

# ENVIRONMENTAL INFORMATION SERVICES AND COMPUTATIONAL INTELLIGENCE

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## Contents

1. Introduction
  2. The Problem Domain: Urban Atmospheric Quality
  3. Paving the Scene: Choose the Parameters of Interest
  4. Be Informed In Advance: Operational Air Quality Forecasting
  5. Computational Intelligence Methods for AQ Forecasting
  6. Construction of Operational Prediction Models
    - 6.1 Data Preprocessing
    - 6.2 CI Method Selection
    - 6.3 CI Application Example
      - 6.3.1 Computational experimental strategy
  7. Information Services for the Atmospheric Environment
    - 7.1 Air Quality Information Systems
  8. An AQ Information Service Example.
  9. Quality Of Life Information Services for the Atmospheric Environment: The Future.
  10. Conclusions
- Glossary  
Bibliography  
Biographical Sketch

## Summary

One of the most challenging issues concerning the use of Computational Intelligence (CI) methods in real world applications is the successful modeling of the studied problem, in order to achieve knowledge extraction for the application domain of interest and acute forecasting for parameters influencing decisions. Knowledge extraction requires a minimum of domain expertise, and can be advanced with the aid of appropriate knowledge mapping methods. Forecasting, on the other hand, is prerequisite to successful simulation of the problem under study, and the selection of the parameters that are directly related to decision making. Both aspects are essential in cases where the application domain poses with challenges of considerable scientific depth, and of complicated procedures in decision making. This is why they both play a very important role when the emphasis is on domains directly related to the quality of life, like the

domain of the quality of the atmospheric environment (generally addressed as the problem of air quality management - AQM).

A key factor in effective AQM is the dissemination of environmental information to the general public, in order to generate a feedback loop of environmentally aware everyday life habits. This is where information services for the atmospheric environment are required (be it services that provide info for air quality, meteorological parameters, pollen, and any other atmospheric constituent of interest). Such services may pave the way towards quality of life, context aware, personalized, location-based, electronic information services, in the form of a “companion” to everyday human activities. This is a new concept and a new category of services that aims at integrating the need for improved well being on a personal level with the understanding of environmental pressures and their consequences, especially at the urban scale. They also provide with valuable information concerning the way that the pattern of our everyday life is associated with exposure to, and consequences of, environmental pressures: It is becoming more and more clear that such pressures have different spatial scales (ranging from a neighborhood to a regional problem), and multiple temporal scales (from some seconds of street canyon photochemistry to the hours of duration of a pollen episode, moving towards the days of duration of an ozone episode). The multiplicity of time and space scales of environmental pressures calls for information services that are capable of addressing them; services that are also in the position to effectively operate within scale boundaries, taking into account contemporary administrative and organizational structures. On the other hand, many environmental problems are simultaneously of multiple time and space scales, air pollution being among the most prominent ones. Although this statement is strongly supported by scientific evidence, it has not become part of the human understanding concerning the characteristics of the environment that we live in. Certain perceptions of environmental pressures and problems still dominate the way that people understand and interpret quality of life constituents like the quality of the atmospheric environment.

The present paper discusses aspects of air quality information services and in addition the usage of CI methods for knowledge discovery, service improvement and parameter forecasting in the domain of urban AQM.

## **1. Introduction**

Environmental Information is surrounding human activities for as long as man has walked the earth. Even in the first phases of manhood, the physical environment provided with a vast spectrum of signals that were received by the human sensory system in the form of sounds, sensed microclimate and weather, images of physical phenomena, vibrations, etc. All these signals were treated as input from a very sophisticated computer that was in the possession of humans, the human brain. Then, decisions were made in order to preserve what was considered to be of ultimate importance: safety from natural threads, optimum usage of resources, and when the first social structures emerged, the well being of the community. On this basis, the human kind accumulated experience translated in the form of relationships between environmental “input” and everyday decisions made, thus leading to new knowledge development concerning quality of life. It is well understood that humans were by far

the most advanced species in terms of understanding what affected the quality of their life and ways of making optimum decisions towards its improvement.

