

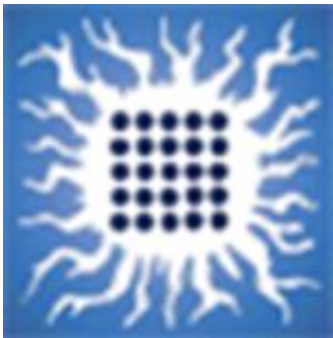


# USE OF EUROPEAN MULTICITY MODEL FOR CREATION OF NO<sub>2</sub> AND PM<sub>2.5</sub> BASE MAPS FOR BELGRADE

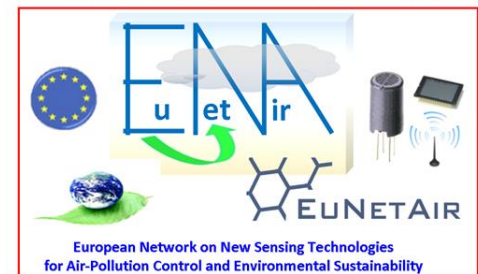
Miloš Davidovic 1, Dušan Topalović 2,1, Milena Jovašević-Stojanović 1

1 Vinča Institute of Nuclear Sciences, University of Belgrade, Serbia  
(davidovic@vinca.rs)

2 School of Electrical Engineering,  
University of Belgrade, Serbia



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# Summary

- Intro
- Basemaps
  - definition and methods for creation (LUR, physics based modeling)
- Land use regression modeling
  - example of Belgrade and NO<sub>2</sub>, PM<sub>2.5</sub> maps
- Method for correcting basemaps
  - data fusion techniques, example of fused Belgrade historic data



# Intro

- Creation of air pollution maps is often hindered by absence of high spatial resolution measurement data of corresponding air pollutants.
- Use of low cost measurement platforms can increase the spatial resolution of measurements
  - additional data is needed in order to obtain **realistic spatial patterns** in maps.
- To this purpose it is necessary to include data obtained from the modelling
  - either physical or statistical (LUR)



# Basemaps – definition and methods for creation

- Basemap is a rough estimate of a scalar quantity
  - typically used to predict (spatially) its long-term average.
- In this paper the quantities of interest are mass concentration of NO<sub>2</sub> and PM<sub>2.5</sub> pollutant
- Basemaps can be obtained in a number of ways
  - LUR models and/or dispersion (physical modeling) based methods.



# Basemap creation

- Main problem is gathering enough input data
- Typically physics based models need much more input data than LUR models
- Physics based models require detailed, high resolution input data
  - description of sources of emission, meteorology data (temperature, wind), height of terrain, initial conditions and boundary conditions



# Basemap creation

- This was the reason why for Belgrade NO<sub>2</sub> and PM<sub>2.5</sub> maps LUR approach was used
- LUR model was based on Wang European model (2014)
- LUR models are typically used for smaller urban areas
  - Wang model extended land use approach to model urban air pollution in several urban areas



# Basemap creation

- Wang model (2014)
  - Study proposed unified linear regression model for  $\text{PM}_{2.5}$  and  $\text{NO}_2$  pollutants for European cities
- Based on large dataset obtained from 36 urban areas
  - (20 areas had simultaneous campaigns of both,  $\text{PM}_{2.5}$  and  $\text{NO}_2$  with 20 monitoring sites per area and 16 areas had only  $\text{NO}_2$  measurements with 40 monitoring sites per area).
  - A total of 960  $\text{NO}_2$  sites and 356 PM sites (four sites were missing due to failed campaign)



# Basemap creation

- Final result were linear regression formulas which connect  $\text{NO}_2$  and  $\text{PM}_{2.5}$  concentration to predictor variables
- $\text{NO}_2$  predictor variables
  - Regional background concentration, Traffic load in 50 m, Road length in 1,000 m, Natural and green in 5,000 m, Traffic intensity on the nearest road, Intercept
- $\text{PM}_{2.5}$  predictor variables
  - Regional background concentration, Traffic load between 50 m and 1,000 m, Traffic load in 50 m, Road length in 100 m, Intercept





