



Urban carbon dioxide Flux  
Monitoring using  
Eddy Covariance and  
Earth Observation

# Urban carbon dioxide flux monitoring using Eddy Covariance and Earth Observation: First results from diFUME project

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24.11.2020

Current Studies in Physical Geography and Atmospheric Sciences

Fall Term 2020



This project has received funding from the European Union's  
Horizon 2020 research and innovation programme under the  
Marie Skłodowska-Curie grant agreement No 836443



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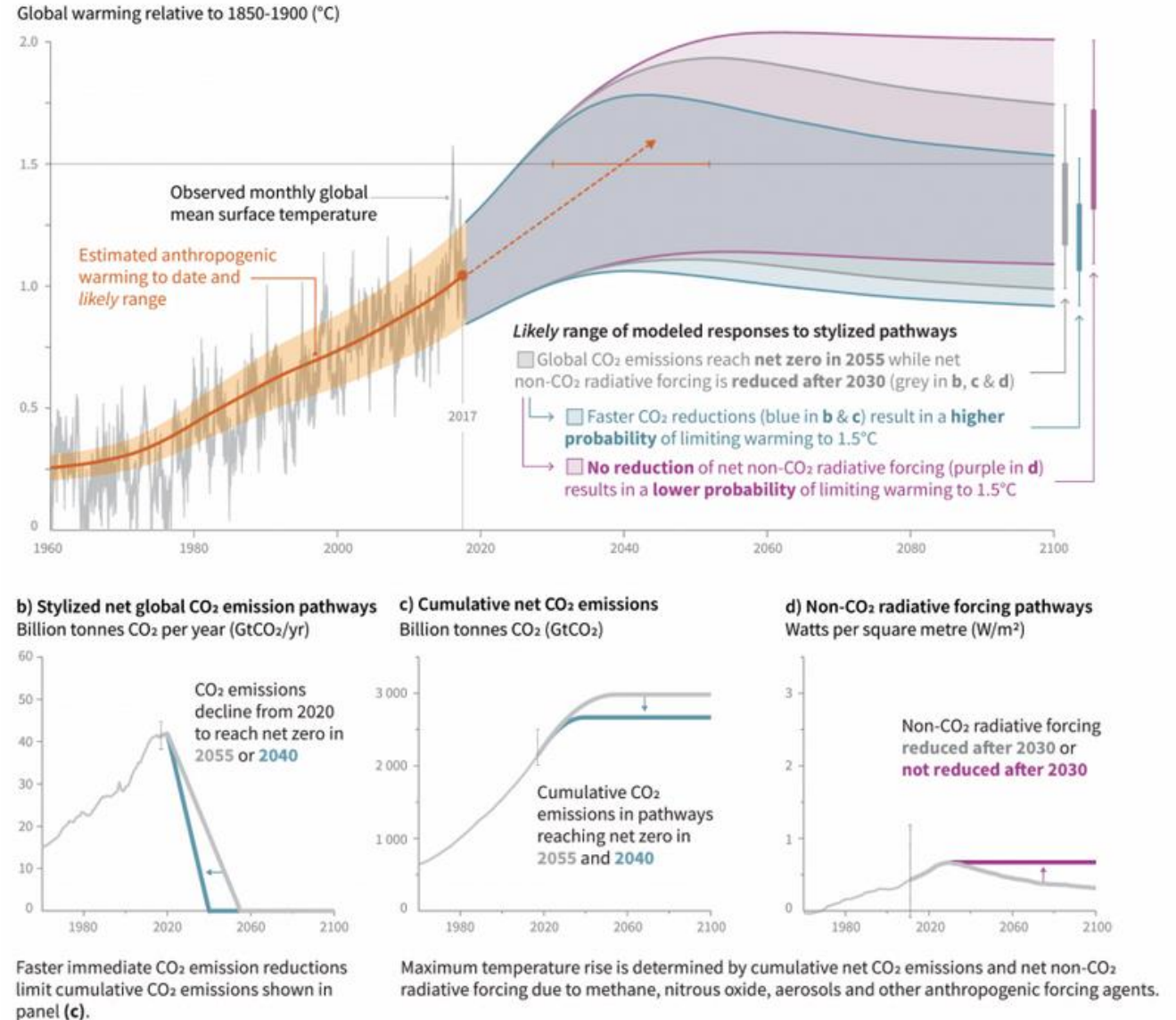
# Introduction

## Paris Agreement, 2015:

- global temperature rise  $< 2\text{ }^{\circ}\text{C}$
- limit temperature rise to  $1.5\text{ }^{\circ}\text{C}$

## IPCC Special Report, 2018:

- global warming is likely to reach  $1.5^{\circ}\text{C}$  between 2030 - 2052 if it continues to increase at the current rate.
- $1.5\text{ }^{\circ}\text{C}$  goal requires rapid and far-reaching transitions in energy, land, urban, infrastructure (including transport and buildings), and industrial systems.



**“Cities Are Where the Climate Battle Will Largely Be Won or Lost”**

*António Guterres, UN Secretary-General*

*C40 World Mayors Summit, 2019*

# Introduction

## Urban Areas:

- **55 %** (4.2 billion) of world population lives in cities, projected to increase to **68 %** (6.7 billion) by 2050

*UN, 2018*

- **70 %** of total anthropogenic CO<sub>2</sub> emissions originate from urban areas

*Canadell et al., 2009*

# Introduction

## Urban Metabolism

Flow and transformation of materials and energy in a city, related to energy, water and carbon budgets.

*Relevant processes:* combustion, manufacturing, irrigation, construction, respiration, etc.

# Introduction

## Urban carbon fluxes

*Lateral*: entirely anthropogenic processes, carbon mostly in solid or liquid organic compounds

*Vertical*: exchange between surface and atmosphere, anthropogenic-biogenic processes, carbon in the form of CO<sub>2</sub>

# Introduction

## Vertical fluxes

### *Processes:*

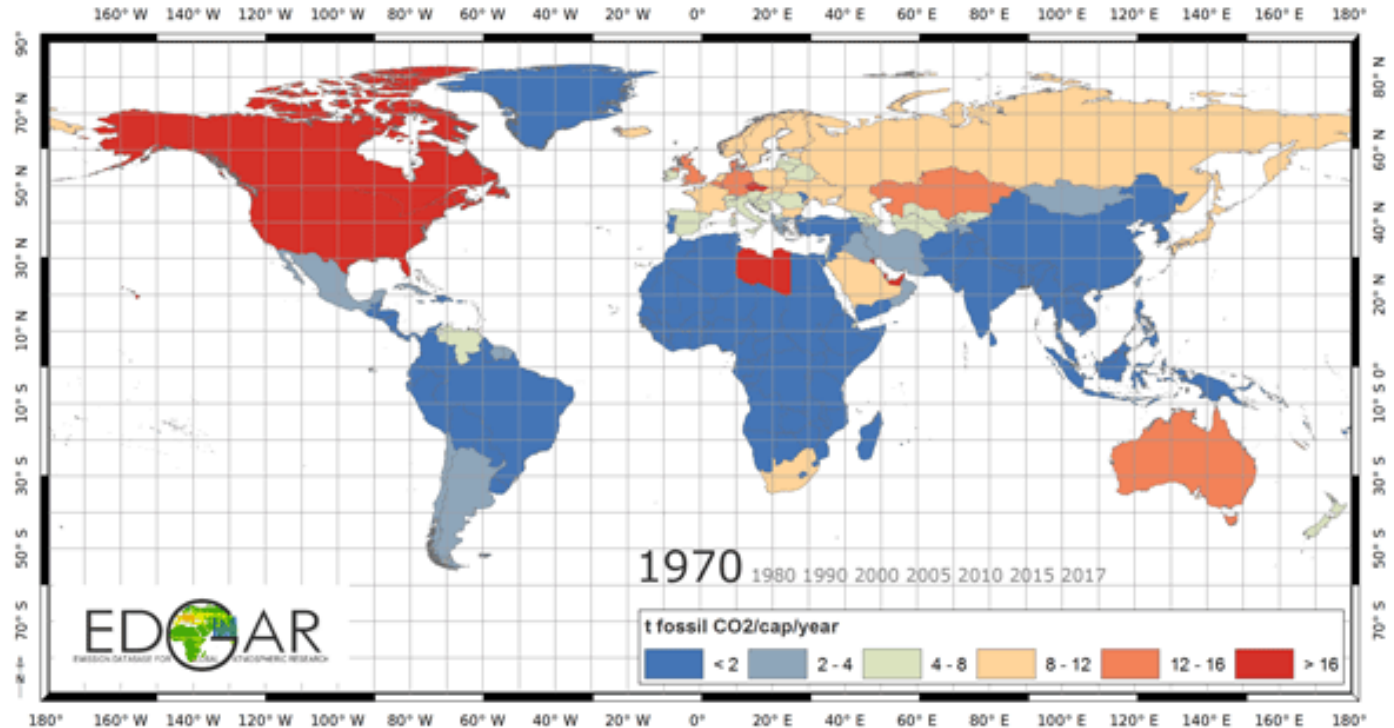
- Combustion  
*fossil fuels, biofuels, wood*
- Respiration  
*humans, animals, plants, microbes*
- Photosynthesis  
*plants, the only carbon sink!*



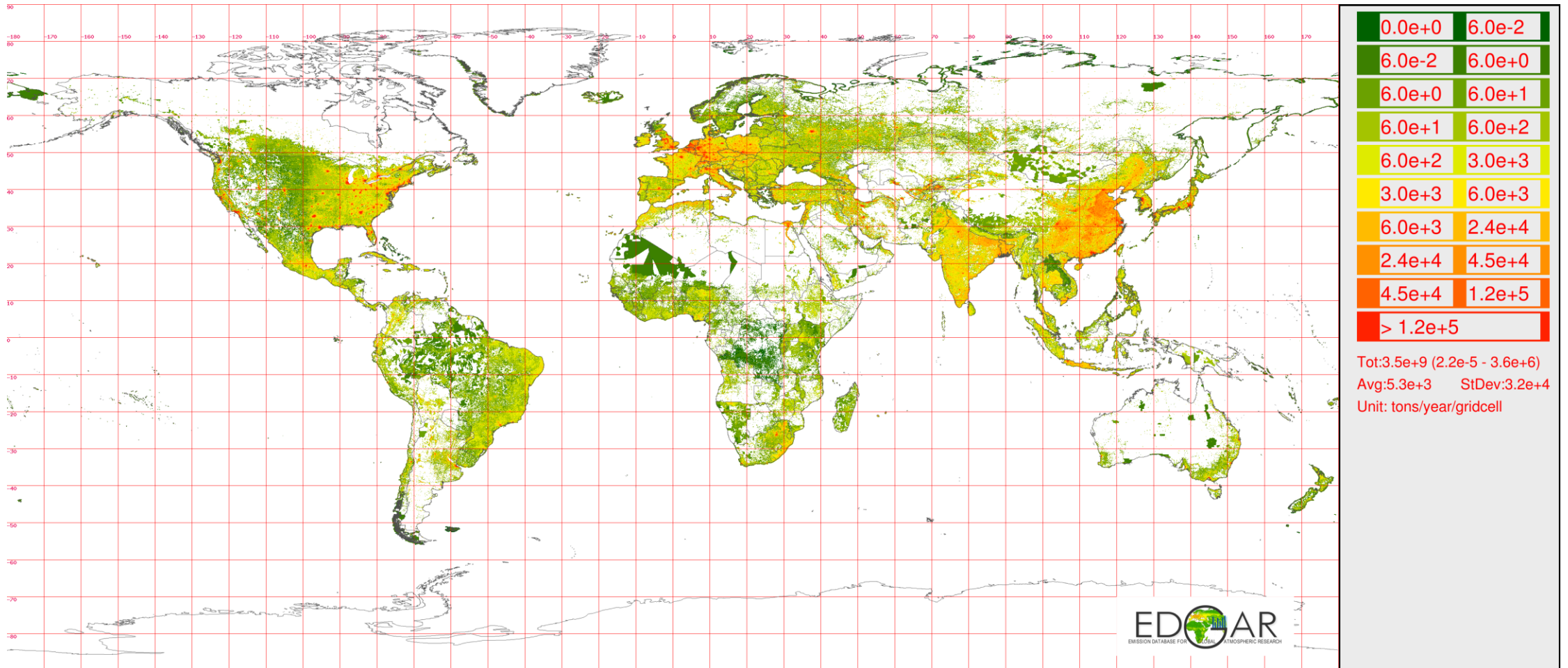
# Monitoring CO<sub>2</sub> Fluxes in Cities

## *Inventory or bottom-up approaches* (indirect)

- › Fuel and electricity consumption data-statistics and emission factors
- › Restricted spatial and temporal scales
- › Downscaled using proxies (e.g. population density, land cover types)
- › Data/methodology consistency issues

