

# SPATIAL PREDICTION OF TRANSPORT RELATED URBAN AIR QUALITY

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## ABSTRACT:

The aim of this study is to explore the relationship between, transport, land-use and air quality and mapping of air pollutants by means of spatial information sciences, which would provide useful information for decision-makers. Integrated transport, land-use and air quality monitoring are prioritized especially in metropolitan areas. The complexity is straight forward, since data, indicators, variables, methods and approaches vary and isolated. Within the environmental studies, due to reasons of cost and measurement techniques, there exists limited number of sample points. Air quality studies are not exceptions, where sample points are sparse observations. This greatly reduces the availability of appropriate interpolation methods for estimating the total air quality. Geostatistics and multi-variate techniques provide the framework and the tools to build a consistent model for “integrating” information from various sources. Geostatistics introduce useful for up-scaling from the data that have been collected at limited points to provide complete areal coverage where the accuracy of the prediction is known. Air quality measurements namely SO<sub>2</sub> and PM obtained at the Istanbul Metropolitan Area between 1994 and 2007 were evaluated via spatial information sciences and results were discussed.

## 1. INTRODUCTION

In both developed and rapidly industrializing countries, the major historic air pollution problem has typically been high levels of smoke and Sulphur Dioxide (SO<sub>2</sub>) arising from the combustion of sulphur-containing fossil fuels such as coal for domestic and industrial purpose. At current status, the major threat to clean air is now posed by traffic emissions. Traffic congestion is the result of the relationship between transport and land-use, where impacts are obvious in several metropolitans. At the current status data, indicators, variables, methods and approaches vary and systems for solving the complex problem are isolated. Hence, integrated policies are highly stressed to solve the complex problem.

The geoinformation sciences currently became the core component of integrated transport, land-use and environmental decision making systems (Geerlings and Stead, 2003; Sperling et. al, 2004). Clearly, given their important role in assisting policy making, it is important to quantify the uncertainties associated with environmental process models (Leopold et al, 2006). The number of sample points used in environmental studies is limited due to cost and techniques of measurements. Air quality studies are not exceptions, where sample points are sparse observations. This greatly reduces the availability of appropriate interpolation methods for estimating the total air quality. For such analyses geostatistics introduce useful for up-scaling the data on attributes that have been collected at points to provide complete areal coverage (Bierkens et al, 2000).

The integrated usage of geostatistical methods and geosciences can introduce valuable information to identify, visualize and explore the relationship between transport, land use and air

quality. The obtained information is associated with quality, which will aid reliability to taken decisions. This study is organized as follows to introduce an integrated approach to transport, land use and air quality interactions. First, the study area and data used are introduced. Then methodology is briefly described. Thirdly, results of the spatial analyses are presented at the results and discussion section. Finally, major findings and future suggestions are given at the conclusion.

## 2. THE STUDY AREA AND DATA USED

The study area was selected as the Istanbul Metropolitan Area, which is one of the most important and the largest metropolitan of Europe with the population more than 12 million people.. Istanbul still receives considerable amount of immense migration from all over the country which leads the fast expansion of the city. Air pollution becomes one of the important problems of the city together with traffic congestion as a result of increase population and unplanned urbanization. Based on reports of the State Statistical Institute published in 2006, every fifth citizen of Istanbul owns a vehicle. The relationship between population and number of vehicles is illustrated in Figure 1. Both population and number of vehicles have an increasing trend after 1980s.

