

# Estimates of Population Exposure to Airborne Pollutants in a Real City: Sensitivity Analysis to the Spatial Resolution of the Pollutant Concentration and Population Data

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## INTRODUCTION

- The impact of air pollution on human health is an important problem in urban areas because of the high pollutant concentration, and the increased percentage of people living in cities.
- Population exposure is rather challenging to estimate due to:
  - the complex spatial distribution of pollutant concentration;
  - the usual coarse spatial resolution data of the distribution of population.
- Population exposure to atmospheric pollutants and the associated impacts on human health has been estimated in the literature by using distribution of pollutant concentration and population with very different spatial resolution (from several kilometers to few meters) and different approaches to assign pollutant concentration to population (Rivas et al., 2019; Izquierdo et al., 2020; Gamarra et al., 2021).
- To determine which part of population is exposed to a certain pollutant concentration is crucial.

## METHODOLOGY

- Starting point of this study is the outcomes of Rivas et al. (2019) because:

- Annual average NO<sub>2</sub> concentration was modelled by means of Computational Fluid Dynamics (CFD) simulations at high spatial resolution in an entire mid-size city (Pamplona, Spain)
- NO<sub>2</sub> modelled concentration were successfully evaluated using data from the city network of AQMSs and from a network of mobile microsensors carried by cyclist around the city.
- Spatial distribution of the population of the city at high resolution (100 m x 100 m) was available from municipal census

### Total Exposure Estimates:

- Annual averaged NO<sub>2</sub> concentrations and population data are aggregated at different spatial resolutions ranging from a grid cell size of 100 m x 100 m to a coarser resolution where the whole city is covered by only one cell (6 km x 5 km).
- Total population exposure is estimated with the different spatial resolution data set and compared with base case (case with highest resolution) as reference (Objective 1 and 2).
- Extracting the annual average NO<sub>2</sub> concentration at the location of AQMSs from the high-resolution map and estimating the population exposure with these concentrations (Objective 3).

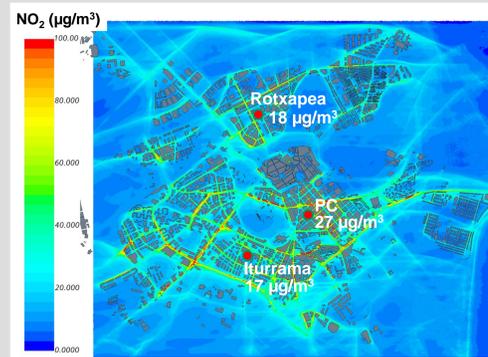


Fig. 1. High-resolution map (~m) of 2006 annual averaged NO<sub>2</sub> modelled concentration in Pamplona, Spain. Red dot: location of AQMS and the values indicate the annual averaged NO<sub>2</sub> concentration.

## RESEARCH QUESTION AND OBJECTIVES

- Research question:**  
How much can be the error of the population exposure estimates in a real city due to the resolution of spatial distribution of concentration and population (quality of input data) and the methods to associate both variables?
- Main objectives:**
  - To quantify the sensibility of the population exposure estimates in a real city to the resolution of the spatial distribution of both air concentration and population (quality of input data).
  - To determine the resolution required for an appropriate population exposure estimate. Also, in cases with very coarse resolution of available population data, to investigate how to associate pollutant concentration to population, to reduce uncertainties of the total population exposure estimates.
  - To assess the uncertainties of population exposure estimates using Air Quality Monitoring Stations (AQMS).

## DESCRIPTION OF THE STUDY AREA

- Study focused on Pamplona, located in North of Spain. A medium-size city: around 25 km<sup>2</sup> and 195650 inhabitants
- Street and building characteristics change depending on the neighbourhood of city.
- AQMS network is composed by three stations located in three neighbourhoods: two of urban background (Iturrama and Rotxapea) and one traffic station (Plaza de la Cruz, PC)

## MODELLING APPROACH

- High-resolution maps of annual average concentration of NO<sub>2</sub> are computed using a numerical methodology (WA CFD-RANS, Weighted Averaged Computational Fluid Dynamic-Reynolds averaged Navier-Stokes simulations)
- WA CFD-RANS is based on the combination of steady-state CFD simulations for different wind directions (Santiago et al., 2017; Rivas et al., 2019) in a numerical domain that covers the entire city.
- CFD simulations are based on RANS equations with Realizable k-ε turbulence closure (STAR-CCM+ model).
- Neutral profiles are imposed at the inlet.
- NO<sub>2</sub> maps are computed from NO<sub>x</sub> maps by using the ratio NO<sub>2</sub>/NO<sub>x</sub> measured in AQMS.
- Results were successfully evaluated using data from the city network of AQMSs and from a network of mobile microsensors carried by cyclist around the city.

