

# Inverse Modelling of Ultrafine Particles Emissions in Copenhagen – A Case Study

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NATIONAL CENTRE FOR ENVIRONMENT AND ENERGY (DCE)

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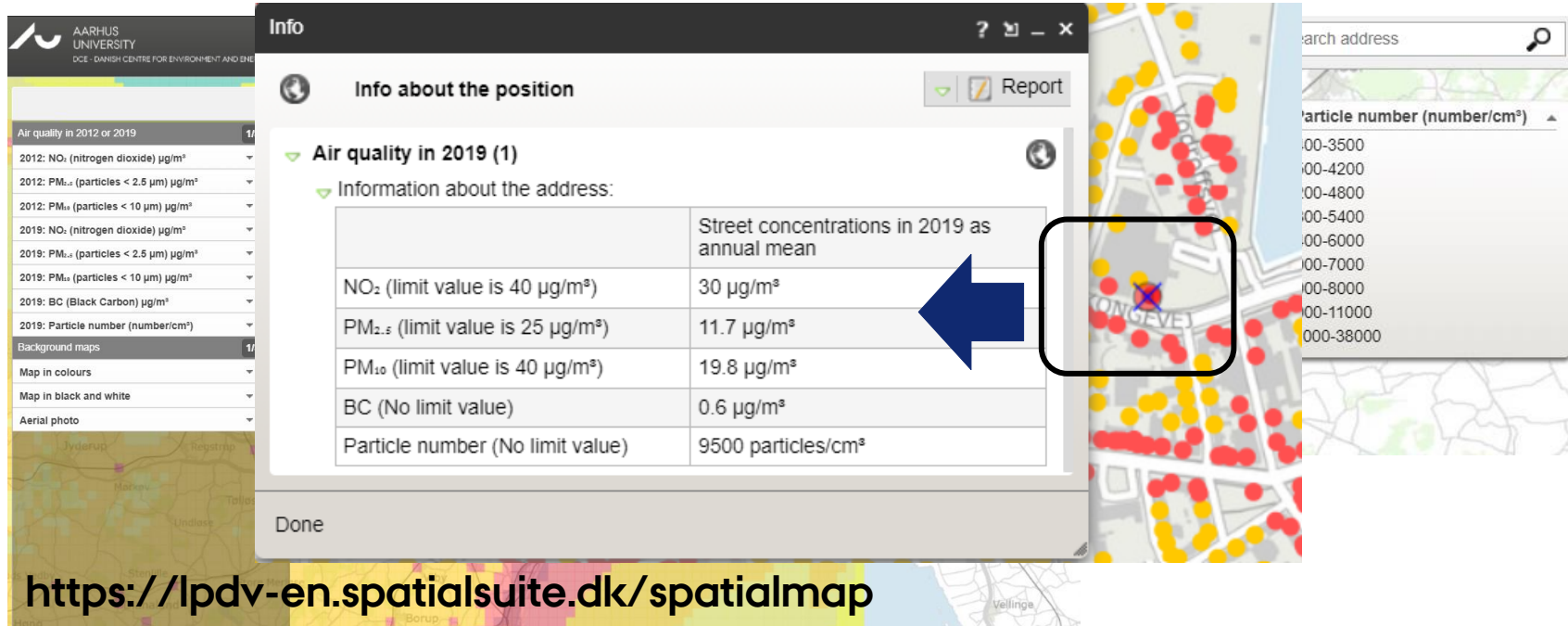
**Inverse Modelling Preliminary Results**