In the contemporary world, quality of life is still a very important aspect, and the influence of the environment towards its improvement or its deterioration is still of paramount importance. Although the latter is self evident in underdeveloped countries, in the western world human activities that aimed at financial and societal growth have created, as a bi-product, environmental pressures that affect the quality of the environment that people live in. This was greatly understood in the case of air pollution problems that were linked to industrial activities and modern way of life (traffic loads and urban patterns among others).

Although the interrelationships between environmental information and quality of life are evident, the way that the former is “translated” into the latter is not clear, due to the complexity of the overall environmental “system”. Nevertheless, humans are still highly concerned about the environmental conditions that affect their life, and about environmental pressures or threats that they might be able to avoid, if informed properly and in advance. As a consequence, humans are eager in improving their understanding on the relationship between key environmental parameters and the quality of their life, and are continuously trying to improve their scientific knowledge, and “extract” new knowledge, if possible, in these fields. On the other hand, contemporary science tries to develop methods that are able to provide information in advance, thus forecasting the parameters that are of importance.

## **2. The Problem Domain: Urban Atmospheric Quality**

Nominal, categorical or arithmetic values of parameters describing a knowledge domain serve as the basis for information creation, as they are being processed with the aid of various methods, tools or human judgment. In the case of the environmental domain, these data have (in the majority of cases) the form of time stamped records that formulate a multivariate time series within the spatial and temporal scale of the phenomenon of interest. Although air pollution is “interwoven” to the atmospheric environment, pollutants (i.e. harmful agents) behave differently in various spatial and temporal scales. Nevertheless, it has been agreed upon by the scientific community that certain pollutants should be monitored in locations that are representative of urban spatial forms and activities like city centers, high traffic areas, residential areas, and suburban or rural areas. Thus, the quality of the atmospheric environment may be described with the aid of hourly concentration values of various pollutants like Ozone (O<sub>3</sub>), Nitrogen Oxides (NO, NO<sub>2</sub> etc), Sulfur Dioxide (SO<sub>2</sub>), Particulate Matter with mean aerodynamic diameter of various scales (coarse, PM<sub>10</sub>, PM<sub>2.5</sub>, ultra fine), and other pollutants. In addition, a number of meteorological parameters influence the quality of air and play an important role in our understanding on the life cycle of atmospheric pollution. These are parameters like wind speed and wind direction, air temperature, relative humidity, etc.

Due to the fact that air pollution has a direct impact in the quality of our life and of the environment we live in, it is one of the environmental domains that have been regulated in the most advanced way. This means that there is already a number of legal texts

(Directives in the European Union), accompanied by implementation guidelines, that define and regulate the quality of air, and underline the need for monitoring and modeling as means to better understand, predict, and thus prevent air pollution episodes and bad air quality in general. It is therefore evident that modeling and forecasting of air quality is among the key constituents of every effective air quality management action. Air quality is one of the more advanced environmental fields regarding the legal framework developed in the European Union, in the USA, and in many other developed or developing countries. In addition, AQ is among the major themes of environmental interest for the World Health Organization (WHO). Data for the atmospheric environment are “generated” from three sources:

- a. monitoring, i.e. the (nowadays) automatic procedure for sampling, analyzing and quantitatively estimating the environmental burden (in terms of its equivalence, i.e. concentration of pollutants)
- b. calculations, i.e. mathematic procedures that aim at the estimation of air pollution concentrations on the basis of deterministic modeling of the atmospheric environment.
- c. human judgment. This is the case where some atmospheric parameters are estimated on the basis of the experience accumulated by experts that have advanced knowledge of local conditions, emission profiles, human activities and meteorological characteristics for a specific area of interest.