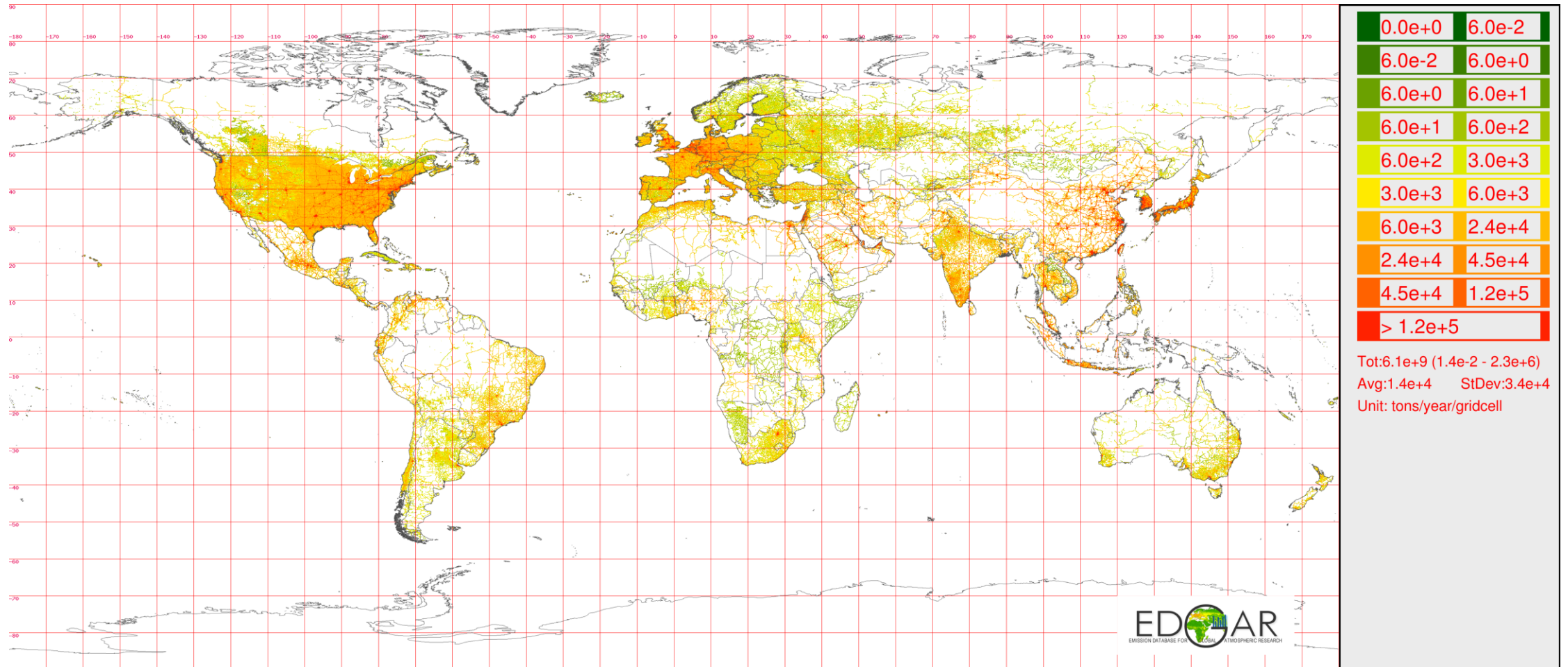


# Monitoring CO<sub>2</sub> Fluxes in Cities



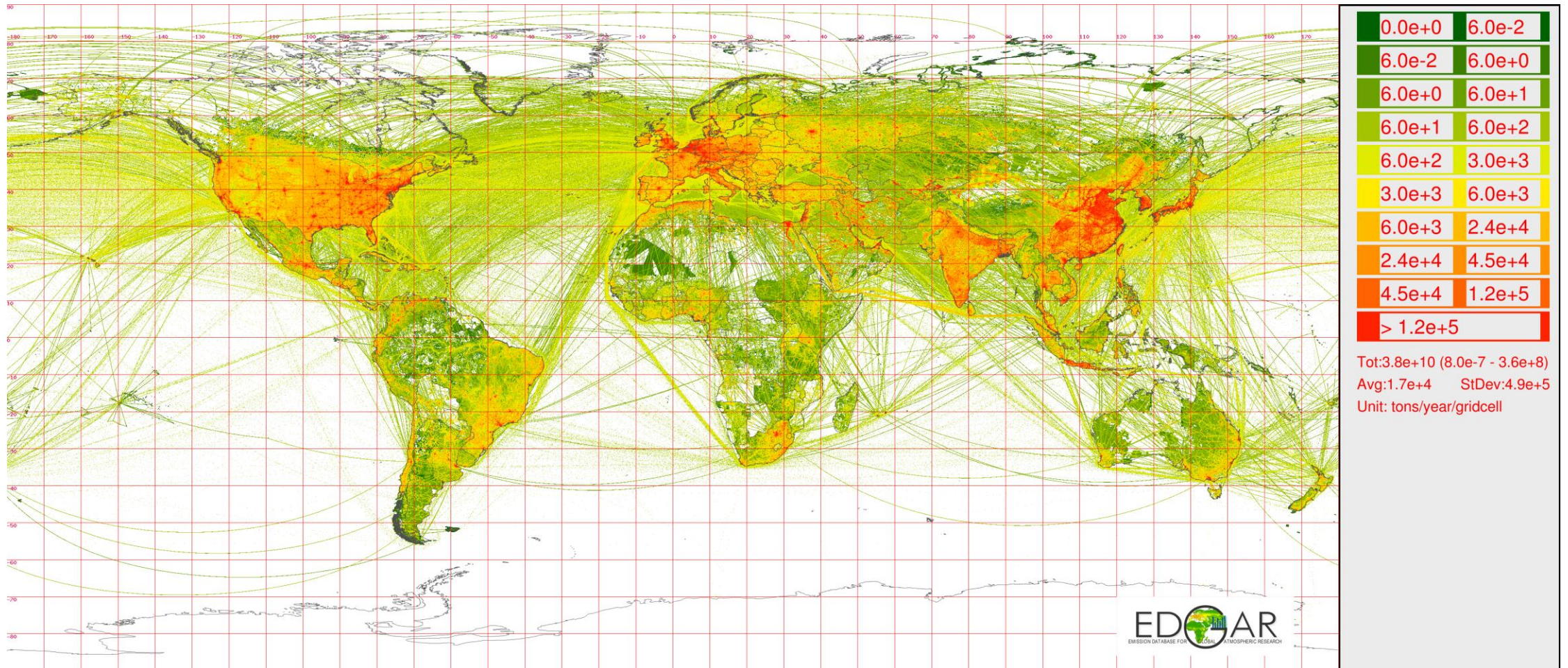
Compound: CO<sub>2</sub>; emissions\_ds\_name: v5.0\_FT2018(edgar) ; Year: 2018;  
Friday 25th of October 2019 07:20:02 AM

# Monitoring CO<sub>2</sub> Fluxes in Cities



Compound: CO<sub>2</sub>; emissions\_ds\_name: v5.0\_FT2018(edgar) ; Year: 2018;  
Monday 14th of October 2019 02:15:56 PM

# Monitoring CO<sub>2</sub> Fluxes in Cities



Compound:CO<sub>2</sub>; emissions\_ds\_name:v5.0\_FT2018(edgar) ; Year:2018;  
Friday 25th of October 2019 11:22:13 AM

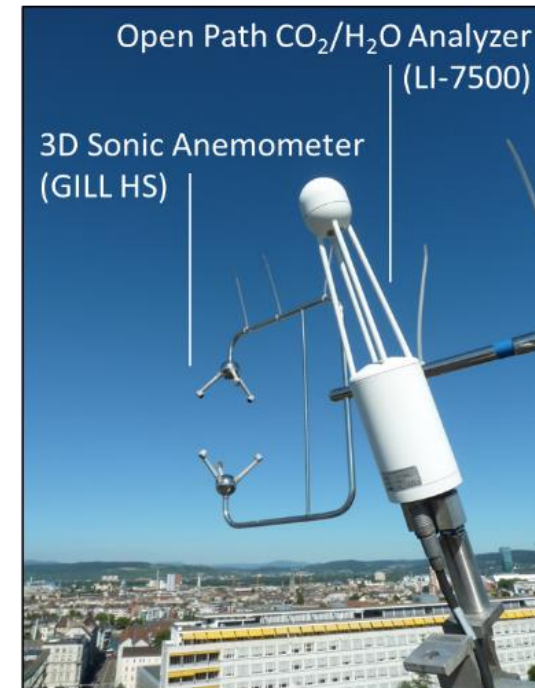
# Monitoring CO<sub>2</sub> Fluxes in Cities

## *Direct measurements*

- › Approaches depending on scale (micro, local, regional)
- › Sensors at various heights (towers, balloons, airplanes)
- › Hampered by the extreme heterogeneity of the urban environment (sources, sinks) and the complexity of UBL dynamics
- › Source/sink attribution is challenging
- › Link between scales is difficult

# Eddy Covariance

- › Direct CO<sub>2</sub> flux ( $F_c$ ) estimations at local scale
- › Variable measurement footprint (sources/sinks)



# Earth Observation

Current capabilities:

- Urban cover
- Urban morphology
- Biophysical/biochemical parameters

Multiple spatial scales

Trade-off spatial - temporal



# Scope



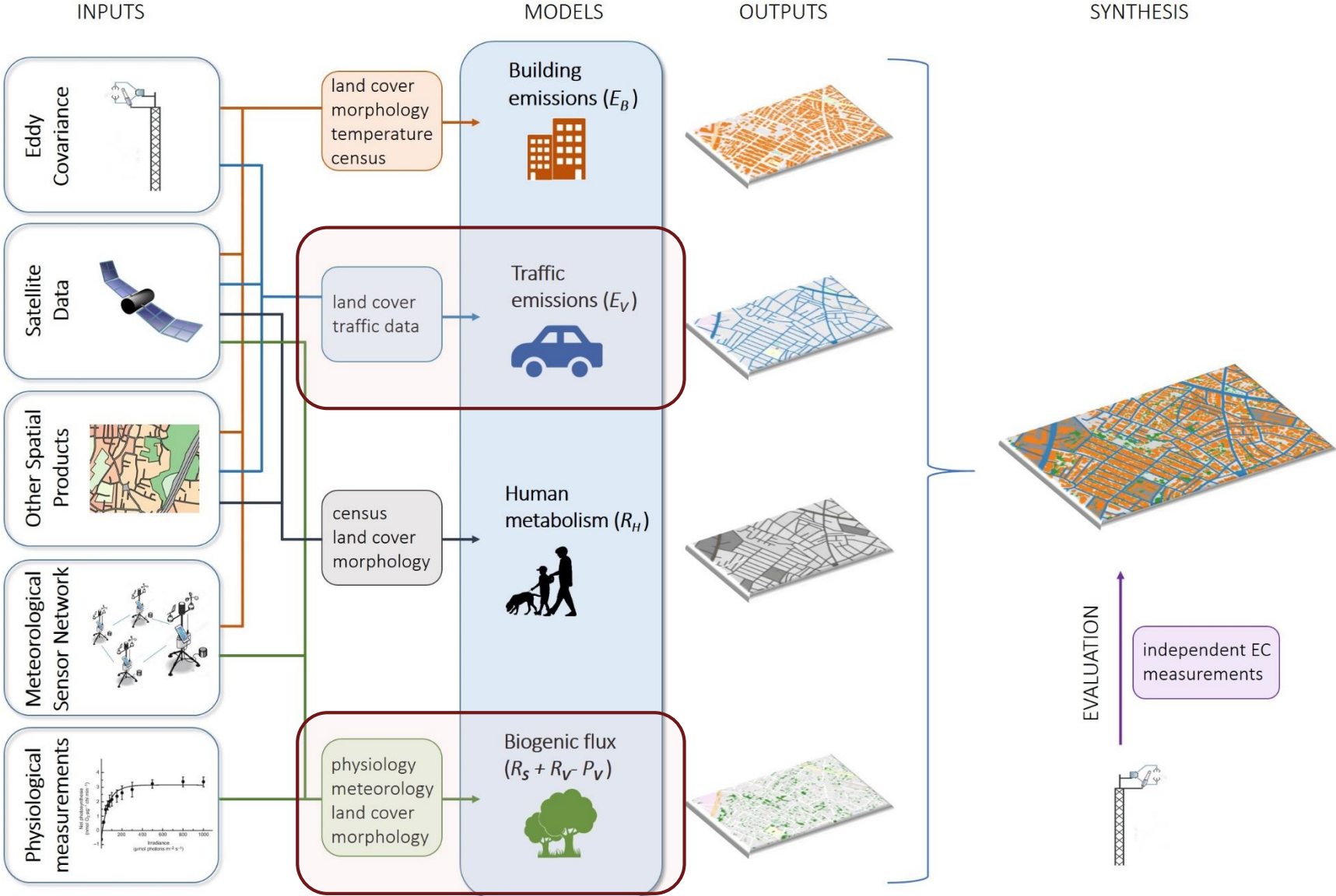
# Scope

Develop a robust methodology for mapping and monitoring the urban CO<sub>2</sub> flux at high spatial and temporal scales, meaningful for urban design decisions (neighbourhood, block, or building scale)

- › independent models for all the different components of the urban carbon cycle
- › interdisciplinary perspective: combine EC with EO capabilities
- › offer improved spatiotemporal urban CO<sub>2</sub> emissions' monitoring
- › Evaluate the developed methodology using independent local scale EC-measured  $F_C$ .