**Takeaways**



# Background and Motivation

## High-resolution air pollution modelling in Denmark



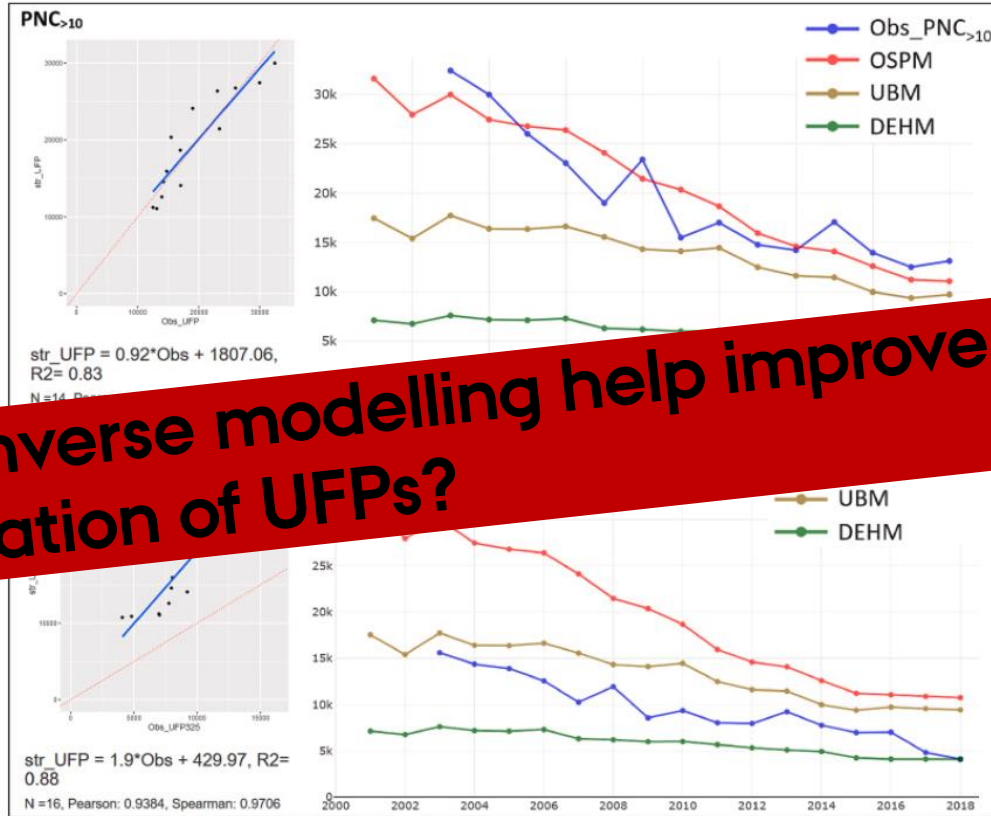
# Background and Motivation



Atmosph  
Volume 21

Modelling ultra  
concentrations  
in Denmark from  
1: Regional and  
mode

Lise Marie Fro  
Jørgen Brandt  
Marlene Schmidt Plejdrup<sup>a</sup>, Ole-  
Astrid Manders-Groot<sup>b</sup>, Ole Raas



**Can inverse modelling help improve the estimation of UFPs?**

Environment  
2021, 118633



article number  
press resolution  
art

er H. Christensen<sup>a</sup>,  
her Andersen<sup>a</sup>, Ulas Im<sup>a</sup>,  
meth Nielsen<sup>a</sup>,  
Denier van der Gon<sup>b</sup>,