As monitoring is the procedure described in the environmental legislation, it is also the main source of atmospheric quality data in the case of air pollution. Standardized measurement techniques and common criteria for the number and location of measuring stations are used for the assessment of ambient air quality. Each pollutant is monitored with the aid of specialized equipment, producing hourly concentration values. The number of sampling points is determined on the basis of the population living in the agglomeration for which the air quality assessment is done, while these points are fixed, and they operate continuously for 24 hours a day. For each pollutant, a different criterion is set by the legislation, concerning the averaging period and the type of exceedances to be used as assessment criteria (WHO, <http://www.who.int/phe/air/aqg2006execsum.pdf> , Directive 2008/50/EC of the European Parliament and of the Council of 21 May 2008 on ambient air quality and cleaner air for Europe <http://eur-lex.europa.eu/LexUriServ/LexUriServ.do?uri=OJ:L:2008:152:0001:0044:EN:PDF>). In order to demonstrate the nature of the AQ assessment criteria, and the similarities and differences in the related regulations per country, the Particulate Matter (PM) example is described hereafter.

PM is a category of pollutants, which is further classified on the basis of their mean aerodynamic diameter and of their physicochemical state. One of the “traditional” ones is PM<sub>10</sub>, i.e. particulate matter of solid state and of mean diameter in the order of 10 μm, while the next sub-category of interest is PM<sub>2.5</sub>, i.e. particulate matter of a lower diameter. This is a pollutant that is directly emitted by combustion processes and by traffic, while in some regions is also produced as the result of mechanical degradation of the road surface and of winter tires. The same pollutant may result from winter sanding or salting of roads, and from transboundary dust transportation or sea spray

(and in some cases pollen) physical phenomena. The criterion applied for air quality assessment in the case of PM, is the mean 24h averaged concentration, and the limit value used for PM<sub>10</sub> in Europe equals to 50µg/m<sup>3</sup>, not to be exceeded more than 35 times per calendar year. Another criterion exists, concerning the mean annual value, which is set to 40 µg/m<sup>3</sup> and is now lowered to 20 µg/m<sup>3</sup> from year 2010 and on. It should be mentioned that for the PM<sub>2.5</sub> “fraction”, the mean annual average criterion is 25 µg/m<sup>3</sup>, a limit value that should be met in EU by the year 2015, and should be reduced to 20 µg/m<sup>3</sup> by the year 2020. On the other hand, the National Ambient Air Quality standard for PM<sub>10</sub> in USA is 150 µg/m<sup>3</sup> as a mean daily value, not to be exceeded more than once in a 3 year average, while the standard for PM<sub>2.5</sub> is 35 µg/m<sup>3</sup> (daily mean) or 15 µg/m<sup>3</sup> (annual mean). These standards are close but not always identical to the WHO air quality guidelines for PM, which are 10 µg/m<sup>3</sup> and 25 µg/m<sup>3</sup> for the annual and the 24-h mean for PM<sub>2.5</sub>, while they are 20 µg/m<sup>3</sup> and 50 µg/m<sup>3</sup> for PM<sub>10</sub> respectively.

It should be mentioned that while in the case of PM there are two averaging periods applied (24-h mean and annual mean), and different standards per period, in some other pollutants like Ozone, the averaging period is a 24-h running average (i.e. an average calculated on the basis of 24 subsequent hourly values, that is estimated 24 times, from 01:00 up to 24:00 hours of the day of reference) and in NO<sub>2</sub> the hourly average is applied. And when it comes to vegetation protection, the type of criteria, the method of their calculation and their absolute value differs scientifically. It is therefore evident that different criteria are applied to characterize the levels of pollution for the different atmospheric constituents of the air people breath. Nevertheless, it is the same air for all, this meaning that the AQ modeling tools that we apply should be able to deal with these differences and come up with sound estimations concerning possible exceedances.