# Methodology

# Methodology



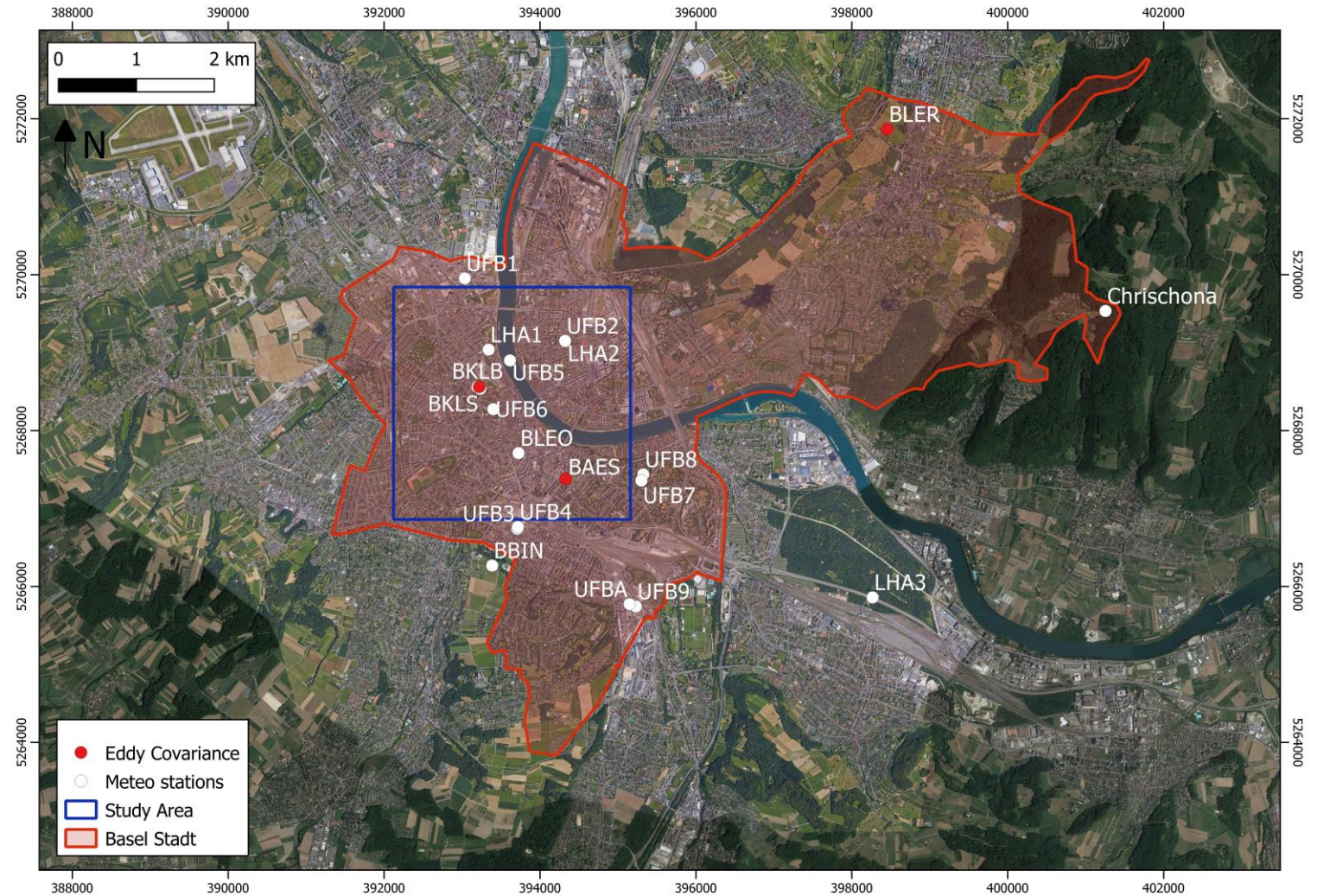
# Eddy Covariance

## 3 Eddy Covariance stations:

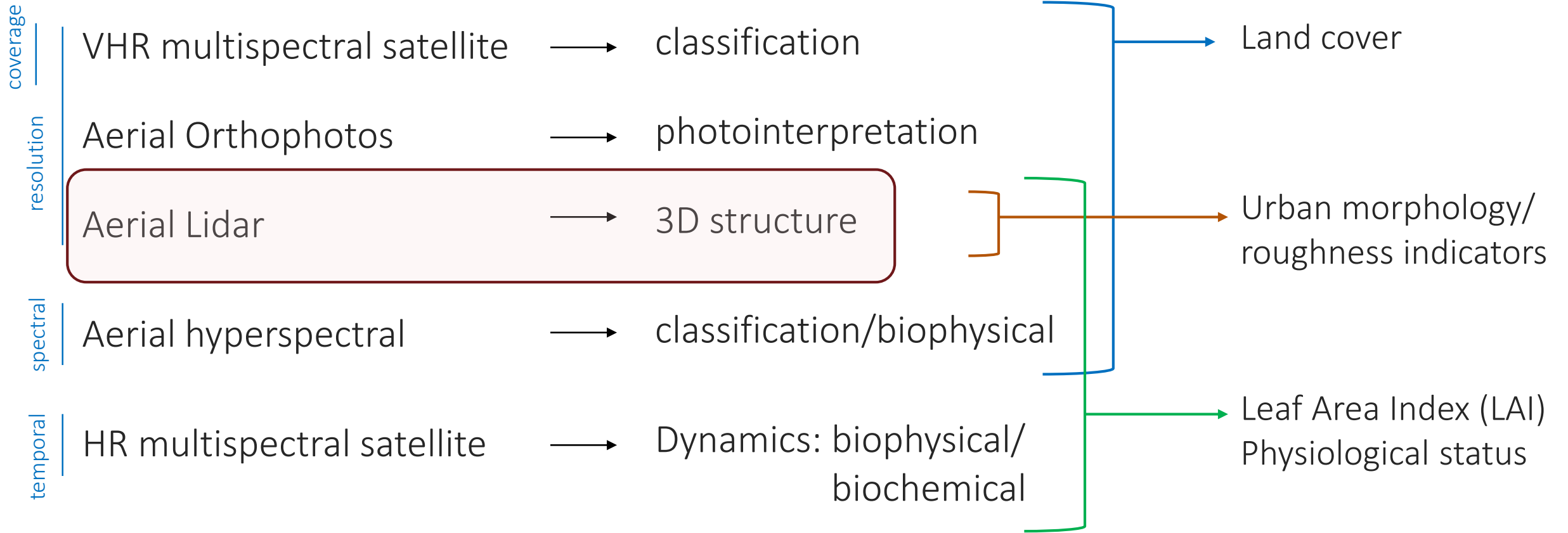
- BKLI (urban 15 years)
- BAES (urban 10 years)
- BLER (grassland 8(1) years)

## 15 meteorological stations

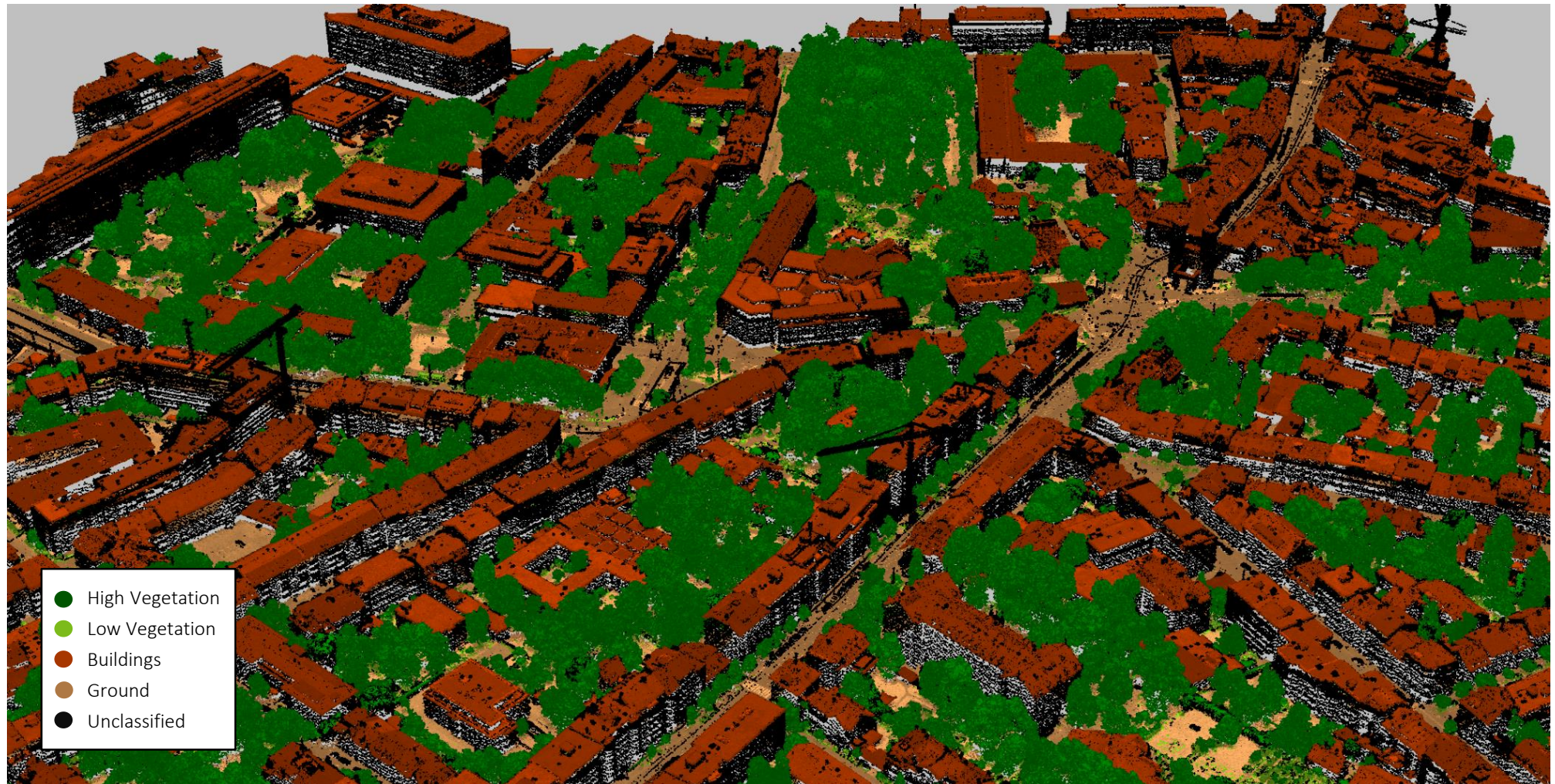
- UCL stations
- Street level stations
- Rural stations



# Earth Observation

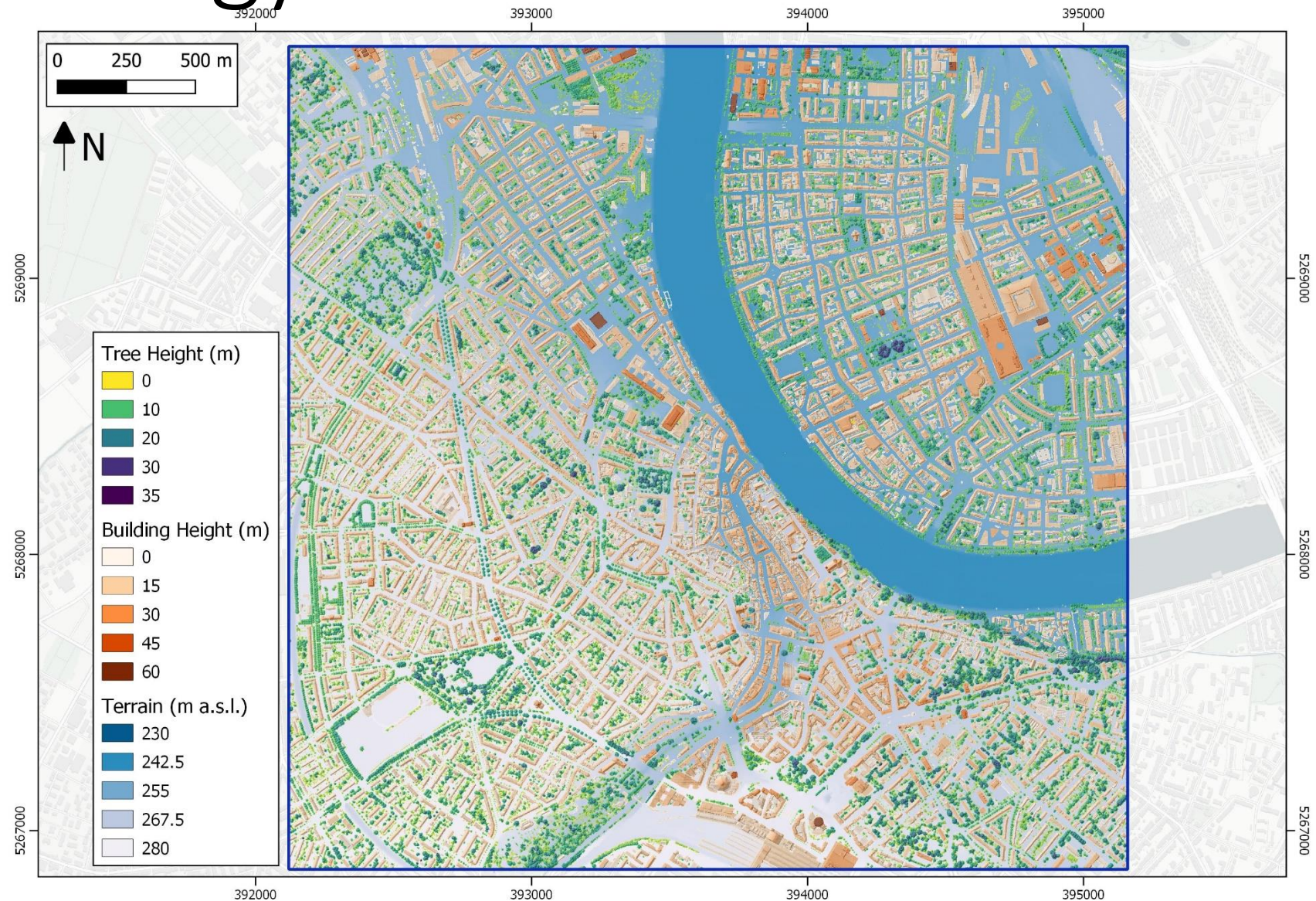


# Aerial LiDAR Data



# Urban Morphology

- Digital Terrain Model
- Digital Surface Model
  - Building Height
  - Tree Height
- Resolution 1 m



# Leaf Area Index (LAI)

- Beer-Lambert law approach for discrete-return LiDAR (Solberg et al. 2006):