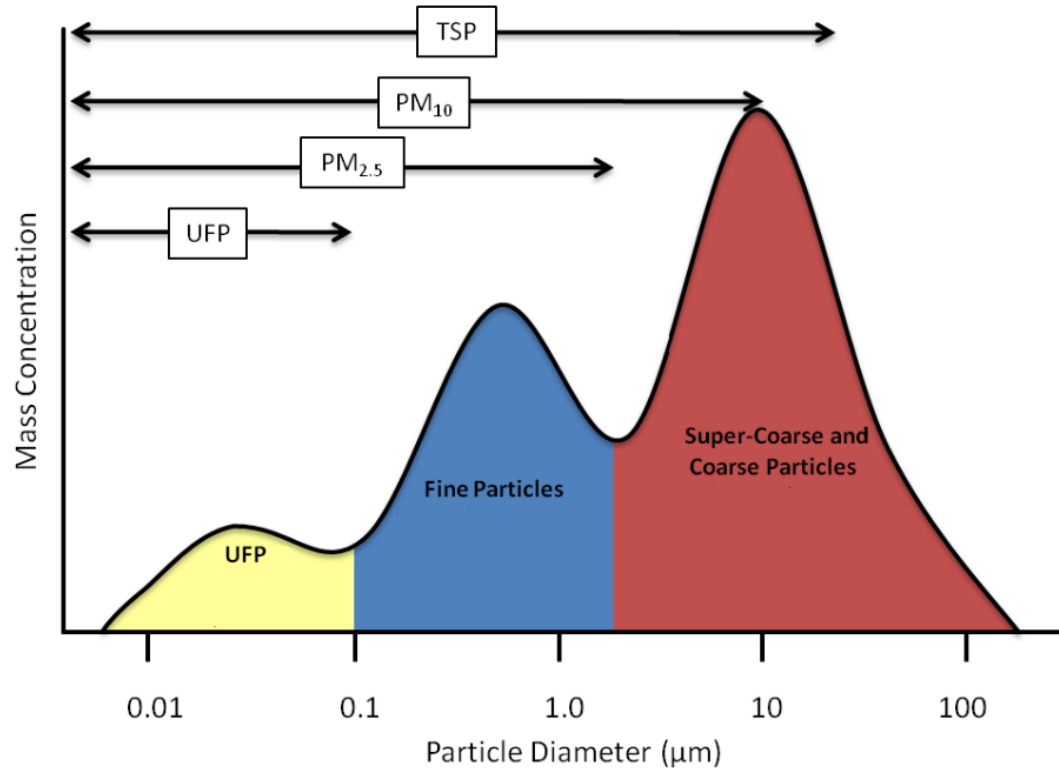
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# Background and Motivation

## What are UFPs?



# Background and Motivation

## Health effects of UFPs

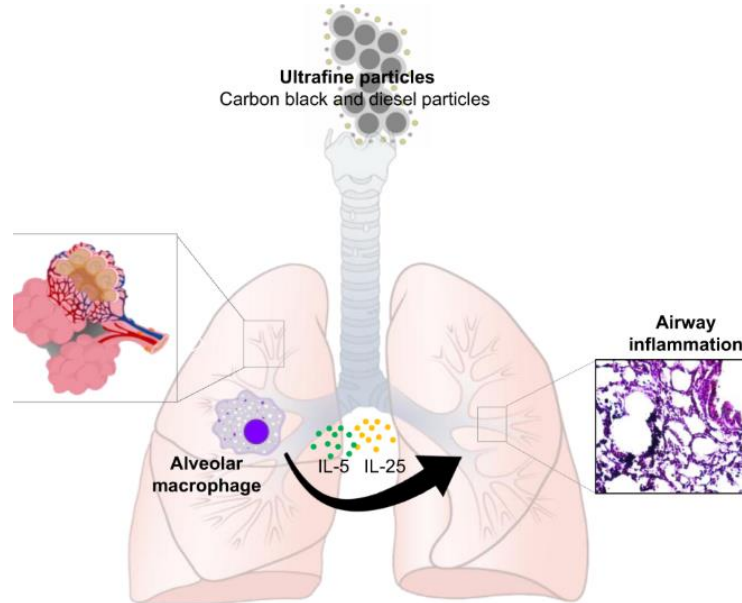
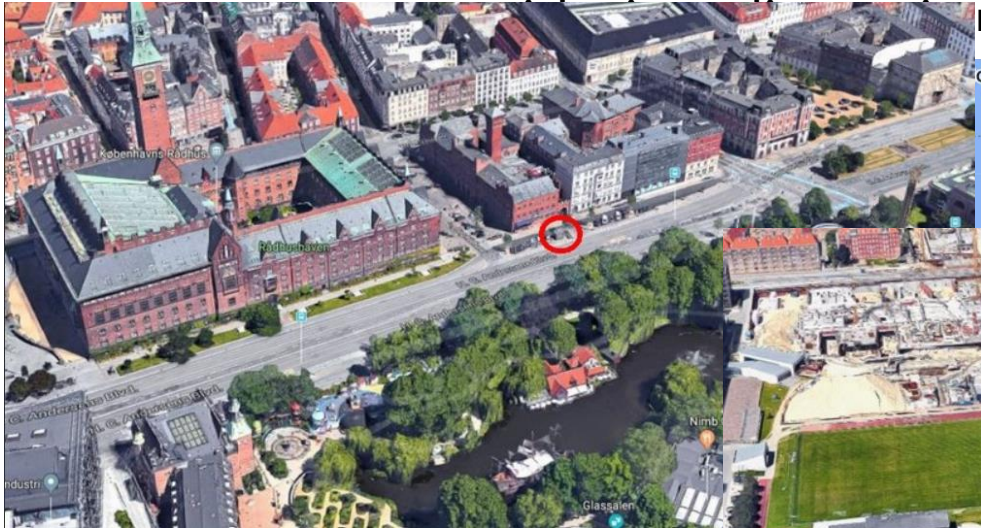