# Belgrade – making basemaps

- One of the main problems is how to get high quality input data
- For example last large campaign for traffic data for Belgrade dates from 2006.
- A lot of things changed since then (for example 3% total growth of traffic per year)
- Workflow for map creation can be fully automatized so that map can be updated each time more relevant data is available

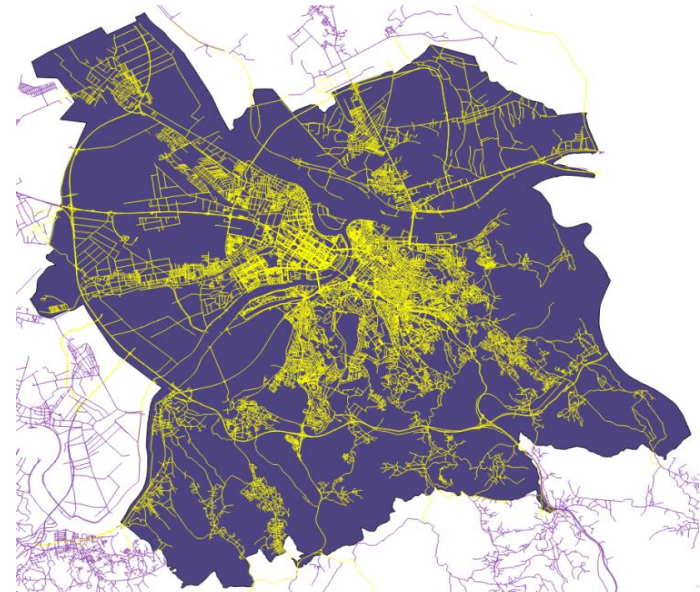
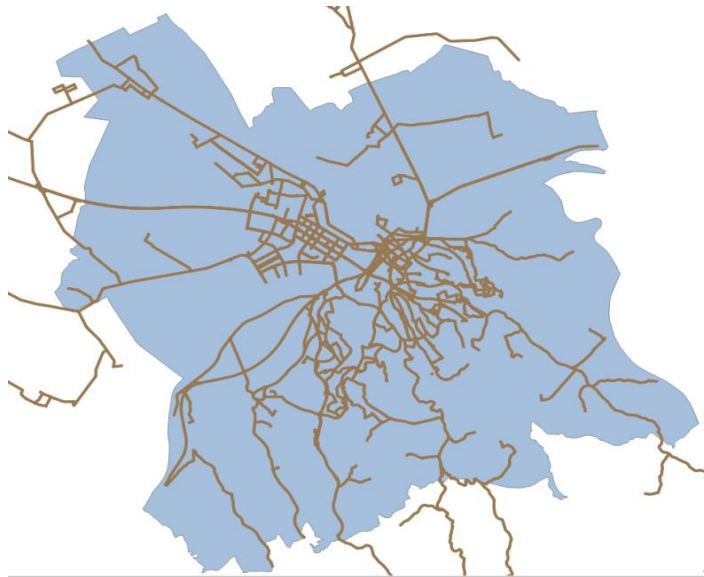


# Belgrade – making basemaps

- In current iteration of base maps for Belgrade we used public transport data which is up to date
  - we used linear regression model to establish a connection between total traffic and public transport traffic.
- The regression was made using data from automatic counters
  - Counters separate the traffic to vehicle categories, and data is available for cca 20 counters in Belgrade area
- It is clear that this initial model has limitations, illustrated on next slide

# Belgrade base maps

- Predictor variable (public transport #/day) is non zero only on roads shown in left image
- We need prediction for all roads (right image), so this is basically predicted using intercept
- Another problem is correct definition for traffic in large buffer (Wang model uses 1000m buffers)