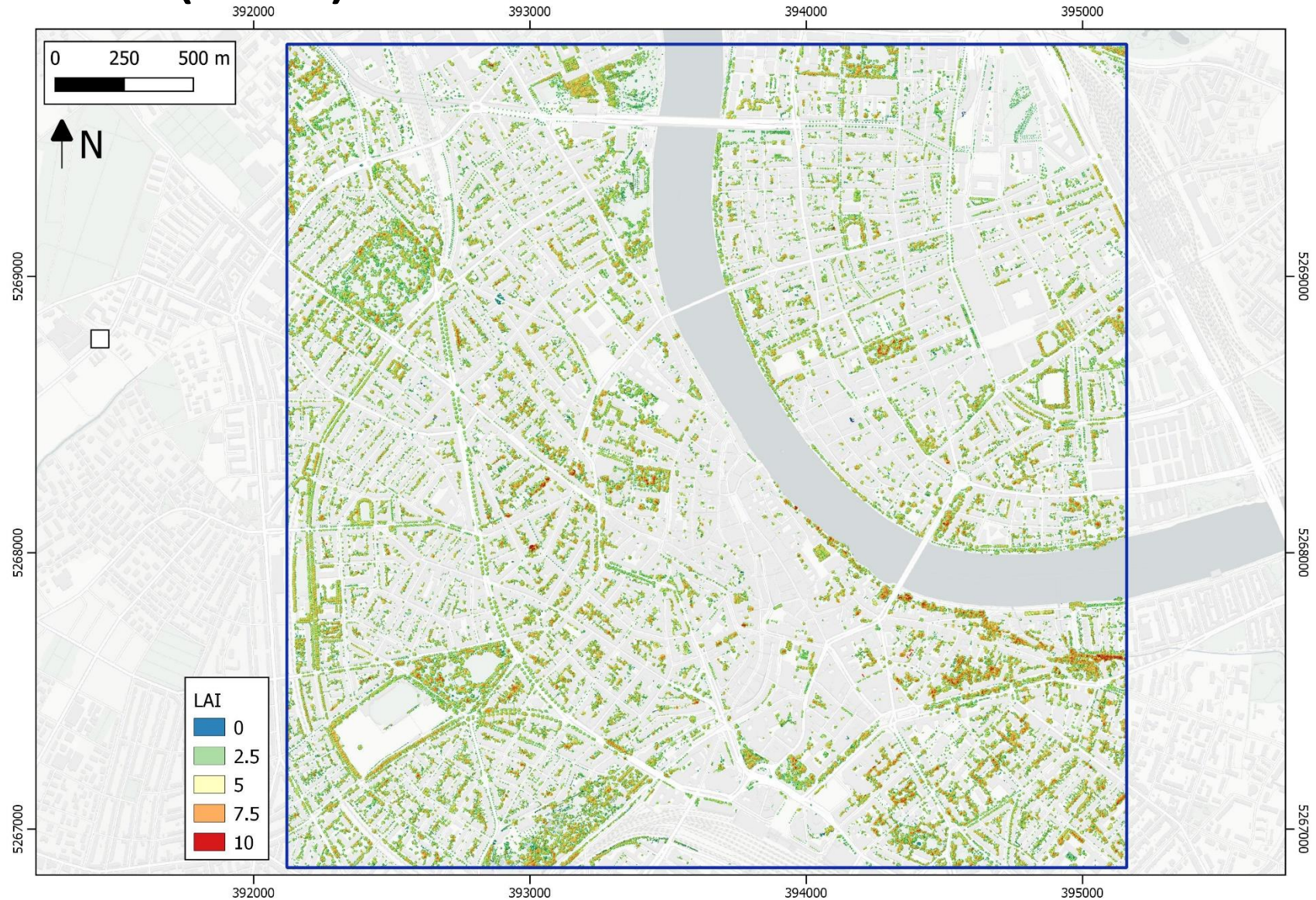
$$L_e = -\beta \ln(R_g/R_t)$$

$R_g$ : ground returns

$R_t$ : total returns

$\beta$ : constant, set to 2

- Estimated in 1 m resolution

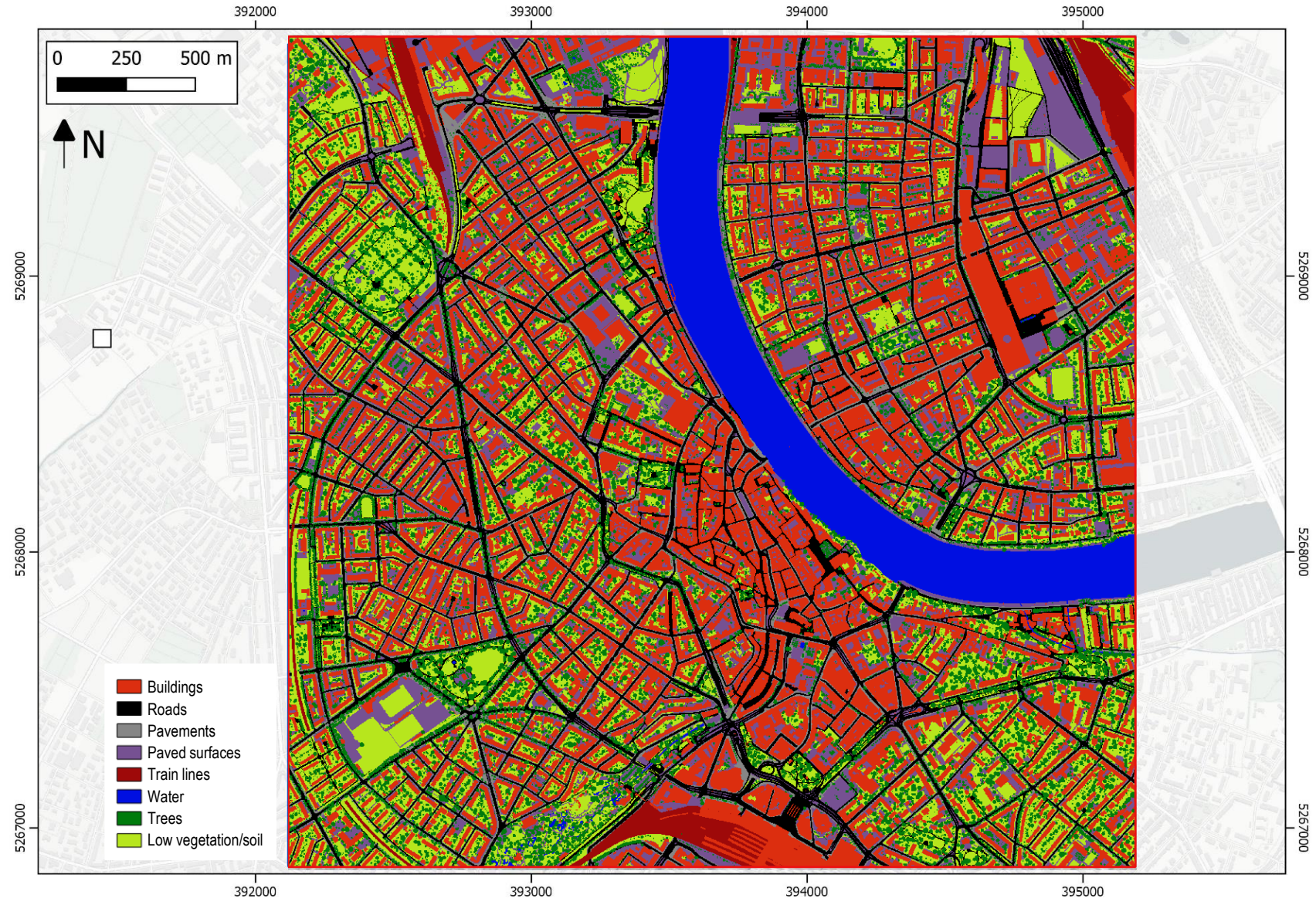




# Land Cover

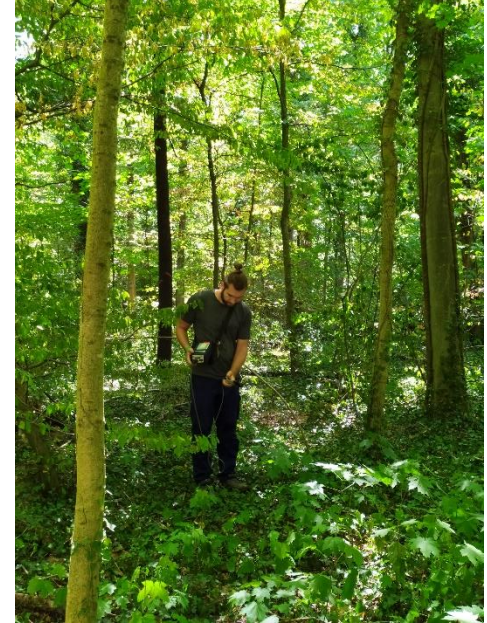
- Official survey of Basel-Stadt (<http://www.gva.bs.ch>)
- Lidar data

		BKLI	BAES
	Study area	400 m radius	400 m radius
Buildings	31.9	38.0	35.8
Paved	21.6	20.8	20.5
Trees	12.2	14.2	15.2
Grass-Soil	22.8	24.4	27.0
Water	6.5	0.1	0.0
Main roads	4.3	4.7	5.3
Tempo 30	6.6	7.1	6.7
Other road	3.4	1.4	1.5



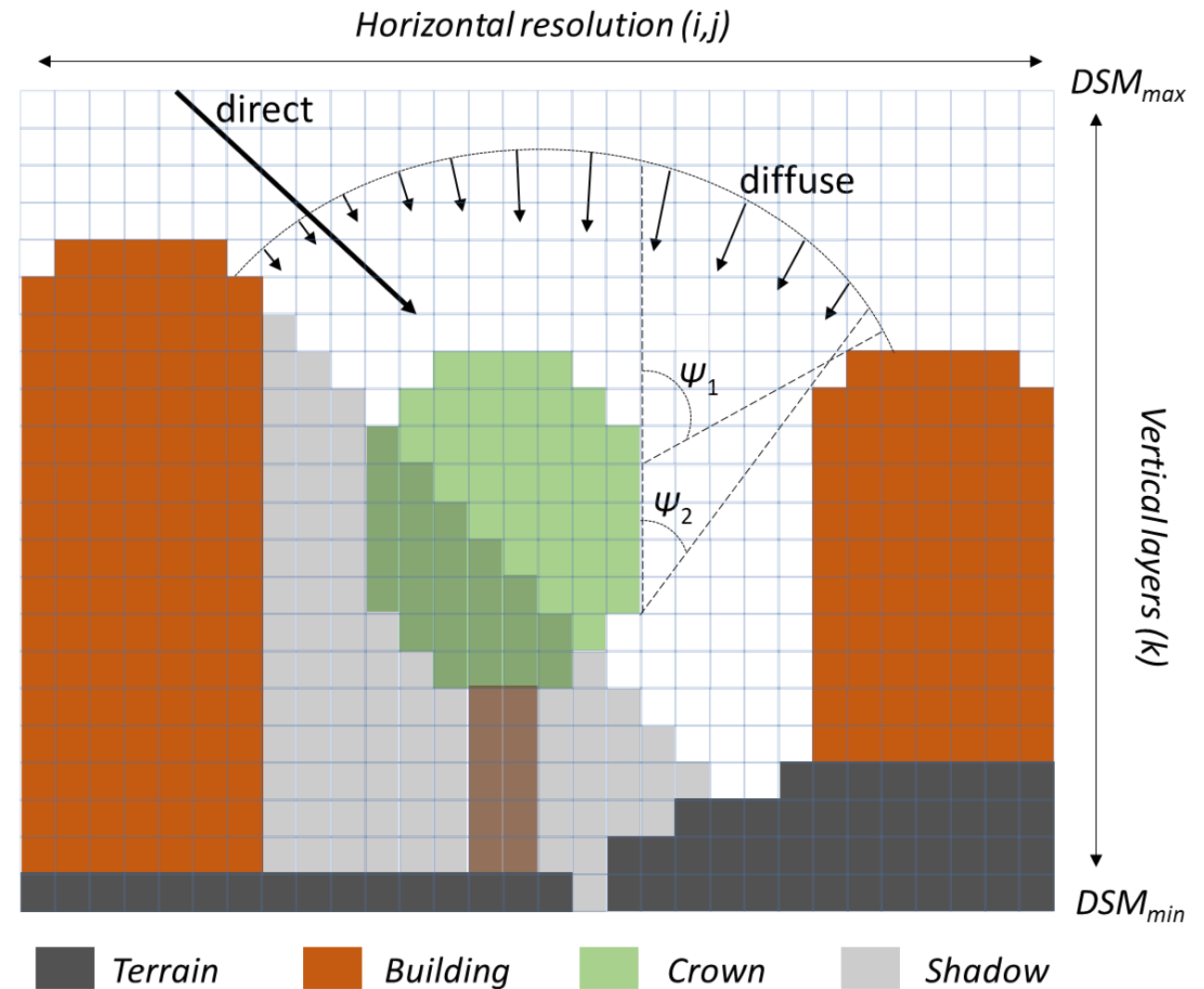
# Physiological *in-situ* measurements

- Leaf photosynthesis
  - $A_{max}$ ,  $A-PAR$ ,  $A-T_{air}$
- Leaf respiration
  - $R_{leaf}$ ,  $R-T$
- Soil respiration
  - $R_{soil}$ ,  $\vartheta$ ,  $T_{soil}$
- Soil Organic Carbon content
- Leaf Area Index (LAI)



# Urban Canopy Photosynthesis Model

- UCL expressed as 3D voxel grid
- Direct radiation modelling according to a ray tracing algorithm (Amanatides & Woo, 1987)
- Diffuse radiation modelling according to Sky View Factors (SVFs) per horizontal level and direction (Lindberg & Grimmond, 2011)
- 30 min step, 5 m resolution (horizontal & vertical)



# Urban Canopy Photosynthesis Model

- Beer-Lambert law for radiation reduction inside the canopy (Campbell and Norman, 1998)

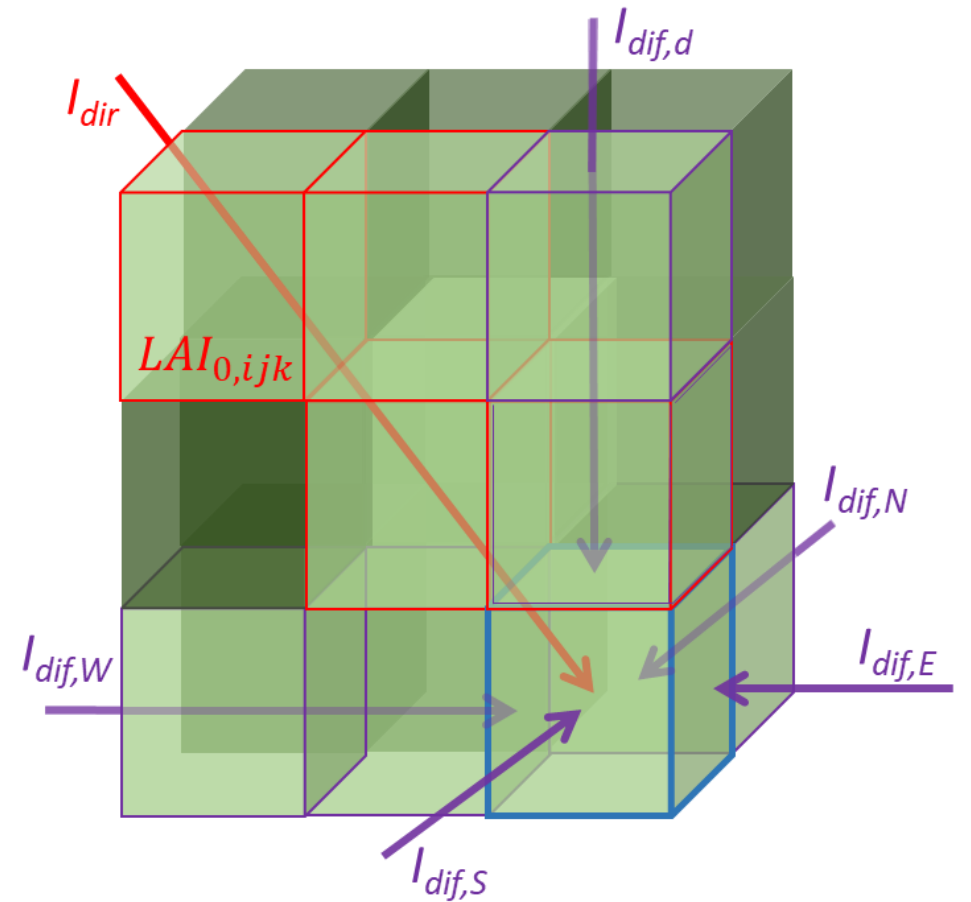
- Fractions of the sunlit and shaded LAI per voxel

$$LAI_{sun,ijk} = \frac{1}{k_b} * e^{-k_b LAI_{0,ijk}} * (1 - e^{-k_b LAI_{ijk}}) * Sh_{ijk}$$