## IMPACT OF RESOLUTION ON POPULATION EXPOSURE ESTIMATES

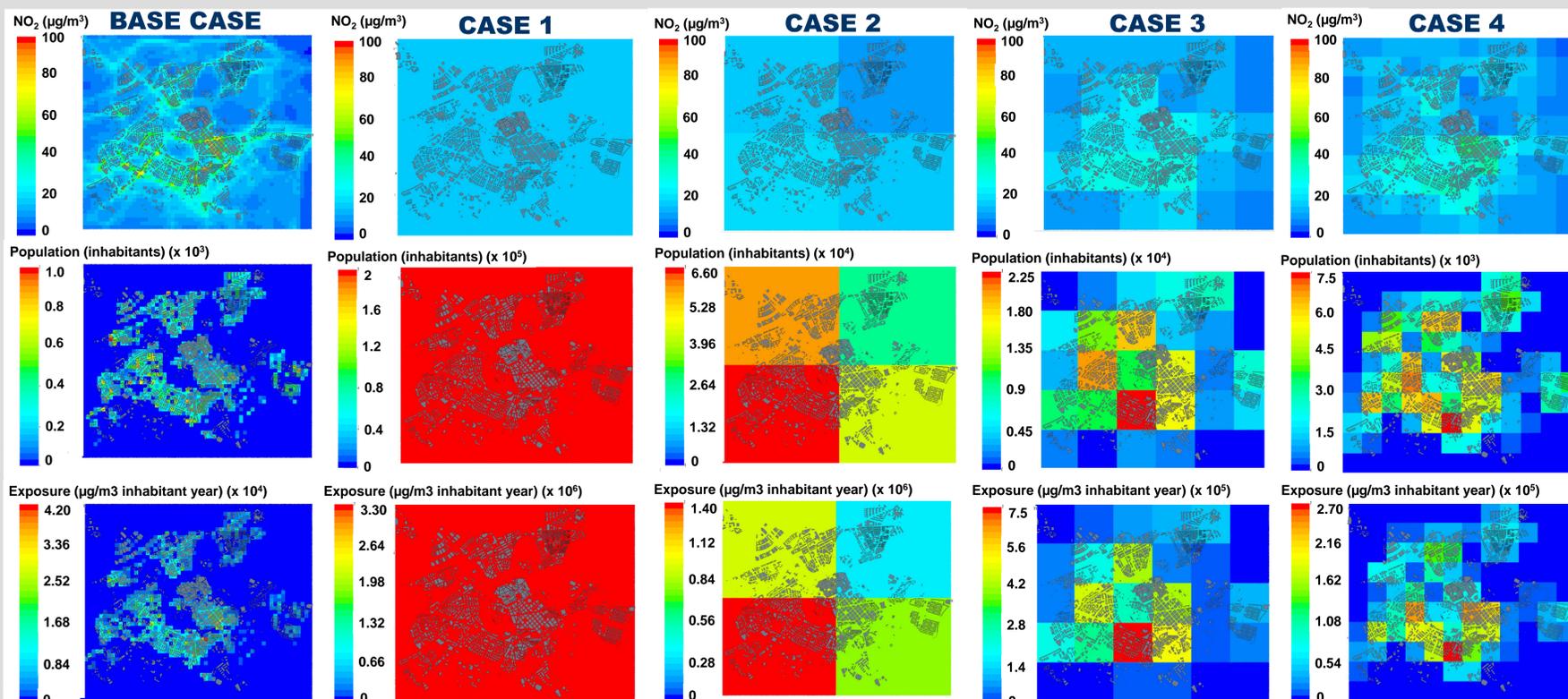


Fig. 2. Maps of NO<sub>2</sub>, population distribution and exposure estimates for all cases

