



European Network on New Sensing Technologies for Air Pollution  
Control and Environmental Sustainability - *EuNetAir*

COST Action TD1105

**3<sup>rd</sup> International Workshop *EuNetAir* on**

***New Trends and Challenges for Air Quality Control***

**University of Latvia - Faculty of Geography and Earth Sciences**

**Riga, Latvia, 26 - 27 March 2015**

**Air-quality modelling and chemical weather forecasting at  
different Scales**



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# Summary

- Data assimilation;
- Uncertainties in measurements and modeling /Comparability of modeled and measured metrics;
- Examples of modelling/measurements integration
- Going toward local scales (some meters horizontal resolution);
- Conclusions and open problems

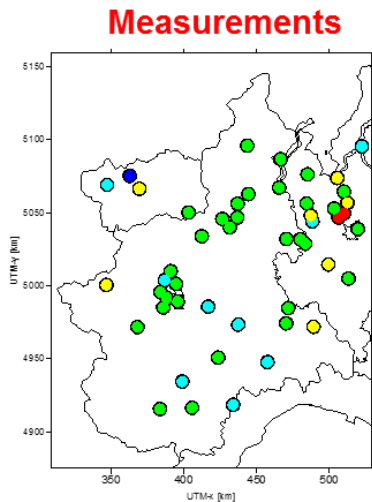
# Data assimilation

**Data assimilation** is the process by which observations are incorporated into a computer model of a real system. [...] **observations** of the current state of a system are combined with the results from a numerical model (the **forecast**) to produce an **analysis**, which is considered as 'the best' estimate of the current state of the system (analysis step).

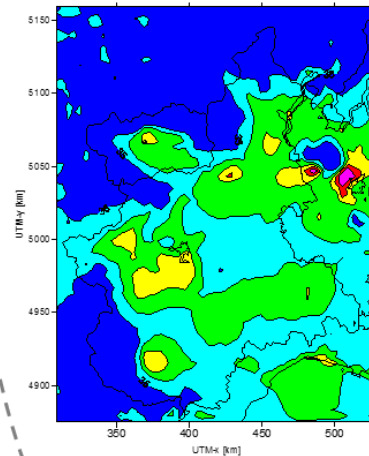
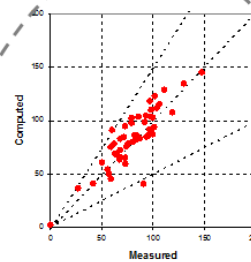
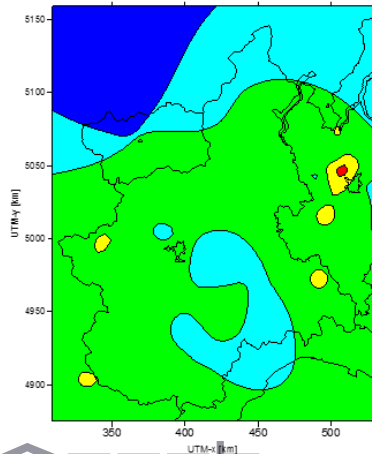
**Essentially, the analysis step tries to balance the uncertainty in the data and in the forecast.**



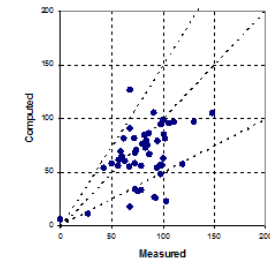
WIKIPEDIA  
The Free Encyclopedia



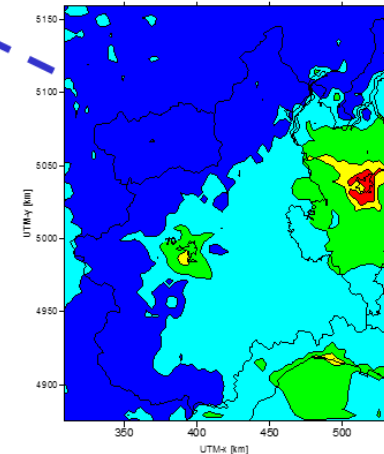
**Measurements + interpolation**



**Integration measurements and modelling**



**Validated Model**



$$T_a = T_f + \frac{\sigma_f^2}{\sigma_f^2 + \sigma_o^2} (T_o - T_f) = T_f + \frac{1}{1 + \frac{\sigma_o^2}{\sigma_f^2}} (T_o - T_f) = T_f + \left( \frac{1}{1 + \varepsilon^2} \right) (T_o - T_f)$$

*Innovation*

Obs more accurate than forecast:  $\sigma_f^2 \gg \sigma_o^2 \Rightarrow \varepsilon^2 \rightarrow 0 \Rightarrow T_a \rightarrow T_o$

forecast more accurate than obs:  $\sigma_o^2 \gg \sigma_f^2 \Rightarrow \varepsilon^2 \gg 1 \Rightarrow T_a \rightarrow T_f$

$$\frac{1}{\sigma_a^2} = \frac{1}{\sigma_1^2} + \frac{1}{\sigma_2^2}$$

Precision = 1/error variance  
 $T_a$  prec. =  $T_1$  prec. +  $T_2$  prec.