- Leaf photosynthesis based on PAR (Ögren and Evans 1993), temperature (June et al. 2004), VPD (Leuning 1995) and  $\theta$  per voxel

- Canopy photosynthesis: sum of all horizontal layers

$$P_{V,ij} = \sum_{k=1}^n (A_{gross,I_{sun},ijk} * LAI_{sun,ijk} + A_{gross,I_{shade},ijk} * LAI_{shade,ijk})$$



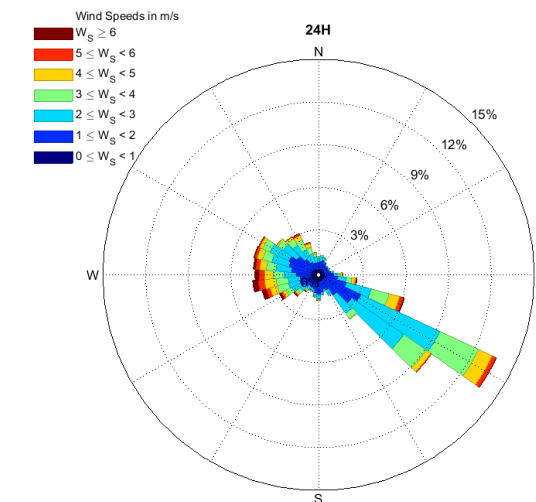
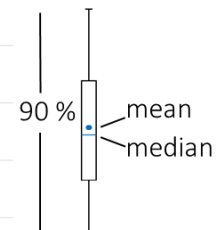
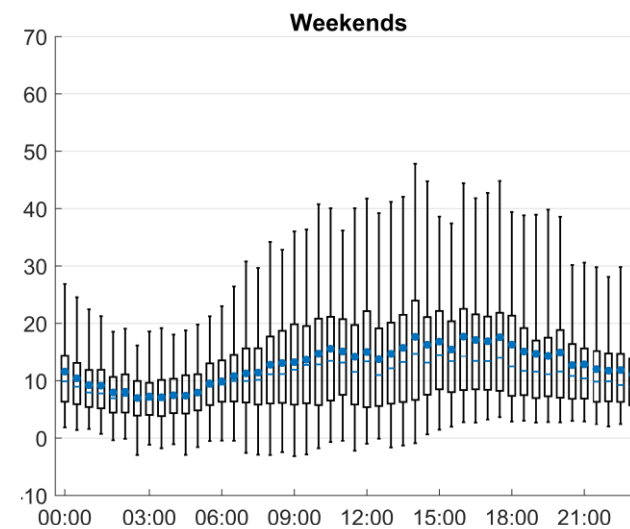
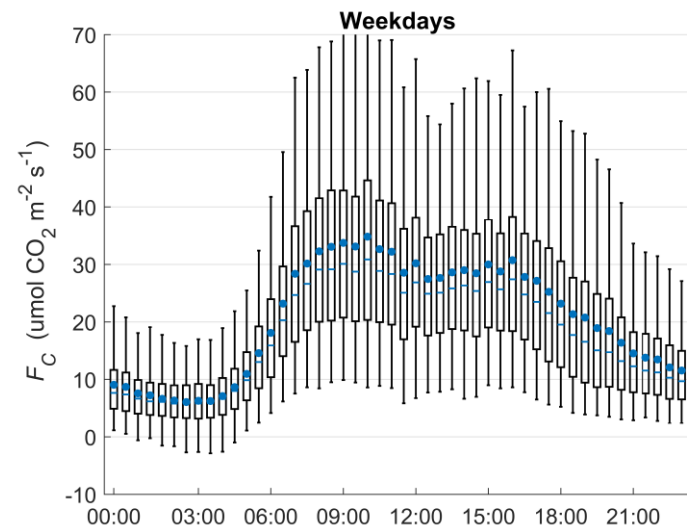
# Results

Anthropogenic fluxes

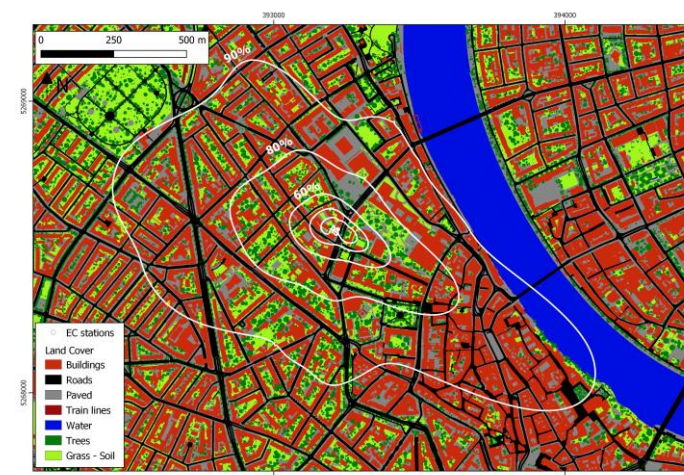
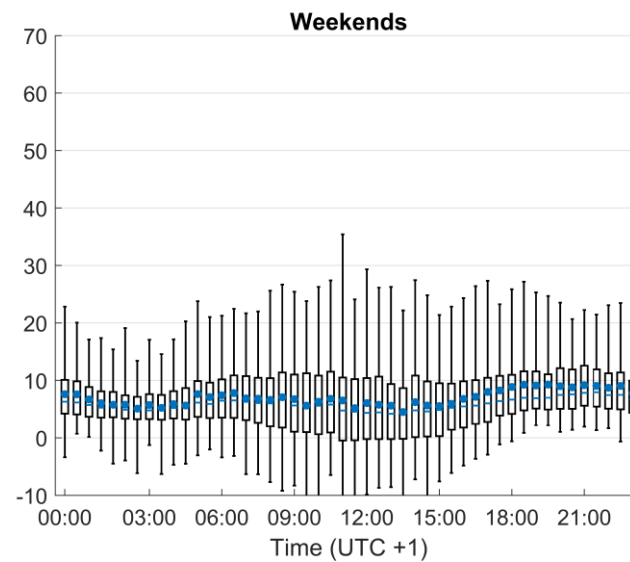
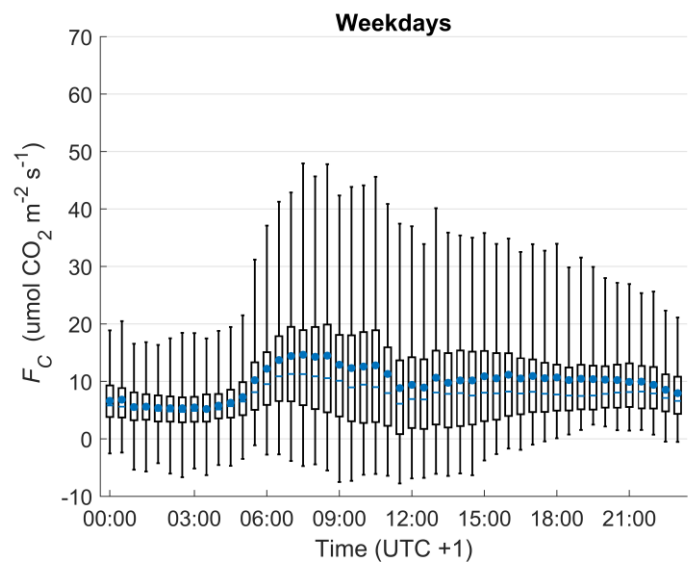
# Eddy Covariance

BKLI station (15 years)

East



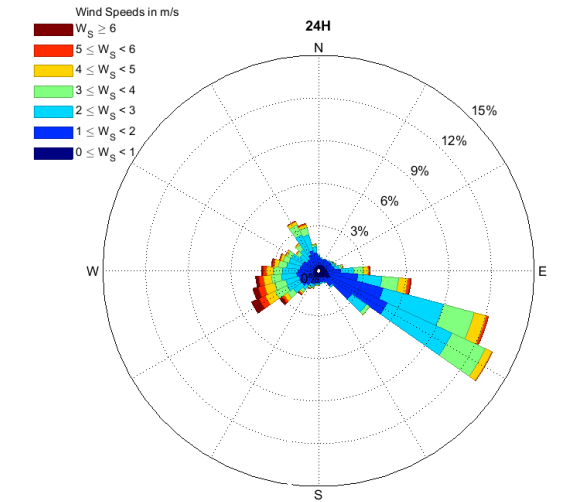
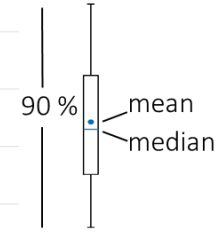
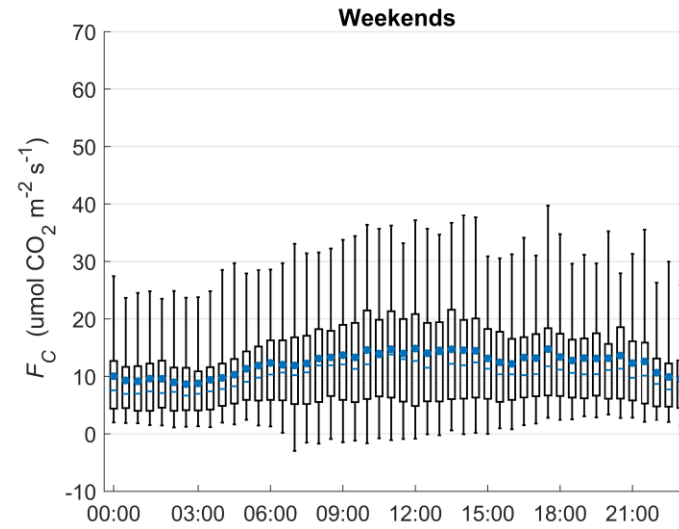
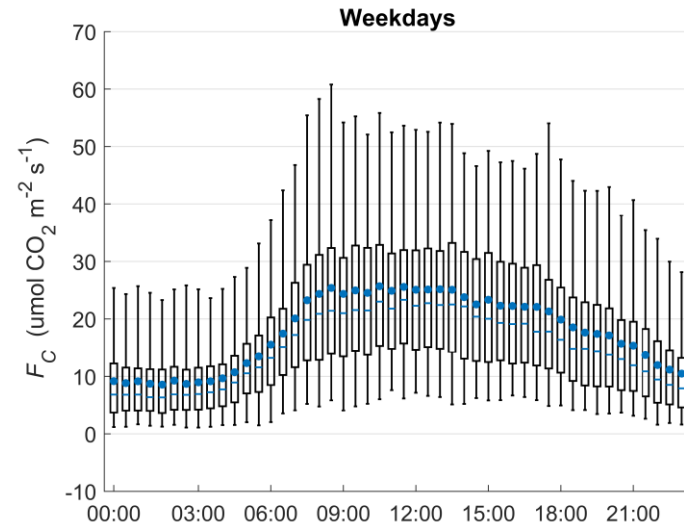
West



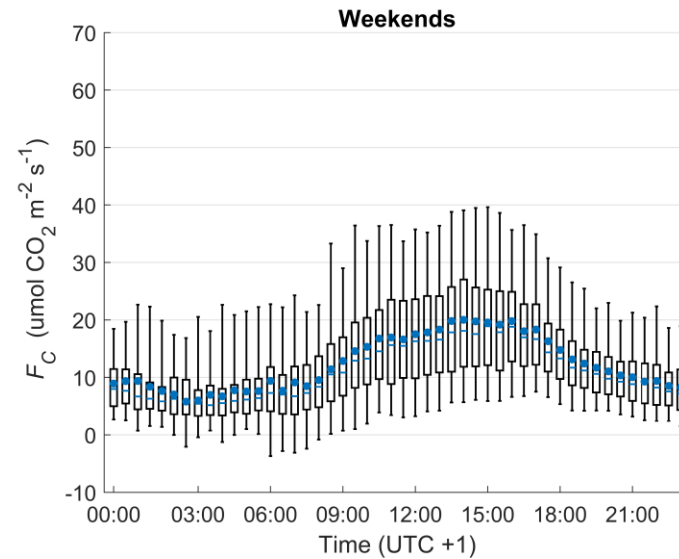
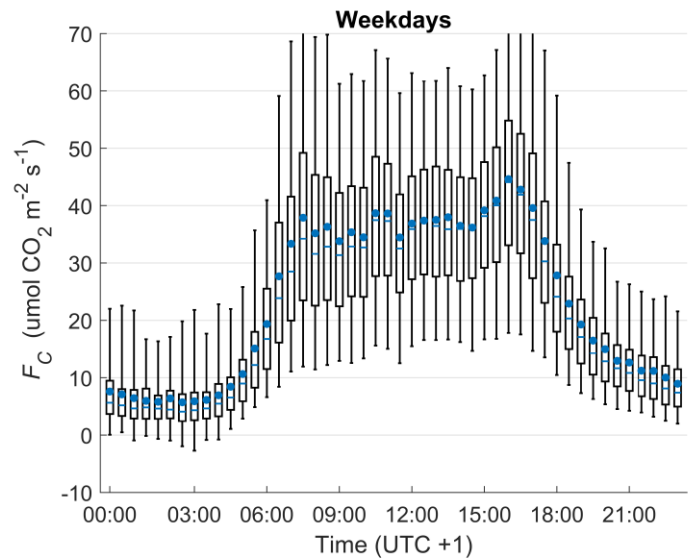
# Eddy Covariance

BAES station (10 years)

