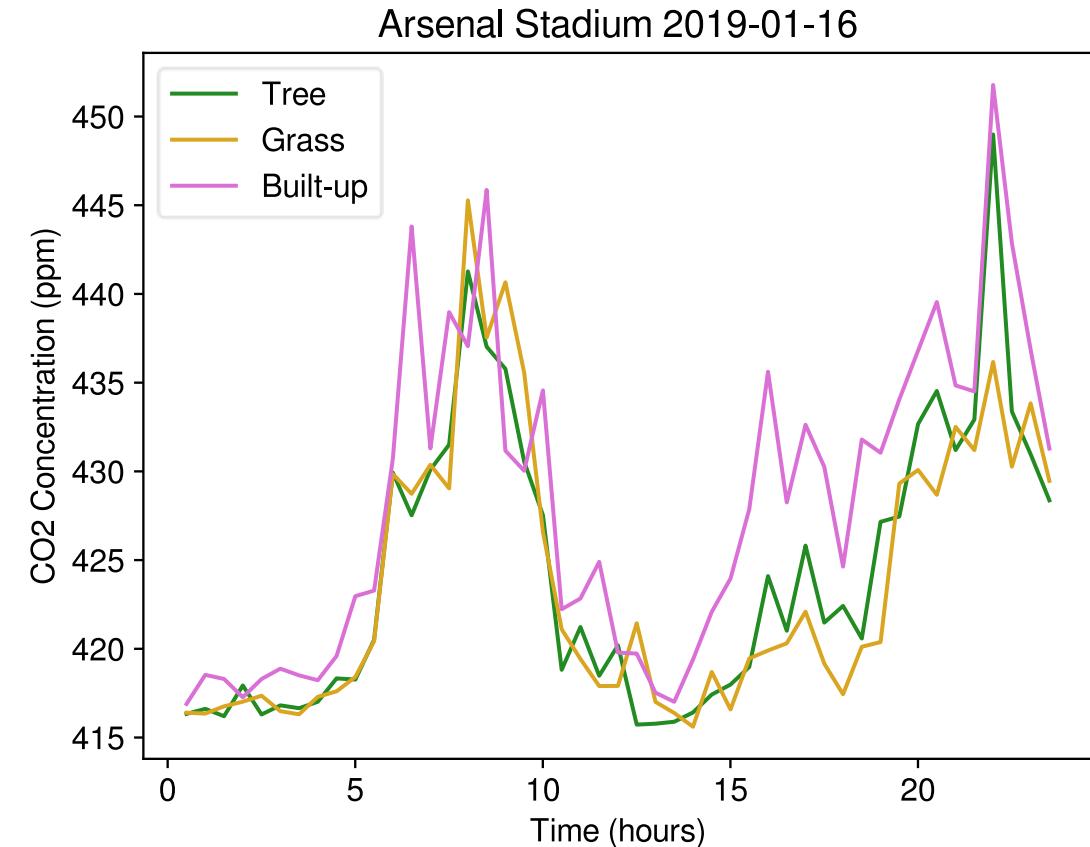
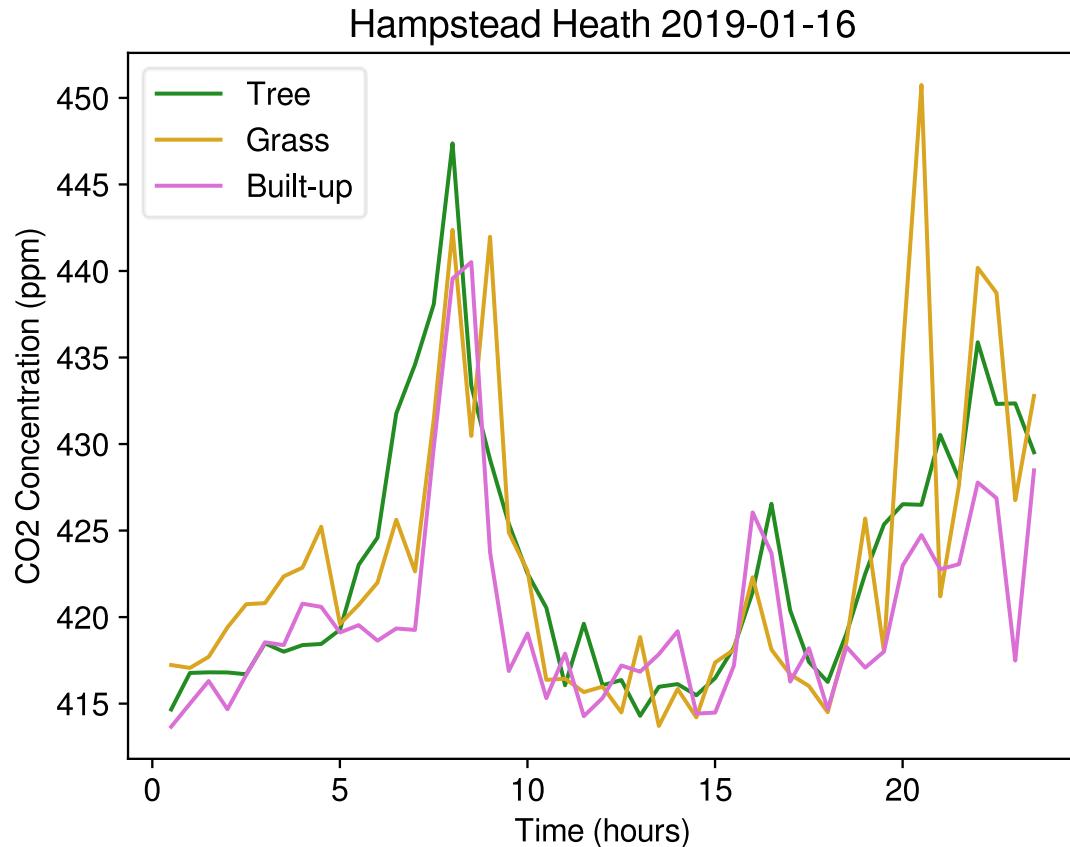