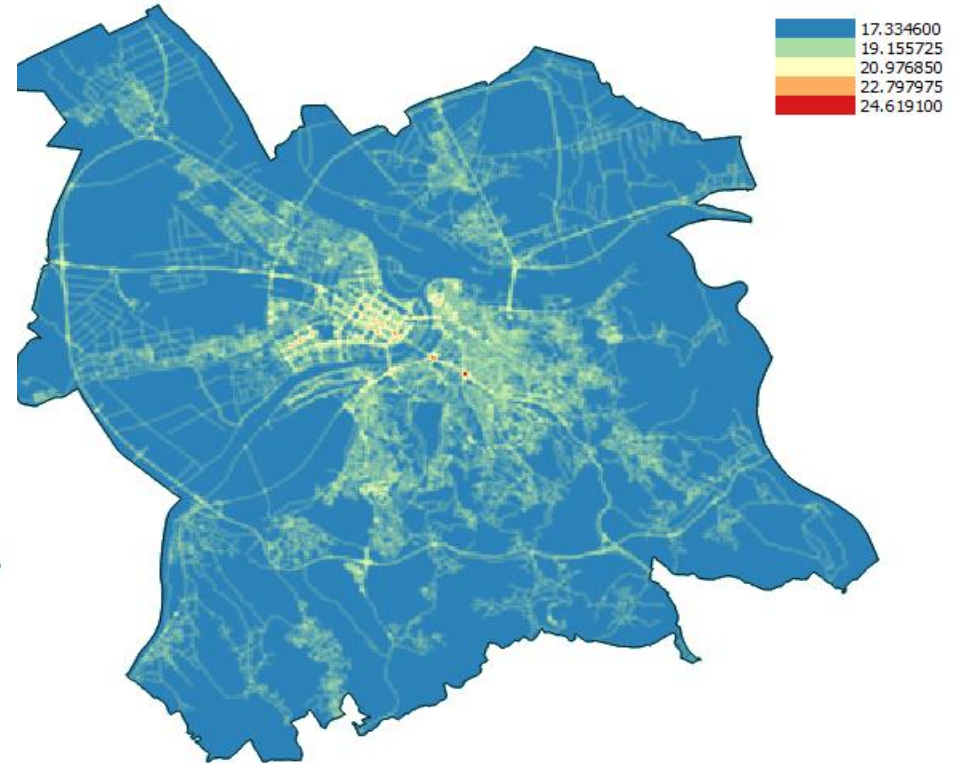


# NO<sub>2</sub> [ $\mu\text{g}/\text{m}^3$ ]



- NO<sub>2</sub> base map requires: traffic load in 50m buffer, road length in 1000m buffer, green and natural in 5000m buffer, traffic intensity on the nearest road, regional background

# PM2.5 [ $\mu\text{g}/\text{m}^3$ ]

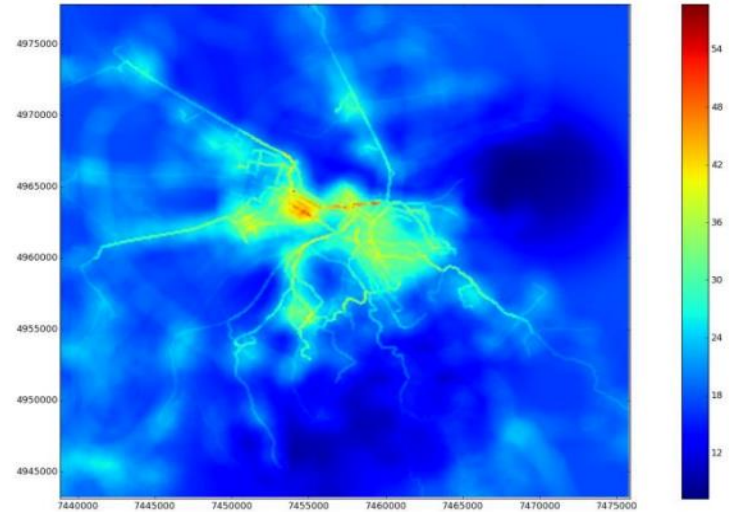


- Due to ambiguity in 1000m traffic load definition and very small contribution to total, this predictor was neglected. Need for better traffic model, and also better background estimate (location/smaller region dependent)