East

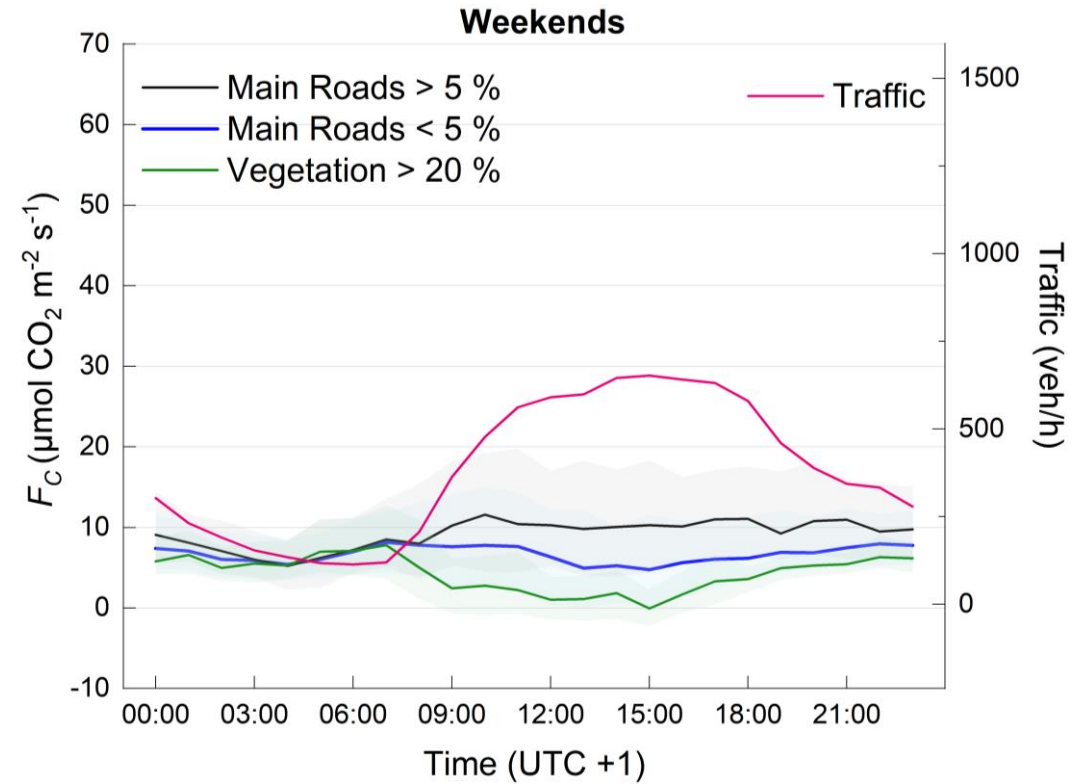
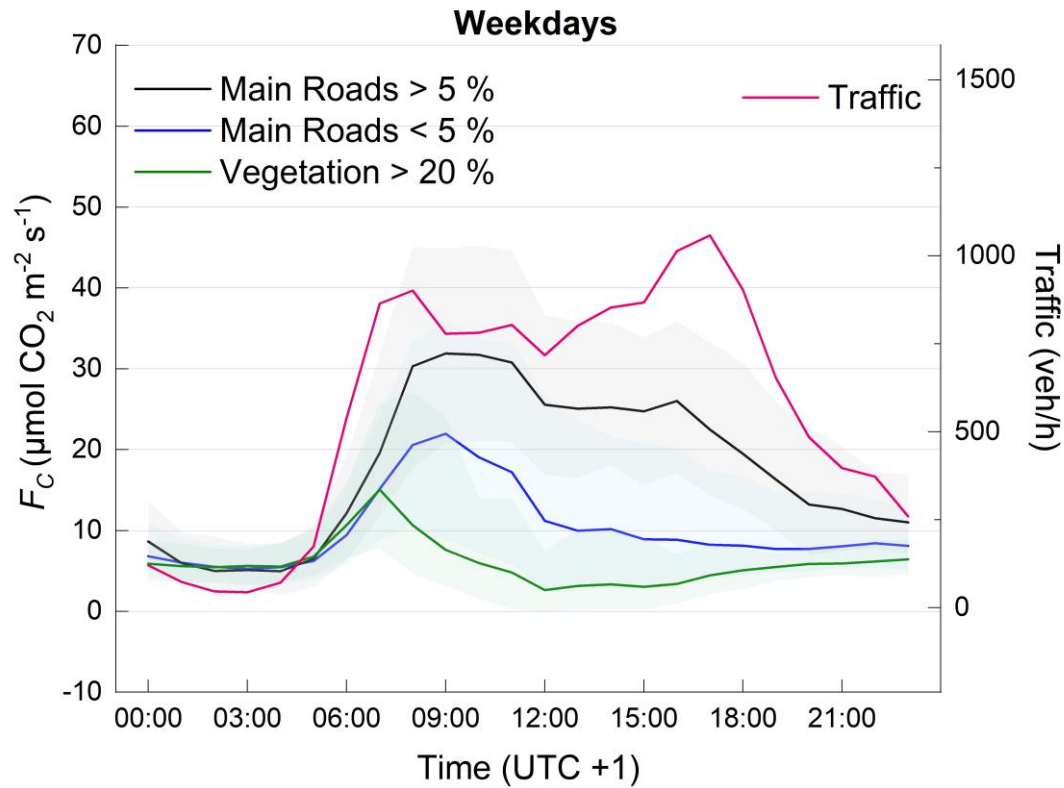


West



# Eddy Covariance – Land Cover

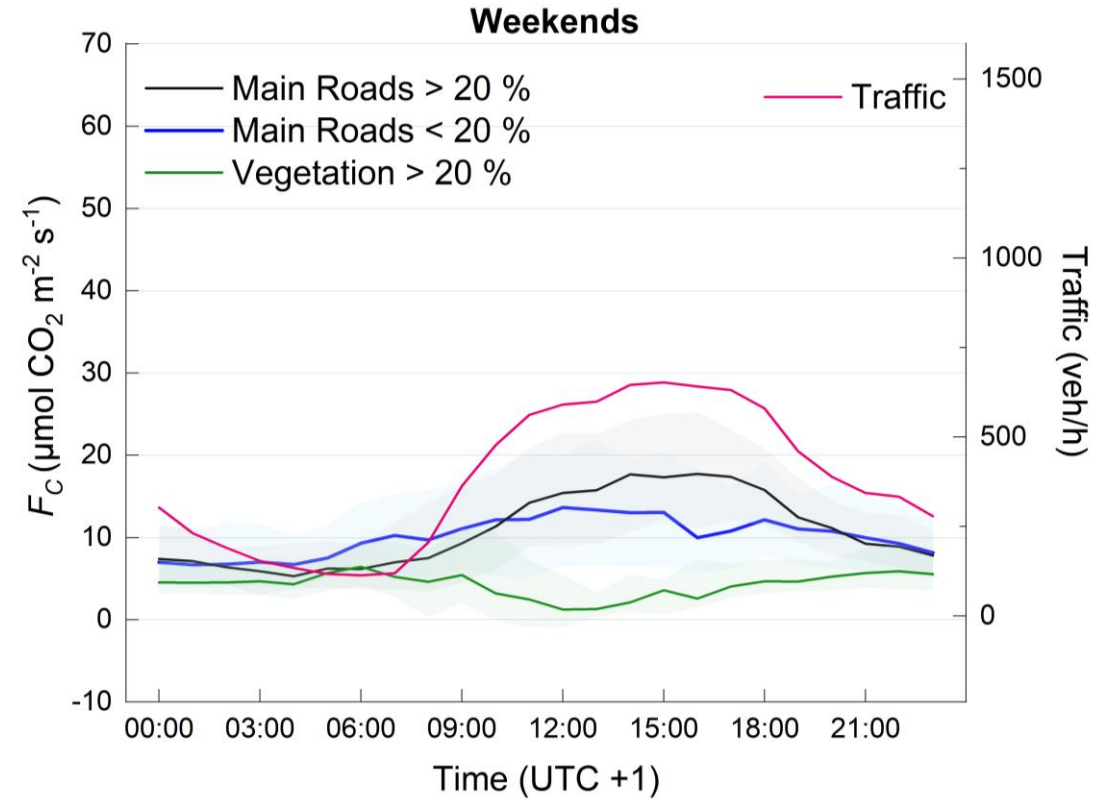
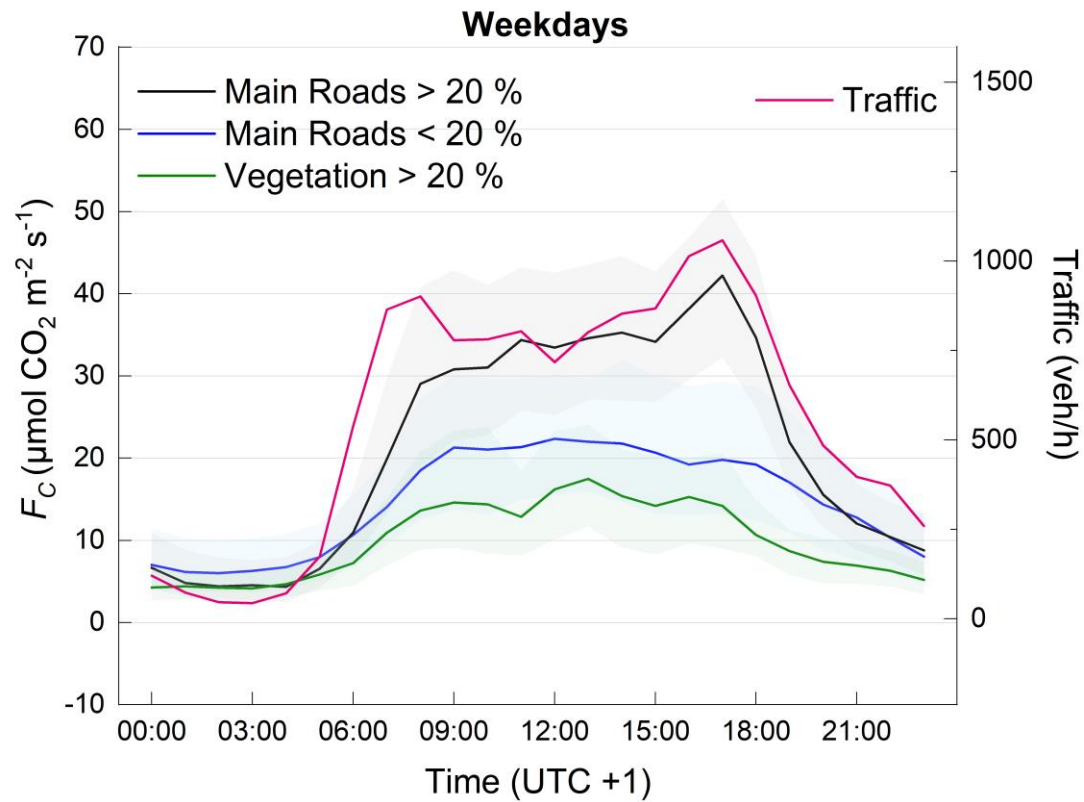
## BKLI station





# Eddy Covariance – Land Cover

## BAES station



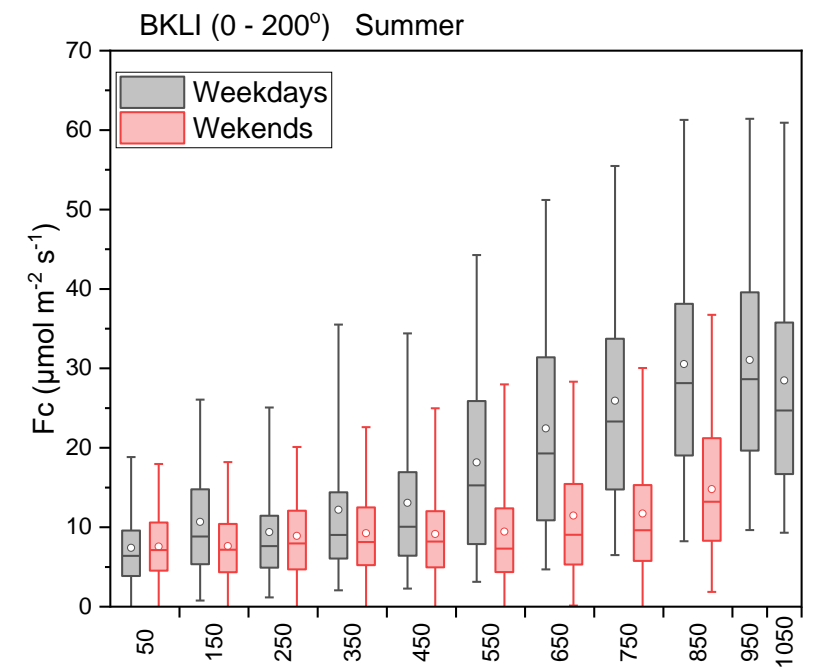
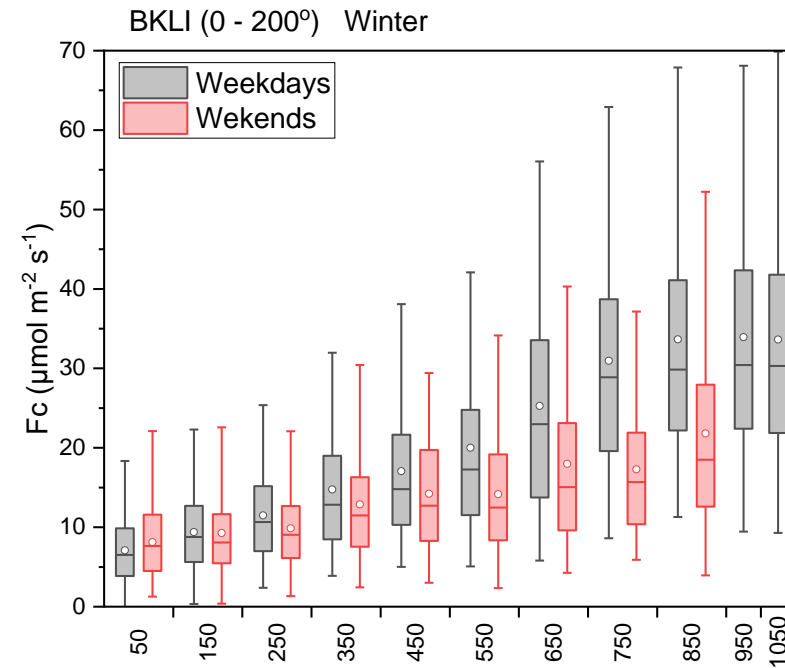
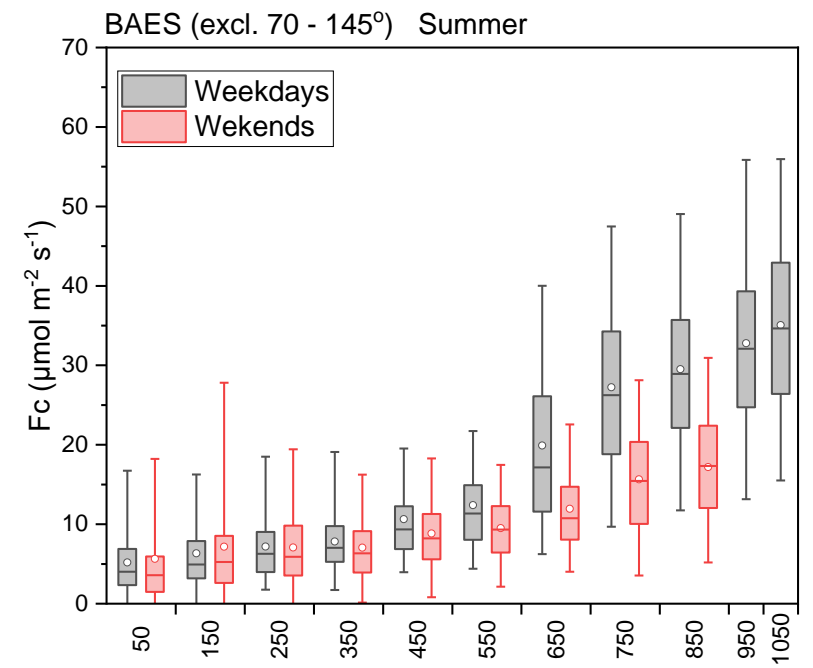
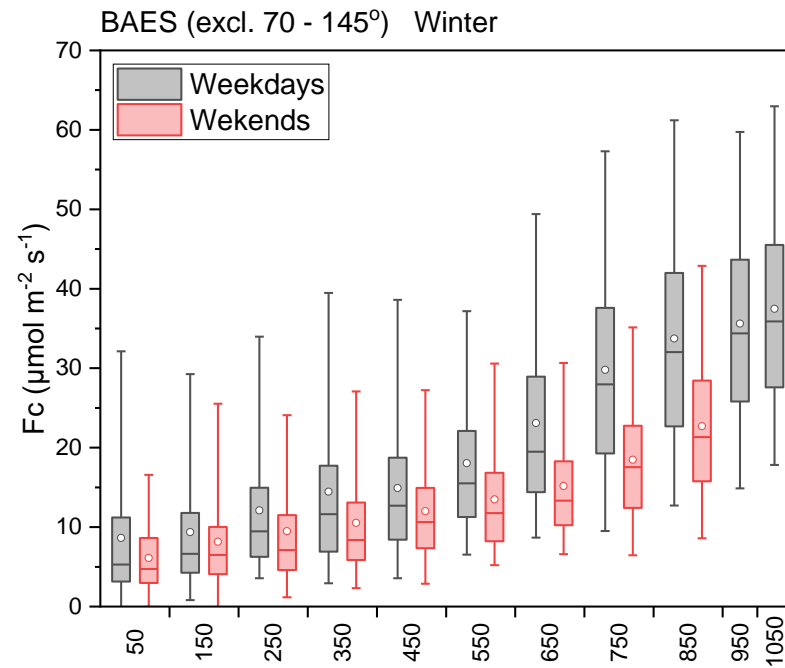
# Eddy Covariance - Traffic