Image source: Leikauf et al. (2020)

<https://www.nature.com/articles/s12276-020-0394-0>

# PNC / UFP Measurements (Copenhagen)



Street station



City background



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# PNC / UFP Measurements

Hourly quality controlled measured data for 2021 and 2022

The same data from the background monitoring station

Meteorological and traffic data was also obtained

Mean diurnal patterns of PNC for weekdays were explored



**TSI's Scanning Mobile Particle Sizer (SMPS)**

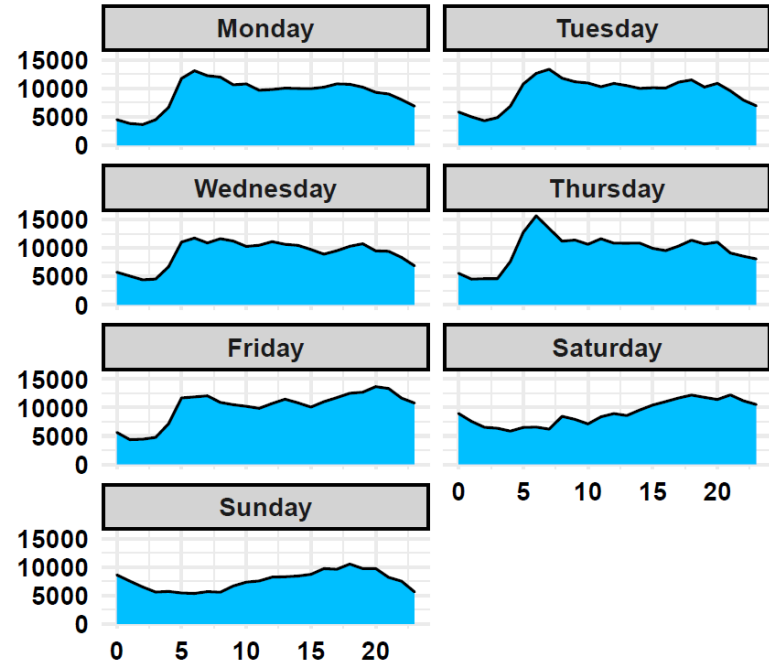
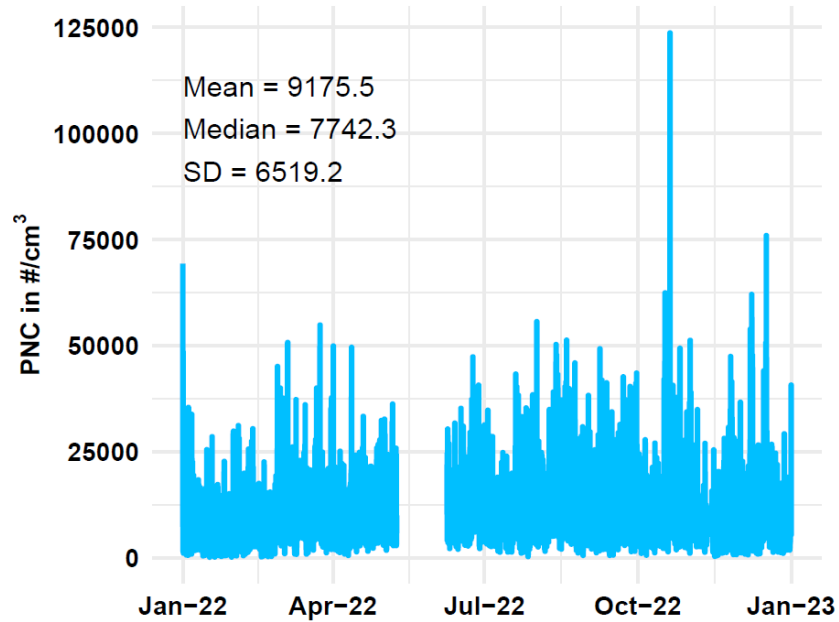
# Inverse Modelling