General trend: *high in night, low during the day*

Land-type relevance: *tree covered area has lower ppm, but not significant*

Urban boundary layer also has significant effects (high BL during day)

# CO2 mixing ratio diurnal variation (winter)



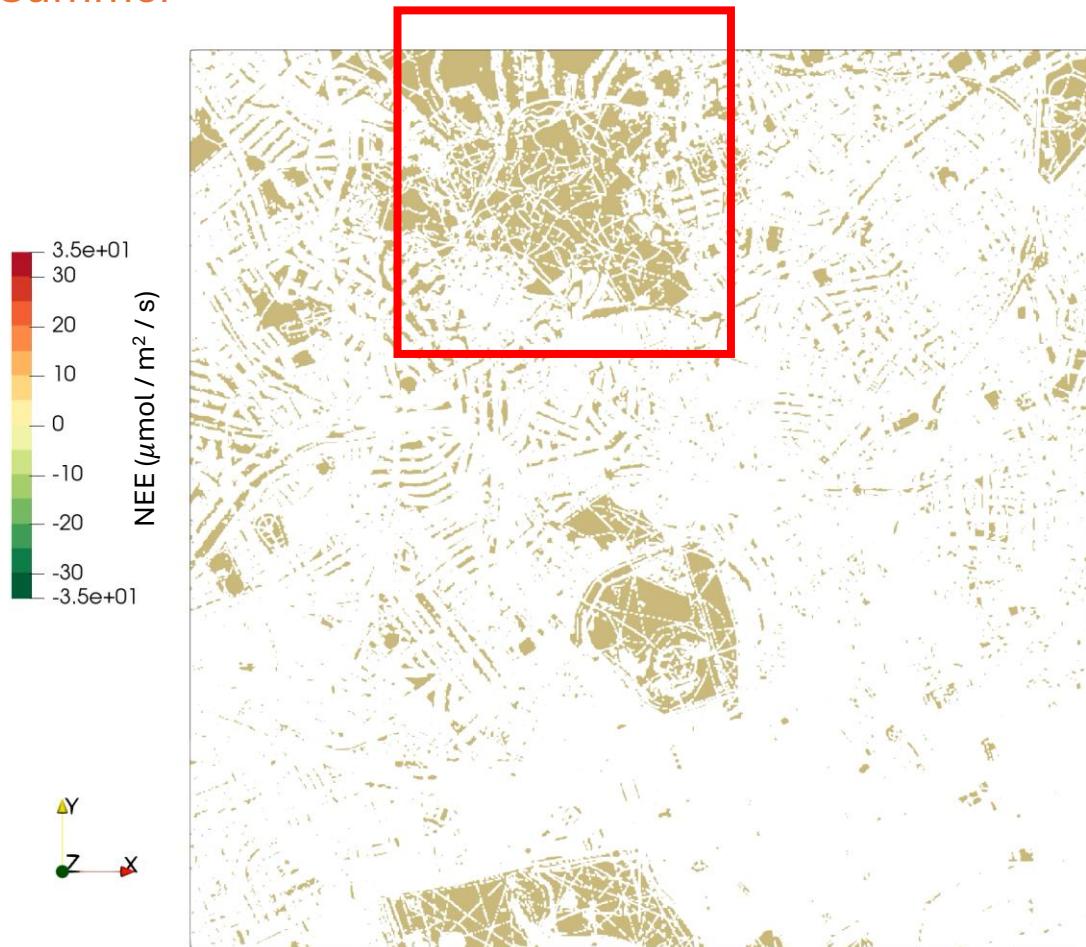
General trend:

- winter sees larger diurnal change
- vegetation take-in weaker

# Biogenic fluxes

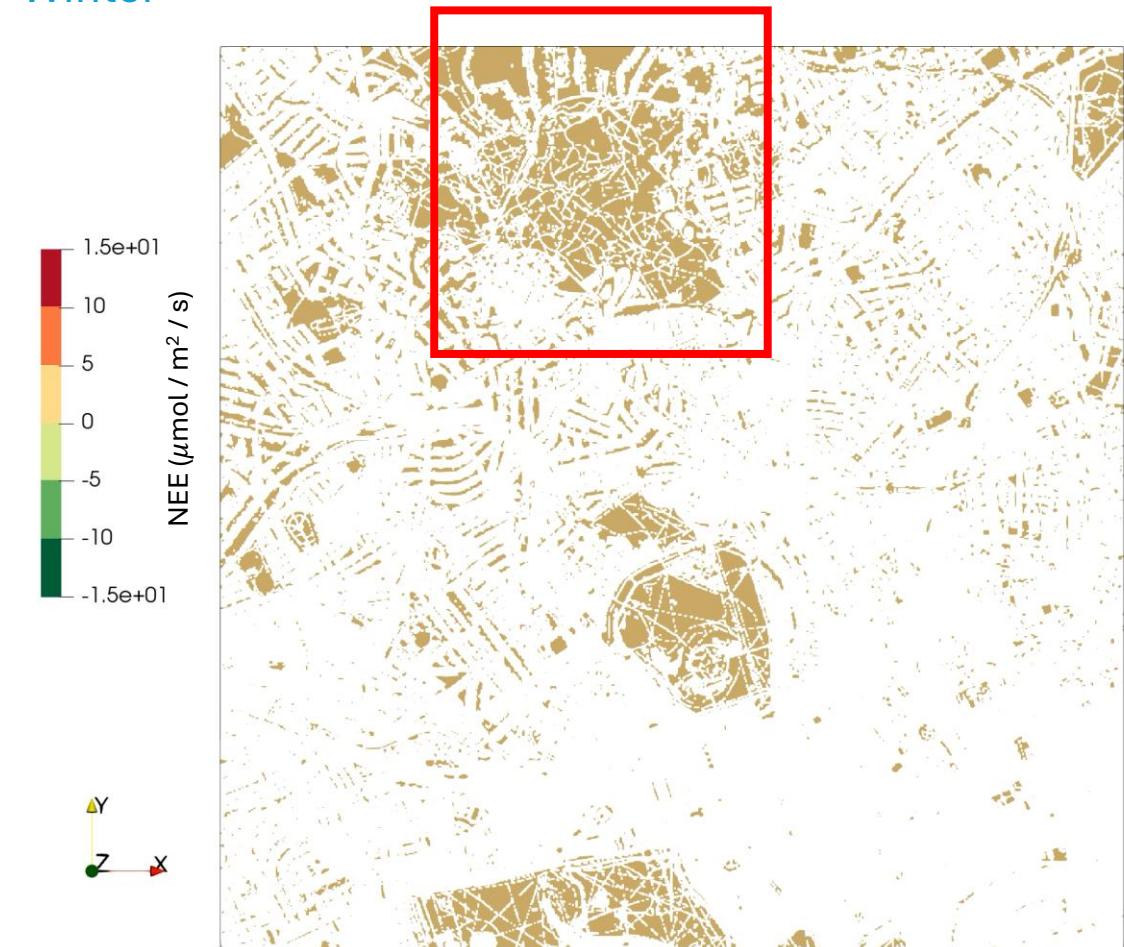
Summer

2019-07-16 00:30:01



Winter

2019-01-16 00:30:00



*(Note the difference in colour bar range)*

# Biogenic fluxes at Hampstead Heath

Summer

2019-07-16 00:30:01



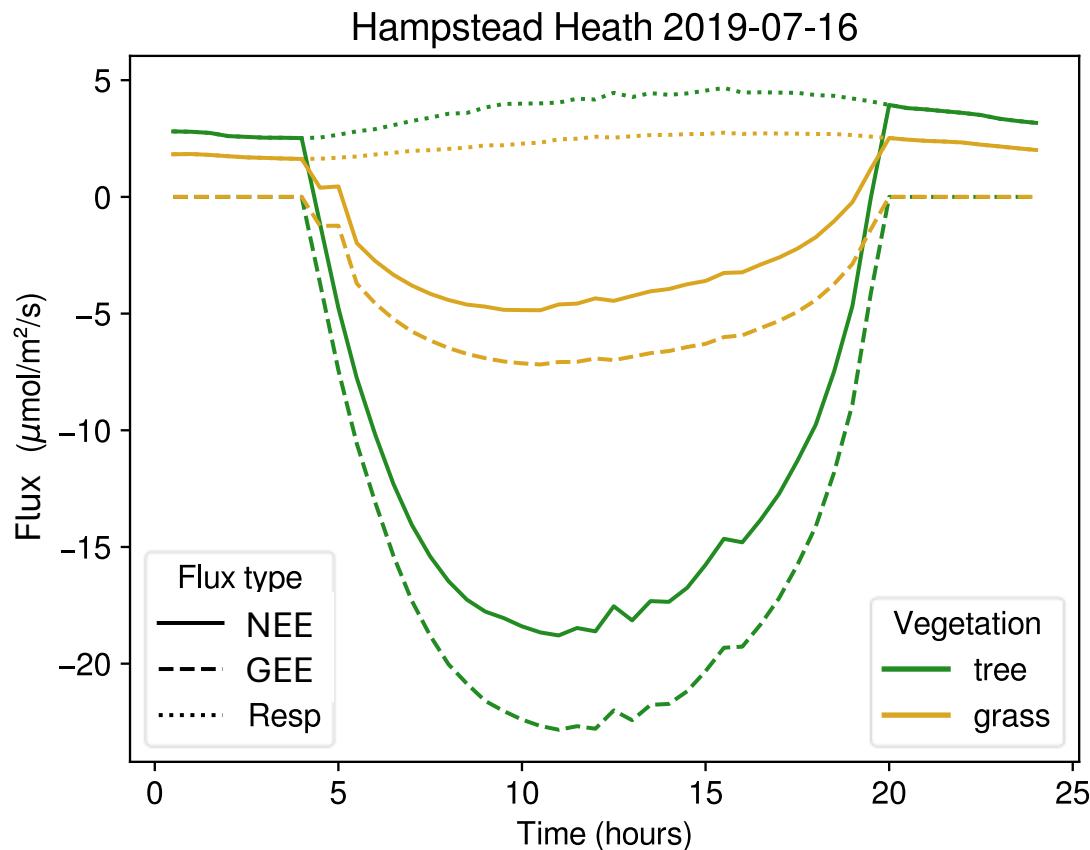
Winter