*Different trends for weekdays – weekends indicate that traffic counts are not enough to explain  $F_c$  variability*

*The correlations are more clear in BAES due to the higher road fraction in  $F_c$  footprint*

*The winter space heating effect is clearer in BAES*

*Traffic counts have significant effect on  $F_c$  over 350 – 450  $\text{veh h}^{-1}$  (clearer for BAES)*



# Results

Biogenic fluxes

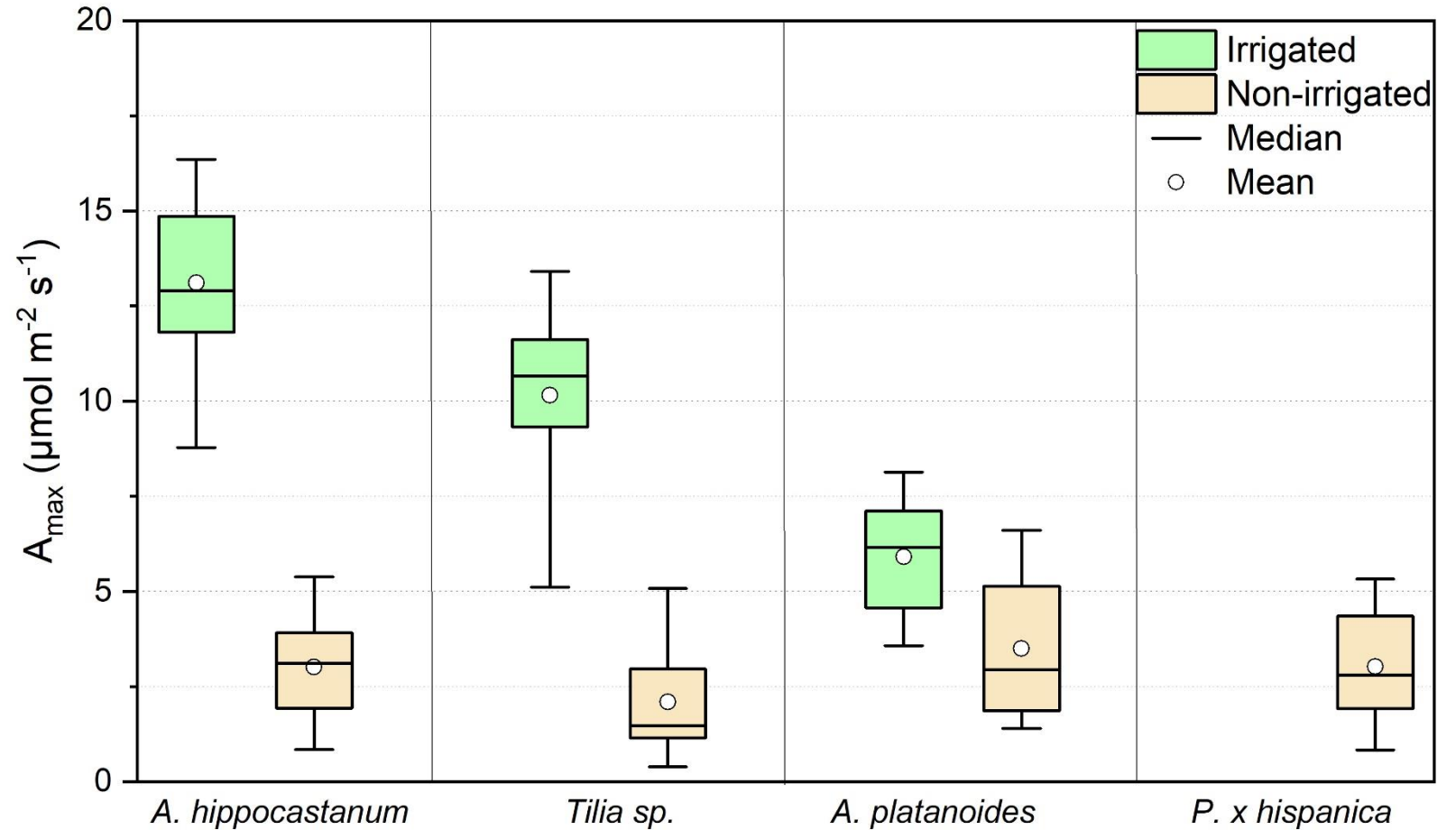
# Field measurements

Lift campaign 23 – 25 July 2020

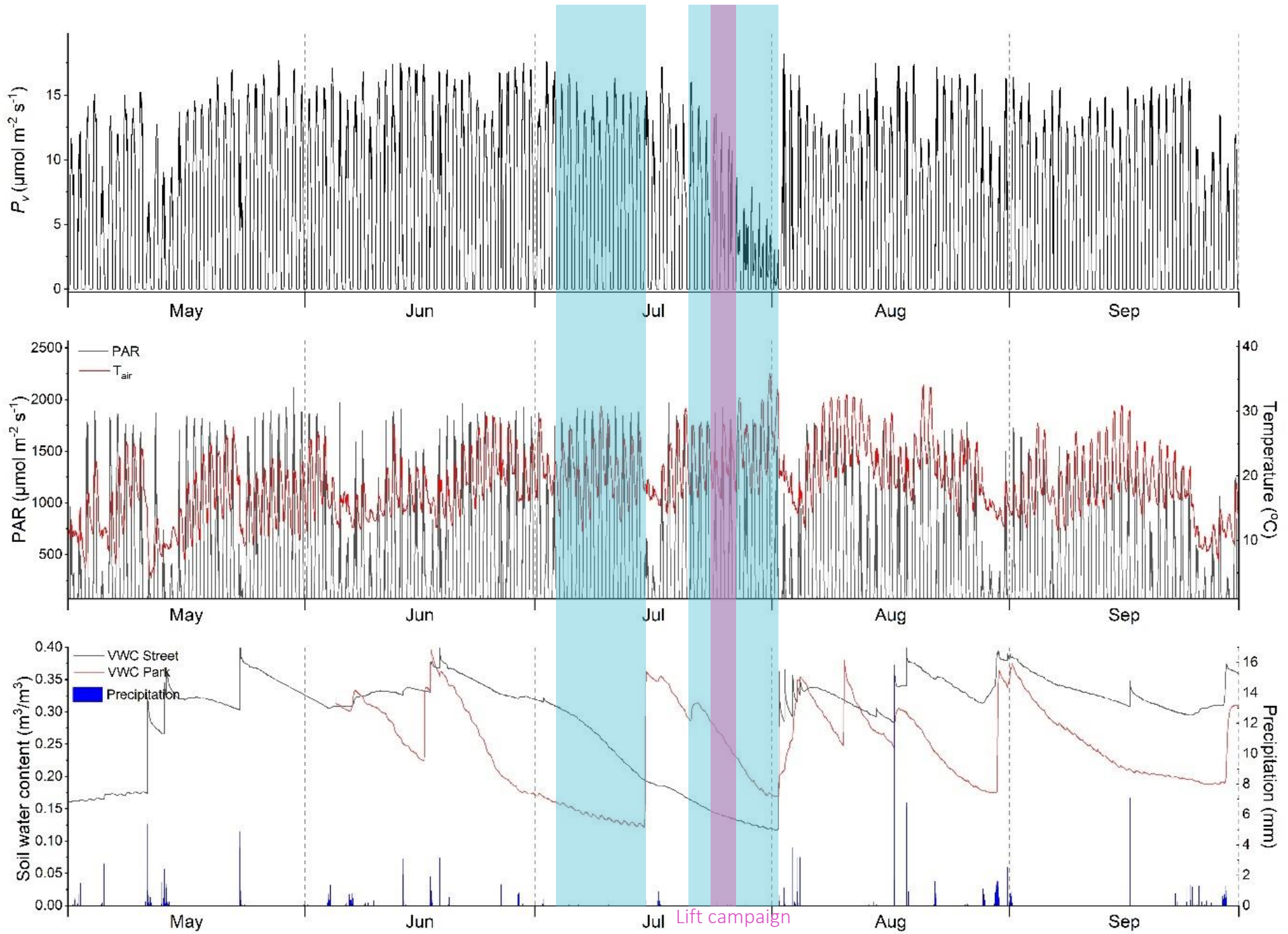
*Extreme variability in photosynthetic rates between irrigated and non-irrigated areas and across trees - species*

*Higher  $A_{max}$  during morning measurements (lower temperature, water saving strategies)*

*Only parks are regularly irrigated, street trees are probably constantly under water limiting conditions*