# Uncertainties

## in measurements and modeling

### An example (Particulate Matter)

#### Measurements errors:

- **random errors (uncertainties):** any measurement is made with a finite precision;
- **systematic errors (biases):** a **method generally (or on average) lead to data that are different from the “true” value** (e.g. reference method for PM mass concentration determination leads to systematically low values with respect to the actual PM mass concentration- in summer where  $\text{NH}_4\text{NO}_3$  contributes a significant fraction to PM; EC concentration, there is currently no “true” value, because EC is methodologically defined, negative artifacts may occur due to volatilization of inorganic/organic PM, ...)

#### Model uncertainties:

##### a) Inputs:

- **Emissions** (Bottom-up emission inventories are improving with inventories at high spatial and temporal resolution becoming more common)
- **Meteorology** (Winds affect the accuracy of long-range transport; Vertical mixing affects PM surface concentrations; Clouds (and fogs) enhance secondary PM formation but precipitation removes PM from the atmosphere)
- **Boundary and initial conditions** (Use of a global/regional models)

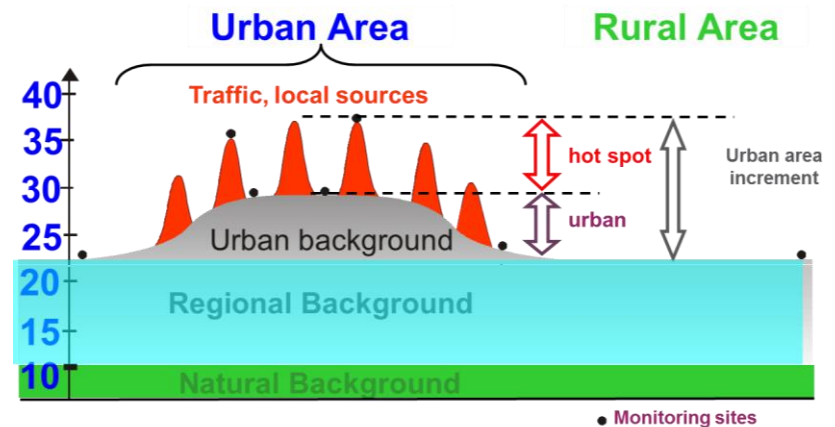
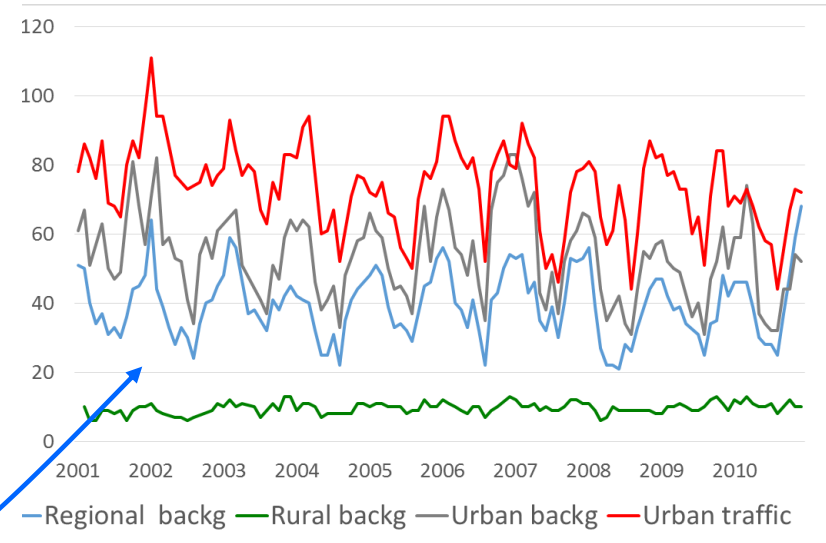
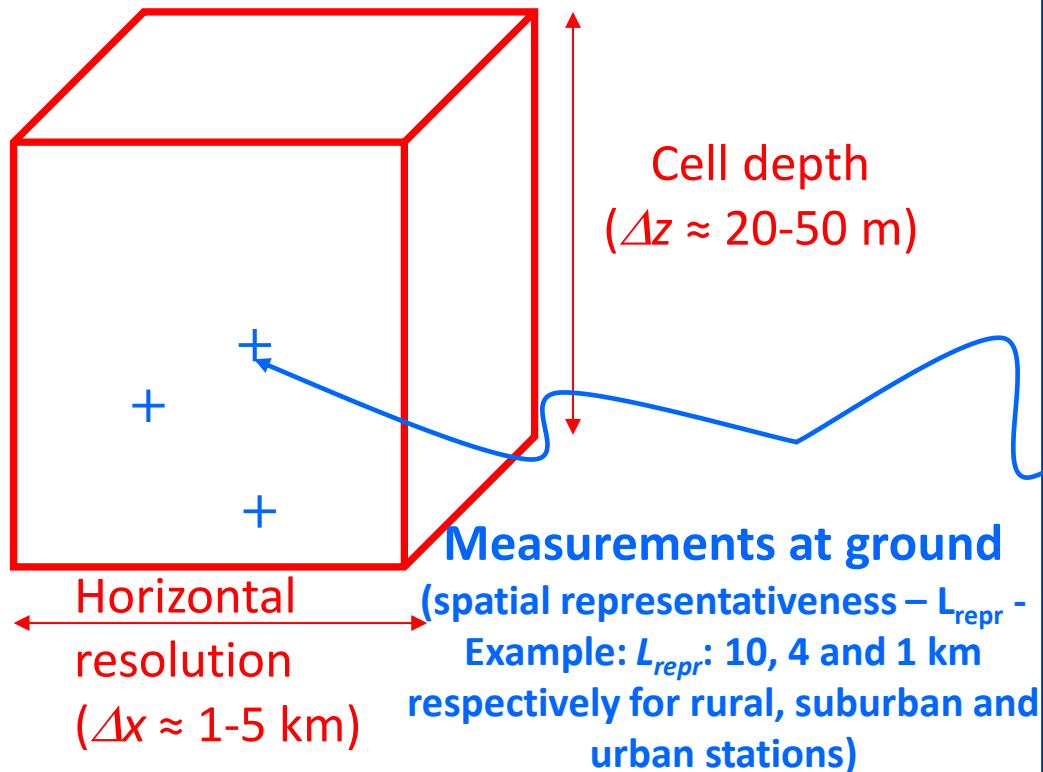
##### b) Formulation (some current issues)