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### Bibliography

Athanasiadis I., Karatzas K. and Mitkas P. (2006) Classification techniques for air quality forecasting, BESAI 2006 Workshop on Binding Environmental Sciences and Artificial Intelligence, 17th European Conference on Artificial Intelligence (EAI 2006), August 28th-September 1st, 2006. Riva del Garda, Italy. [a comprehensive study and evaluation of the performance of various classification algorithms for the purposes of air quality forecasting]

Baklanov A., O. Hanninen, L. H. Slørdal, J. Kukkonen, N. Bjergene, B. Fay, S. Finardi, S. C. Hoe, M. Jantunen, A. Karppinen, A. Rasmussen, A. Skouloudis, R. S. Sokhi, J. H. Sørensen, and V. Ødegaard (2007), Integrated systems for forecasting urban meteorology, air pollution and population exposure, *Atmos. Chem. Phys.*, 7, 855–874 [ a study of air quality forecasting systems in the frame of the FUMAPEX project]

Bassoukos A., Karatzas K., Kelemis A. (2005) Environmental Information portals, services, and retrieval systems, Proceedings of “Informatics for Environmental Protection- Networking Environmental Information”-19th International EnviroInfo Conference, Brno, Czech Republic, pp. 151-155 [presentation of innovative environmental information portal technologies and applications for information retrieval and for service support]

Chaloulakou A., Saisana M and Spyrellis N. (2003), Comparative assessment of neural networks and regression models for forecasting summertime ozone in Athens, *The Science of the Total Environment* 313, 1–13 [comparison of ANNs and regression models for air quality forecasting]

DIR 2008/50/EC: Directive 2008/50/EC of the European Parliament and of the Council of 21 May 2008 on ambient air quality and cleaner air for Europe <http://eur-lex.europa.eu/LexUriServ/LexUriServ.do?uri=OJ:L:2008:152:0001:0044:EN:PDF> [the new Directive of ambient air quality management in Europe, replacing Dir. 96/62/EC]

Endregard G., Karatzas K., Skaanes B.I., Fløisand I. and Larssen S. (2007), EEA air quality web dissemination solution - recommendations for further development, ETC/ACC Technical Paper 2006/9. Report prepared for the European Environment Agency, [http://air-climate.eionet.europa.eu/docs/ETCACC\\_TechPaper\\_2006\\_9\\_AQ\\_web\\_dessim.pdf](http://air-climate.eionet.europa.eu/docs/ETCACC_TechPaper_2006_9_AQ_web_dessim.pdf) [a technical report prepared for the European Environment Agency, that analyses the legal, technological and operational framework for web-based environmental (air quality) information dissemination, and proposes specific steps towards their future development]

Frawley W., Piatetsky-Shapiro G., and C. Matheus (1992) Knowledge discovery in databases: An overview, *AI Magazine* 13, 57-70. [a reference work on knowledge discovery]

Grivas G. and Chaloulakou A. (2006), Artificial neural network models for prediction of PM10 hourly concentrations, in the Greater Area of Athens, Greece, *Atmospheric Environment* 40, 1216–1229 [an application of ANNs for air quality forecasting]

Karatzas K., Endregard, G., Fløisand, I. (2004): Citizen-oriented environmental information services: usage and impact modeling. In: Proceedings of the Informatics for Environmental Protection- Networking Environmental Information-19th International EnviroInfo Conference, Brno, Czech Republic, pp. 872-878 [a paper presenting basic findings of research projects APNEE and APNEE-TU concerning environmental information services, usage and their impact]

Karatzas K. (2005), Quality of life and early warning environmental information services, presentation in the special session on held the EnviroInfo2005 Conference, Brno, Sept, 2005, the Czech Republic ([www.enviroinfo2005.org](http://www.enviroinfo2005.org)) [this is among the first presentations on participatory sensing and on the citizen's participation to air quality monitoring with the aid of portable devices attached to mobile phones]