Emissions caused by the road traffic in Istanbul increased rapidly between years of 1990 and 2000, where the increase in CO, SO<sub>2</sub> and particulates were 50.1%, 55.7% and 82.5%, respectively (Becin, 2002). "Particulate matter," also known as particle pollution or PM, is a complex mixture of extremely small particles and liquid droplets. Particle pollution is made up of a number of components, including acids (such as nitrates



the possibility of increasing the amount of collected data arises, geostatistics provides solutions for data collection time, data collection location and selection of measured parameters. Kriging is a widely used technique for air quality data, since data is spatially continuous (Sampson and Guttorp, 1999; Shaddick and Wakeeld, 2002; Diem and Comrie, 2002, Nunnari et al., 2004, Potoglou and Kanaroglou, 2005). Among different types of kriging, ordinary and universal kriging are the most commonly used techniques. The general concept is that the prediction of the value  $Y(s)$ , such as  $SO_2$  concentration, at any  $s$  location is obtained as a weighted average ( $W$ ) of neighboring data (Bailey and Gatrell, 1995):

$$Y(s) = \sum_{i=1}^n w_i(s)Y(s_i) \quad (1)$$

In both ordinary and universal kriging, the ultimate goal is to estimate the optimal values of the weights. One of the major advantages of kriging is the statistical evaluation of the results and the estimation of confidence intervals around predicted values. For this purpose, the mean square prediction error or kriging variance is used, where the variance is derived from the known covariance structure. For assessing the uncertainty and accuracy; time series plots comparing hourly predicted and observed concentrations for each monitoring station is recommended by Environmental Protection Agency (EPA) (EPA, 2001).

#### 4. RESULTS & DISCUSSION

For the selected area several statistical and geostatistical methods were applied and results were compared accordingly:

Kriging method was applied to multi-temporal  $SO_2$  and PM values obtained from 17 stations to create continuous  $SO_2$  and PM maps of the Istanbul Metropolitan Area between 1994 and 1998. The  $SO_2$  has continuous decrease for the mentioned period, hence only maps of 1994 and 1998 is provided in Figure 4.

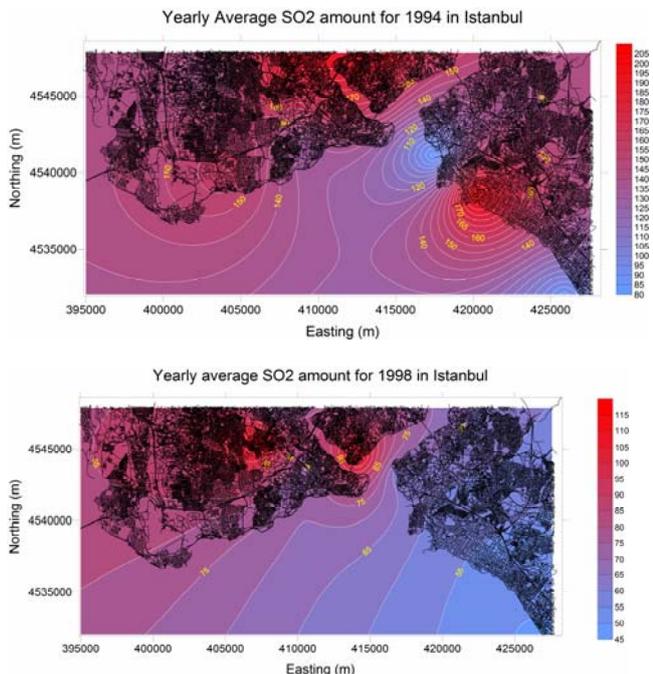


Figure 4 Kriging maps of  $SO_2$  for years 1994 and 1998

PM maps are also achieved, which follows the same decrease trend. The upper limit value of  $SO_2$  is determined as 125 according to European Union (EU) standards. Average yearly amount of  $SO_2$  is higher than this value for several locations in Istanbul for 1994 and 1998. Higher  $SO_2$  values were obtained around Eminonu, Sisli, Beyoglu, Bakirkoy, Bayrampasa and Gaziosmanpasa for all years which are highly populated and industrialized areas and covered by urban and built-up surfaces.