- Total exposure is computed multiplying population and concentration in each cell and aggregating the exposure of all cells.

$$\text{Total Exposure} = \sum_{i=\text{all cells}} (\text{NO}_2 \times \text{Population})_i$$

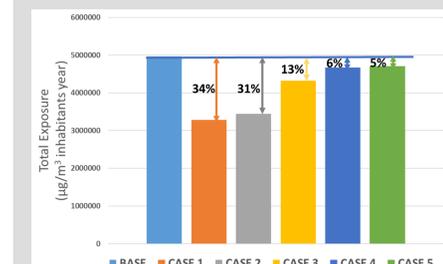


Fig. 3. Total exposure estimated at different spatial resolution.

- For coarser resolution cases, city shape is not well captured. In addition, high-concentration levels are not captured due to the strong gradient of concentration in the city → Exposure is underestimated.
- Relative differences of the total exposure estimated for case 1 and 2 are higher than 30%.
- Appropriate estimates of the exposure is only provided for 1 km x 1 km resolution case (relative differences = 13%) and for 500 m x 500 m resolution case (relative differences = 6%).

- Case 5 is investigated because sometimes detail information of population is not available. In this case, we observed that if population is uniformly distributed over the cells with residential building then, the total population estimates is good (relative differences = 5%) if resolution of concentration is fine (100 m x 100 m).

## POPULATION EXPOSURE ESTIMATES USING AQMS

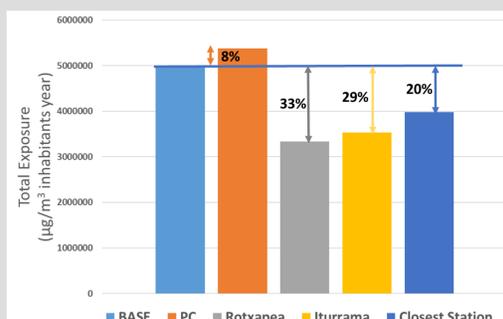


Fig. 4. Total exposure estimated using AQMS and comparison with Base case.

- Total exposure is computed multiplying population in each cell (resolution 100 m x 100 m) by AQMS concentration and, finally, aggregating the exposure of all cells. These values are compared with the base case.
- Cases:
  - Using concentration recorded by PC AQMS. Good estimates (slight overestimation of 8%). Residential buildings close to traffic. Low spatial representativeness of traffic AQMS → difficult to extrapolate these results to other possible traffic AQMS.
  - Using concentration recorded by Rotxapea AQMS. Bad estimates (underestimation of 33%).
  - Using concentration recorded by Iturrama AQMS. Bad estimates (underestimation of 29%).
  - Using concentration recorded by the closest AQMS. Regular estimates (underestimation of 20%).
- Overall, total exposure estimates in a city using concentration from AQMS can induce important errors → low spatial representativeness of urban AQMS.

## CONCLUSIONS

- This kind of sensitivity analysis is scarce in the literature and these results provide an estimate of the influence of the input data uncertainties (mainly spatial resolution) in the total exposure computed. In addition, recommendations about how to associate concentration and population are presented.
- The impact of spatial resolution of population and concentration on a total exposure estimates is important.
- Only input data with resolution equals or finer than 1 km x 1 km provide appropriate estimates.
- If population data with high resolution is not available, appropriate total exposure is estimated if population is uniformly distributed over residential buildings and high-resolution concentration is used for the computation.
- Overall, total exposure estimates in a city using concentration from AQMS can induce important errors.
- This research may contribute to provide a more comprehensive knowledge of the methodologies for the estimates of population exposure.

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**ACKNOWLEDGEMENTS**  
This study has been supported by the RETOS-AIRE (RTI2018-099138-B-I00) and the AIRTEC-CM (S2018/EMT-4329) research projects funded by Spanish Ministry of Science and Innovation and by the Regional Government of Madrid, respectively. Authors thank to CETA-CIEMAT by helping in using its computing facilities for simulations. CETA-CIEMAT belongs to CIEMAT and the Government of Spain and is funded by European Regional Development Fund (ERDF).