2019-01-16 00:30:00

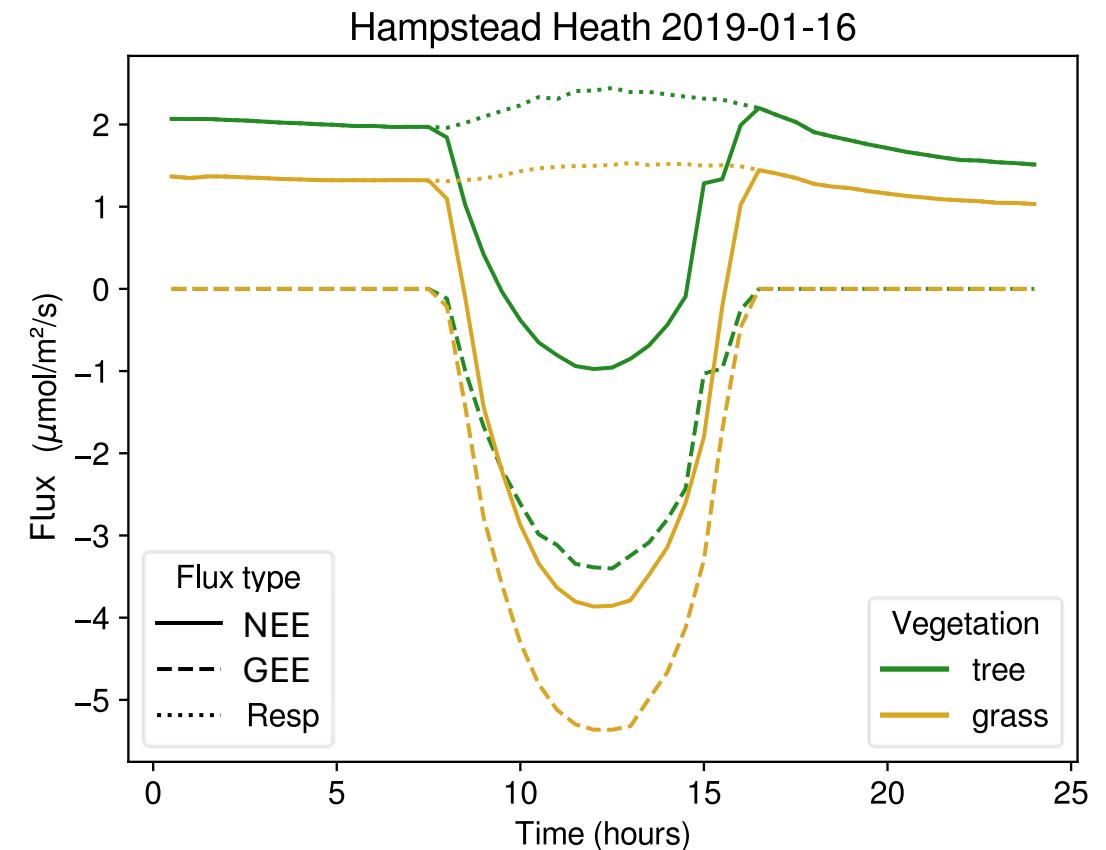


# Biogenic fluxes

Summer



Winter



Seasonal difference in biogenic fluxes (Note the difference in y-axis scale!)

- Summer: vegetation take-in
- Winter: shorter sunlit hours; trees GEE smaller

# Conclusion

- A biogenic carbon module is developed in an urban LES model, PALM
- A case study of London borough of Camden is presented
- Seasonal difference and diurnal cycle is analysed

Next step...

- Case study of annual cycle
- Other cities/countries
- Varying vegetation inputs in the model to see impact of green infrastructure
- Data-driven models

# Thanks for your attention!

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