The index values and level of health concern was provided in Figure 2, where according to the  $SO_2$  maps, the level health concern was changed from unhealthy to moderate from 1994 to 1998. For  $SO_2$ , monthly time series were plotted for January 2003 to December 2006 period, shown in Figure 5, in order to understand general distribution of these data. (Sertel et al, 2007)

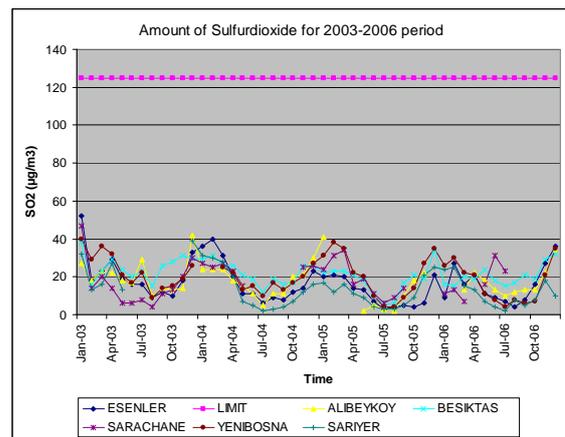


Figure 5 Monthly time series of  $SO_2$  for the period 2003-2006

The time series for  $SO_2$  showed that, the highest value was achieved in winter as 40, where summer values are about 10 especially in June and July. Maximum amount of  $SO_2$  is determined as 125 according to EU standards, where  $SO_2$  amounts belonging to all stations were under the limit. According to the result of the time series, the air quality emissions for the European side of the Istanbul Metropolitan area increases in winter time and there is a significant decrease in summer. Emission in winter is attributed to house, industrial gases and transport, where in summer season only industrial gases and transport is the source for emissions. Additionally, meteorological conditions of Istanbul in winter time are not mild, heavy fog and snow is frequent. In winter season, population of Istanbul is comparatively higher than the summer season as a result of this more vehicles take part in traffic which causes more emission. In addition to this, different quality of coal and fuel has been used in winter which contributes the differences in air quality parameters. According to the information retrieved from  $SO_2$  maps within years 1994-2007, pre-cautions are taken by the decision makers and for human health the level of  $SO_2$  can be grouped as “good”.

For the years 1994 and 1998, number of stations was seventeen and for the period 2007, it was decreased to ten. PM maps, achieved through kriging for the year 1994, 1997 and 2007, are illustrated in Figure 6. The road network of Istanbul Metropolitan Area is overlaid.