# Photosynthesis model



# Canopy Photosynthesis model

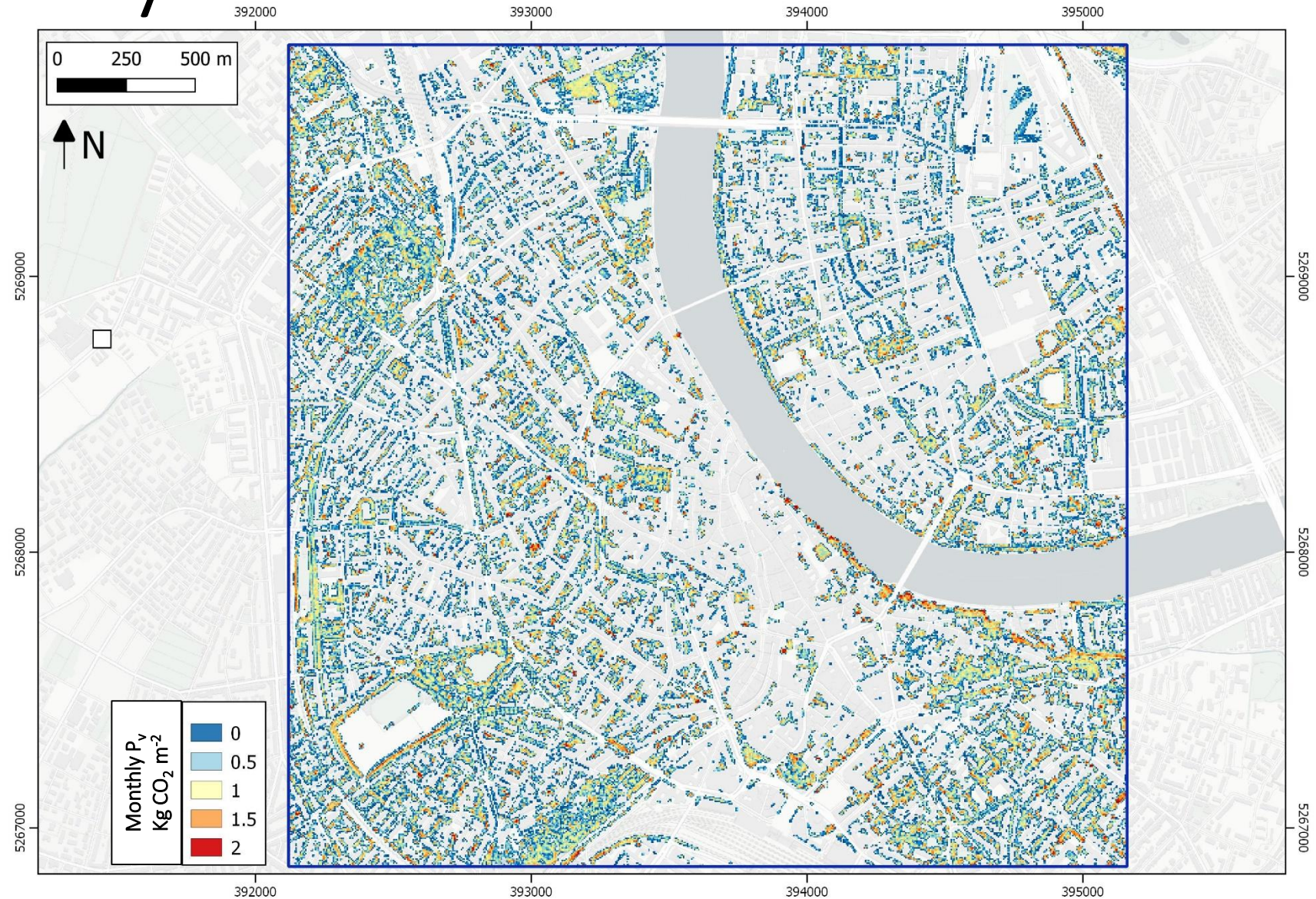
*Open areas seem more productive*

*Mean monthly gross sequestration:*

*- 0.55 kg CO<sub>2</sub> m<sup>-2</sup>*

*Balance in BKLI:*

*1.28 kg CO<sub>2</sub> m<sup>-2</sup>*



# Canopy Photosynthesis model

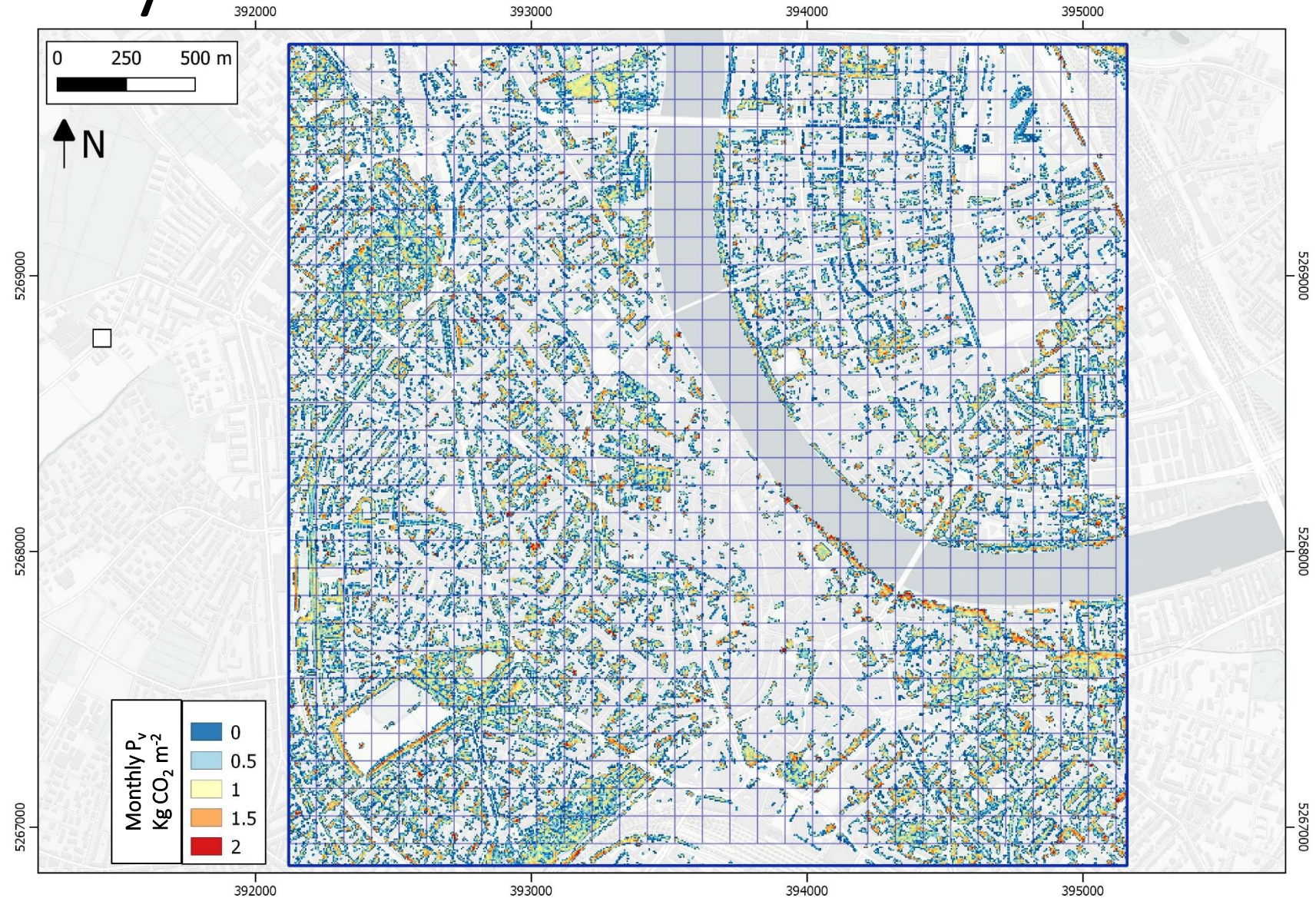
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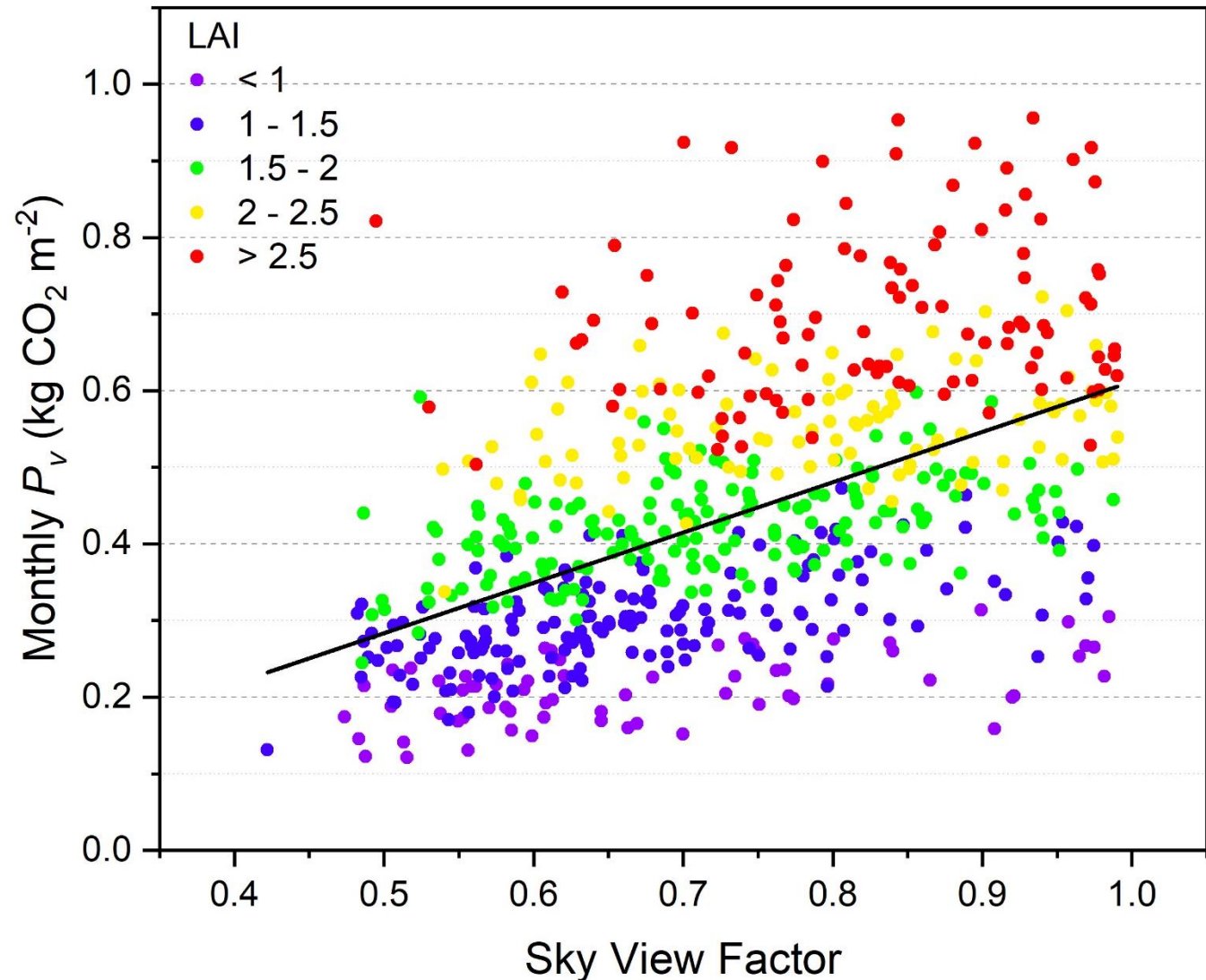


# Canopy Photosynthesis model

*100 m grid spatial analysis*

*$P_v$  spatial variability is related to LAI and Sky View Factor*

*Urban morphology suppresses carbon sequestration by reducing light availability to plant canopies*



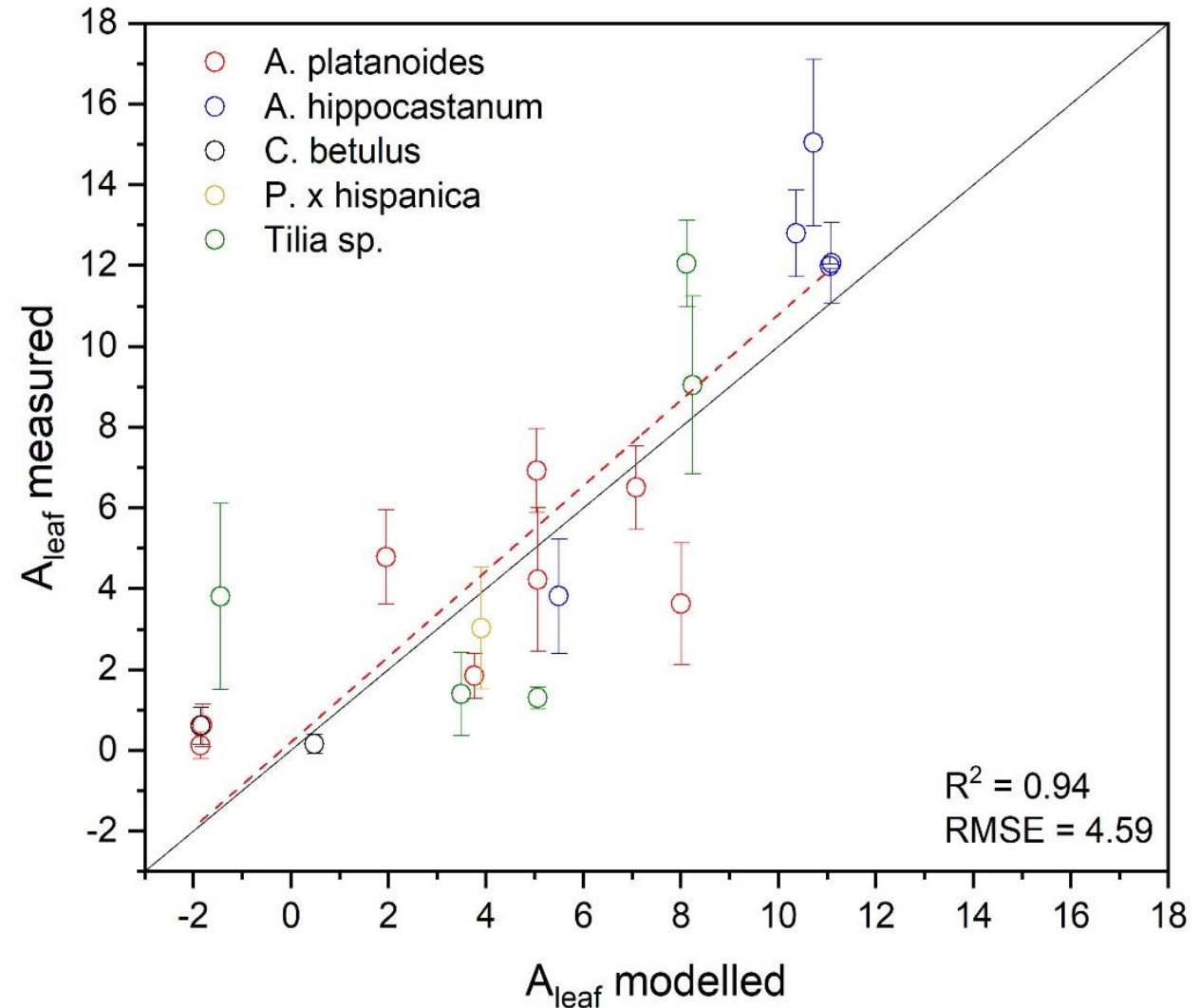


# Leaf level model evaluation

*Evaluation at leaf scale for all measurements of the lift campaign (23 – 25 July 2020)*

*Model run on  $T_{air}$  and VPD observed by the BKLI station during the lift measurements and  $\vartheta$  was measured at soil surface near the root of each tree (soil surface)*

*Canopy scale evaluation planned for next year*



# Conclusions

anthropogenic

- Vehicle traffic emissions is a significant controlling factor of  $F_C$  at both urban Basel sites and also the reason of the higher emissions measured in BAES station.
- Correlations between  $F_C$  and traffic counts are not straight-forward since other sources/sinks are always present.
- Traffic congestion may be more related to  $F_C$  than vehicle counts.

biogenic

- Photosynthetic rates ( $A_{\max}$ ) are extremely variable according to irrigation management at least during drought periods.
- Street trees are highly vulnerable to water stress.
- Carbon sequestration during drought conditions can be significantly reduced.
- Photosynthesis can potentially offset urban emissions up to 30 % during summer months.
- Sky view factor is an important urban attribute affecting canopy photosynthesis.

# Next Steps

anthropogenic

- Investigation of clear relationships between traffic measurements and EC-measured  $F_C$
- Determine the building heating emissions during winter according to air temperature, building volume and building type
- Modelling of emissions from human metabolism

biogenic

- Tree species classification using hyperspectral aerial imagery – Species-specific  $A_{\max}$
- LAI temporal variability according to Sentinel-2 imagery
- Include understorey vegetation and grasses in the biogenic models
- Model evaluation with Eddy Covariance (temporary installation) in an urban green area (summer 2021)

# Acknowledgements

This work is supported by the whole **Atmospheric Sciences team!**

Special thanks to **Dr. Roland Vogt** and **Dr. Christian Feigenwinter** for mentoring, advice and providing data. Students **Etienne Zubriggen** and **Miriam Mutti** are acknowledged for the gas chamber field measurements and lidar data analysis respectively. PhD student **Robert Spirig** is acknowledged for his continuous efforts on developing and updating the mcr meteorological database and his help on computer codes. **Günter Bing** is acknowledged for the technical support. Lidar dataset (LiDAR ALS 2018 Kanton BS) was provided by the **Tiefbauamt Basel-Stadt**, Infrastruktur, Geoinformatik Vermessung Dokumentation.



This project has received funding from the European Union's Horizon 2020 research and innovation programme under the Marie Skłodowska-Curie grant agreement No 836443

# Thank you for your attention!



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