# Method for correcting basemaps

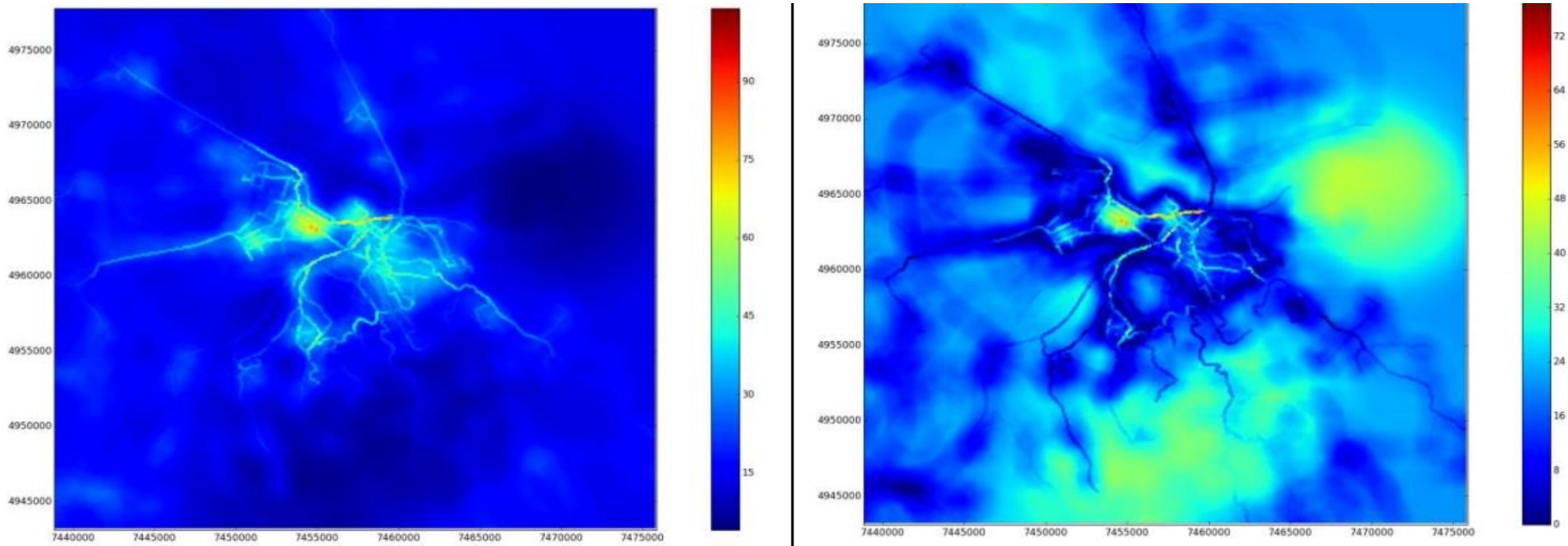
- Integrate real-time measurements from large number of monitoring stations
  - Improving the mapping of urban scale air quality is one of the most promising potential applications of low cost microsensors
- The technique that will be used is data fusion, which was developed at Norwegian Institute for Air (NILU) Norway
- Fused map will use both basemap and measurement
  - Even at higher deployment densities possible with low-cost sensors, realistic spatial mapping still requires city-scale model information to supply spatial patterns
- As a test run we fused NO<sub>2</sub> historic data from 2011 (14 monitoring stations) to our basemap
  - Low cost AQ sensor can significantly increase the density of the monitoring network

# Method for correcting basemaps



- Fig 1. a) Local monitoring network for NO<sub>2</sub> (14 stations) plotted over Belgrade orthophoto image (source BingMaps). b) Basemap for NO<sub>2</sub> (estimate for average annual value) within area covered by Master plan of Belgrade. Note that scale is not relevant for basemap since it is additionally scaled during data fusion

# Method for correcting basemaps



- Fig. 2 a) Fused map for NO<sub>2</sub> average annual concentration. Unit is µg/m<sup>3</sup>. Up to 90 µg/m<sup>3</sup> b) relative error of fused map compared to basemap. Unit is percentage



# Method for correcting basemaps

- Areas of lower NO<sub>2</sub> concentration correspond to the green and natural areas which are further away from larger roads.
- High concentration of NO<sub>2</sub> is limited to the urban city center with large number of high traffic roads.
- Areas with higher values of "relative error" were not covered by monitoring stations
  - However, those areas also correspond to areas of smaller NO<sub>2</sub> concentration in basemap.
- It should be noted that error introduced by kriging, i.e. spatial interpolation should not be regarded as complete error estimate
  - more as a lower bound for error
- In addition, monitoring platforms (automatic and semi-automatic stations) also introduce error, which is usually in 5-10% range even for high quality measurements.
  - Combined uncertainty would include both types or errors.



# Thank you for you attention!

- Acknowledgements
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