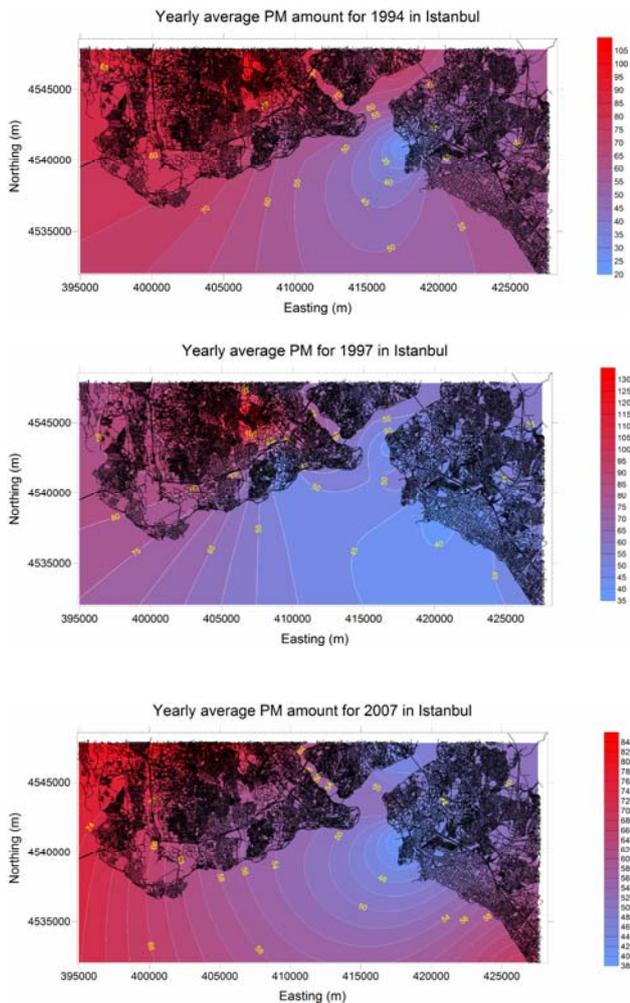


Figure 6 PM maps for the years 1994, 1997 and 2007

According to the monthly time series conducted for PM within the period of 2003-2006, the amount of PM was higher than the maximum value of 50, which was announced by European Union (Sertel et al., 2007). In Figure 6, however, the PM has a decreasing trend, although transportation infrastructure is enlarging and population is increasing. In the year 1987, the second bridge has not been completed yet, where the Transport European Motorway is newly constructed. In year 1997, the transportation network was already completed, where connections to the current transportation network, connection between first and the second bridge, was also done. However, the complete network begins to enlarge with new branches, which helps people to access the main network easily. The development is mainly observed at the northern side. In the year 2005, this development has not been decelerated, in fact very accelerated. (Demirel, 2006). Parallel to the enlarging network, there exists a rapid urbanization at the study area. According to the previously conducted studies at the European side of Istanbul Metropolitan Area by means of remote sensing, (Kaya and Curran, 2005), the urban area increased by 3359 ha between 1987 and 1992 and by 10,711 ha between 1992 and 1997. However, between 1997 and 2001, the rate of urban area increase decreased as a result of the 1999 earthquake. Overall, the urban area increased by 14,957 ha from 1987 to 2001 and the population almost doubled from 5.8 Min 1985 to 10.8 Min 2000. The urban area of the European side of Istanbul is increased by 126.7% between 1987 and 2001. Emissions caused by the road traffic in Istanbul increased rapidly between years

of 1990 and 2000, where the increase in CO, SO<sub>2</sub> and particulates were 50.1%, 55.7% and 82.5%, respectively (Becin, 2002). However, due to the limited number of stations, kriging maps do not support the previously conducted studies.

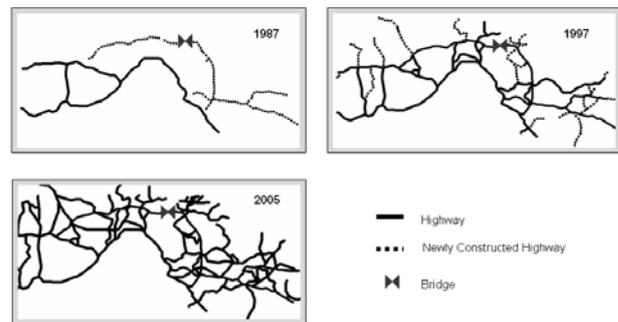


Figure 7 Temporal Changes of transportation infrastructures pertaining to 1987, 1997 and 2005

Kriging is an effective method to derive continuous variable maps of related regions using discrete station data. Number of points used in kriging procedure is important and affects the result map obtained from the method. Unfortunately, the monitoring data is only available for limited stations of Istanbul and therefore comparison of the spatial pattern between the model and the observations is limited. The achieved results should be integrated with an air quality model, where this model will provide the required sufficient input for geostatistics. The decision-makers are aware of the problem, where several studies are being conducted by the Istanbul Metropolitan Municipality for determining the traffic related emissions. Additionally, the usage of Spatial Information Sciences for determining the air quality is foreseen.

## 5. CONCLUSION

Research results indicated that integrated usage of geostatistical methods, remote sensing and spatial analysis can introduce valuable information to identify, visualize and explore the relationship between transportation, land-use and air quality and reliability of the produced results. The spatial approach provided in this study will enlighten the complex task of decision makers and lead to more reliable decisions, since data and methods are integrated. To obtain more reliable and accurate results, the sampling stations number should be increased, where urbanization and transport network could be represented in a better manner.

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