$$Q_h = \frac{C_h - C_b}{F_h(\text{met}) \times N}$$

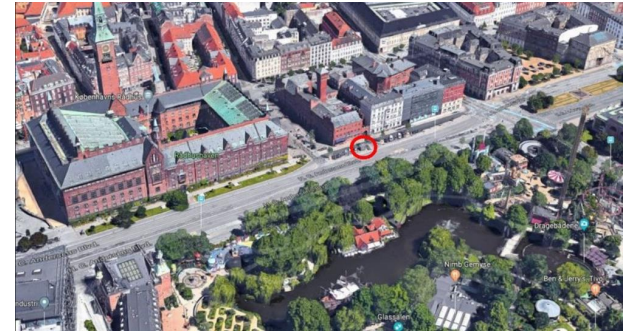
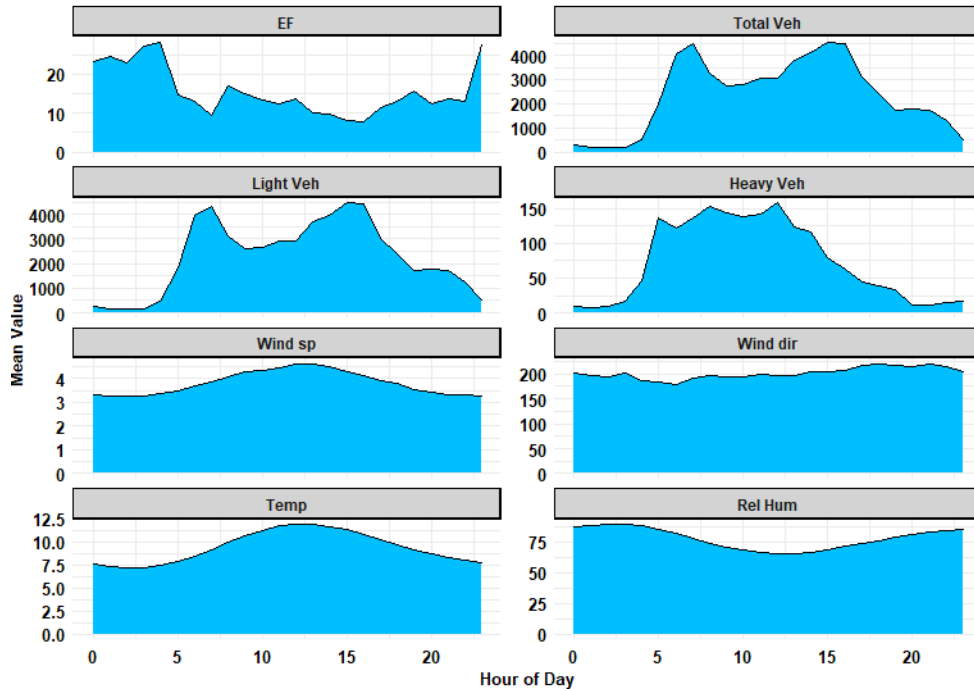
- ▶ Original method by Palmgren et al. (1999)
- ▶ Tested and implemented by, for example, Zhai et al. (2015) + more
- ▶  $C_h$  is the hourly measured street concentrations
- ▶  $C_b$  is the hourly measured background
- ▶  $F_h$  (met) is the hourly meteorological factor. N is the total traffic volume



# Measurements Results (2022)



# EF, Met and Traffic (Monday)



Measurement station (Copenhagen)



# Takeaways

Modelling PNC / UFP is challenging!

Inverse modelling (Classic, Bayesian and ML approaches) **may potentially** help improve the knowledge of emission factors

Good quality measurements are crucial but how to upscale (a challenge!) → Cost-effective → Partector 2



Aarhus University's Department of Environmental Science  
Campus in Roskilde, Denmark

Thanks for listening!



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