Karatzas K. and Bassoukos A. (2006) Self-deployed, web-based information aggregators for disaster-related information collection and broadcasting, International Conference on Environmental Observations, Modeling and Information Systems ENVIROMIS-2006, 1-8 July 2006, Akademgorodok, Tomsk, Russia (pp. 42-43, *Enviromis2006 Programme and Abstract Book*, ISBN 5-89702-153-8) [a paper presenting the concept of web-based information aggregators for disaster-related information collection and broadcasting, accompanied by basic technical ICT recommendations]

Karatzas K., and Kaltsatos S. (2007), Air pollution modelling with the aid of computational intelligence methods in Thessaloniki, Greece, *Simulation Modelling Practice and Theory*, Vol. 15, Issue 10, 1310-1319 [application of Principal Component Analysis and ANNs for air pollution modeling, simulation and thus forecasting]

Karatzas K. (2007), State-of-the-art in the dissemination of AQ information to the general public, Proceedings of the 21st International Conference on Informatics for Environmental Protection - EnviroInfo2007, (Hryniewicz O., Studziński J. and Romaniuk M., eds.), Vol. 2., pp. 41-47, Shaker Verlag, Aachen, 2007, ISBN 978-3-8322-6397-3 (conference date and location: Warsaw, Poland, Sept. 12-14, 2007 [this is a review paper providing state of the art information on the dissemination of AQ information to the general public in Europe and worldwide, discussing media used, strategies applied and results obtained])

Karatzas K. and Kaltsatos S. (2007), Air pollution modelling with the aid of computational intelligence methods in Thessaloniki, Greece, *Simulation Modelling Practice and Theory*, Volume 15, Issue 10, November 2007, Pages 1310-1319

Karatzas K. (2007a) Session on Environmental Engineering Education and Presentation of Environmental Information to Non Scientists, ISESS2007, <http://www.isess.org/> [this is a special session devoted to environmental information and its presentation, organized in the frame of the ISESS 2007 conference]

Karatzas K., and Lee J. (2008), Developments in urban environmental information perception and communication. In: Proceedings of the iEMSSs Fourth Biennial Meeting: International Congress on Environmental Modelling and Software (iEMSSs 2008-M. Sánchez-Marrè, J. Béjar, J. Comas, A. Rizzoli and G. Guariso, Eds), (2008), available at <http://www.iemss.org/iemss2008/index.php?n=Main.Proceedings> (accessed 01 Sept. 2008) [a paper presenting aspects of air quality information perception, in line with information dissemination needs]

K. Karatzas, A. Bassoukos, D. Voukantsis, F. Tzima, K. Nikolaou and S. Karathanasis. (2008), ICT TECHNOLOGIES AND COMPUTATIONAL INTELLIGENCE METHODS FOR THE CREATION OF AN EARLY WARNING AIR POLLUTION INFORMATION SYSTEM, Proceedings of the 22nd Conference on Environmental Informatics and Industrial Ecology ([www.enviroinfo2008.org](http://www.enviroinfo2008.org)), September 10-12, 2008, Leuphana University of Lüneburg, Germany. [this paper presents the early warning air quality information presentation, forecasting and dissemination system AIRTHESS ([www.airthess.gr](http://www.airthess.gr))]

Karatzas K., Papadourakis G. and Kyriakidis I. (2008), Understanding and forecasting atmospheric quality parameters with the aid of ANNs, 2008 IEEE World Congress on Computational Intelligence (WCCI 2008), June 2008, Hong Kong. [ a paper on the investigation and application of ANNs for air quality analysis and forecasting]

Karatzas K. Bassoukos A., Voukantsis V., Tzima F., Nikolaou K. and Karathanasis S. (2009), Forecasting air quality parameters towards quality of life information services with the aid of Computational Intelligence, 5th IFIP Artificial Intelligence Applications and Innovations (AIAI'2009). April 23 - 25, 2009, Thessaloniki, Greece

Karatzas K. (2009), Informing the public about atmospheric quality: air pollution and pollen, *Allergo Journal* Issue 3/09, publication date 14th April 2009, in press. [this paper is an overview of environmental information methods and projects concerning air pollution and pollen]

Kukkonen J., L. Partanen, A. Karppinen, J. Ruuskanen, H. Junninen, M. Kolehmainen, H. Niska, S. Dorling, T. Chatterton, R. Foxall and G. Cawley (2003). Extensive evaluation of neural network models for the prediction of NO<sub>2</sub> and PM<sub>10</sub> concentrations, compared with a deterministic modelling system and measurements in central Helsinki. *Atmospheric Environment* 37 (32), 4539-4550. [this is a detailed evaluation of the performance of ANNs for the prediction of air pollution parameters, in comparison to other modeling methods]

Kyriakidis, Karatzas and Papadourakis (2009), ICT methods for preprocessing of environmental data, ITEE2009, Thessaloniki, Greece [this paper investigates various preprocessing methods for atmospheric quality data, and reports on their influence to the performance of ANNs in simulating and modeling parameters of interest]

Peinel, G., and Rose, Th.: Dissemination of Air Quality Information: Lessons Learnt in European Field Trials. In: Proceedings of the 18th International EnviroInfo Conference, Cern, Geneva, Switzerland, pp. 118-128 (2004) [this is a paper reporting on the field trial results concerning air quality information services via mobile phones (SMS, WAP, J2ME) and the impact that such services have on the citizens behavior and on the way that air quality is managed]

Soutelakos D., Voukantsis D. Karatzas K. and Samaras Z. (2009), Investigation of Particulate Matter measurements, with the aid of Computational Intelligence Methods in Thessaloniki, Greece, 4th International Symposium on Information Technologies in Environmental Engineering (ITEE 2009), May 2009, Thessaloniki, Greece (accepted)

Tan P. N., M. Steinbach, and V. Kumar (2005) *Introduction to Data Mining* (First Edition), Boston, MA, USA: Addison-Wesley Longman Publishing Co., Inc. [a reference book on data mining]

Trausan-Matu S., Karatzas K. and Chiru C. (2007), Environmental information perception, analysis and communication with the aid of natural language processing, Proceedings of the 21st International

Conference on Informatics for Environmental Protection - EnviroInfo2007, (Hryniewicz O., Studziński J. and Romaniuk M., eds.), Vol. 1., pp. 299-306, Shaker Verlag, Aachen, 2007, ISBN 978-3-8322-6397-3 (conference date and location: Warsaw, Poland, Sept. 12-14, 2007) [in this paper the issues of environmental information perception, analysis and communication are analyzed with the aid of natural language processing. The application domain is the atmospheric environment, as describes in a set of web-based resources]

Trivikrama Rao and Christian Hogrefe, 2002, Transforming Deterministic Air Quality Modeling Results into Probabilistic Form for Policy-Making, *Air Pollution Modeling and Its Application XV* (Borrego and Schayes, eds.) pages 13-21, Springer (DOI 10.1007/0-306-47813-7\_2) [a comprehensive discussion on the use of AQ model results for environmental decision making]

Tzima F., Karatzas K Mitkas P and Karathanasis S. (2007), Using data-mining techniques for PM10 forecasting in the metropolitan area of Thessaloniki, Greece, *Proceedings of the 20th International Joint Conference on Neural Networks*, Page(s):2752 – 2757. Organized by the IEEE Computational Intelligence Society and by the International Neural Network Society, Orlando, Florida, August 2007. [a thorough investigation of the performance of a large set of data mining – computational intelligence algorithms towards the forecasting of incidents of interest, i.e. air pollution episodes ]

Witten I. H. and Frank E. (2005) *Data Mining: Practical machine learning tools and techniques* (2nd Edition). San Francisco: Morgan Kaufmann. [a reference book on data mining]

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