- **Deposition processes**
- **Treatment of SOA** (Missing precursors, large number of condensable products, Approximations for the partitioning constants, ...)

# Comparability of modeled and measured metrics

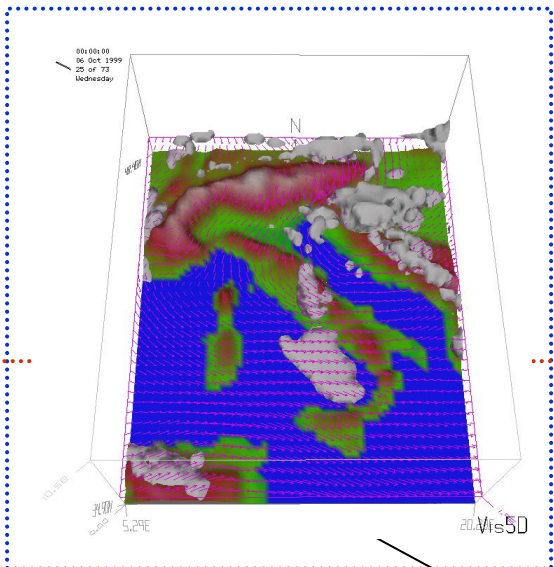
How well can point measurements represent grid cell averages ?

Calculated concentrations are averaged within the lowest model layer



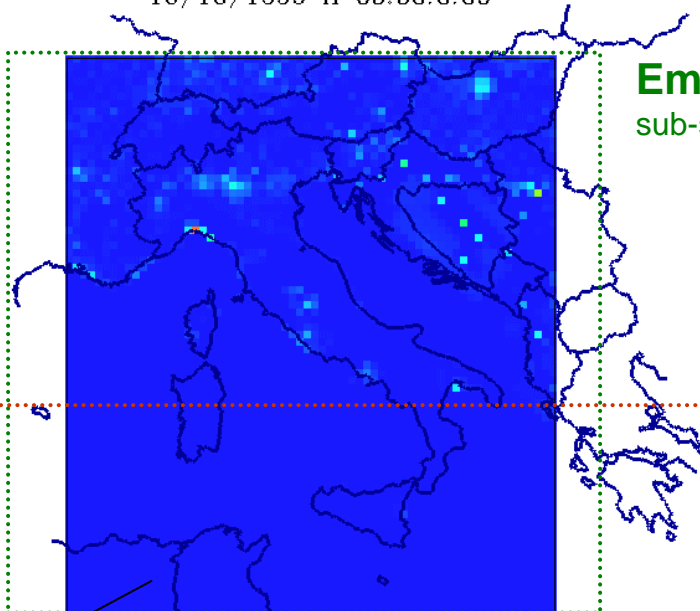
# An Atmospheric Modelling System

**Meteo**  
sub-system

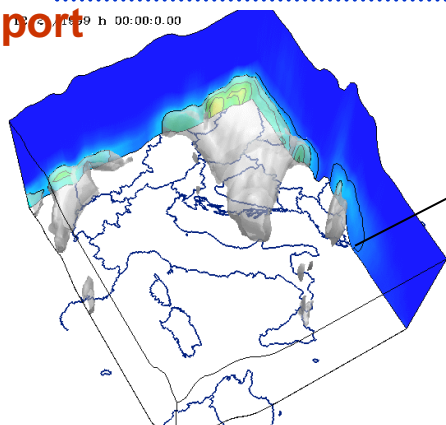


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**Emissions**  
sub-system

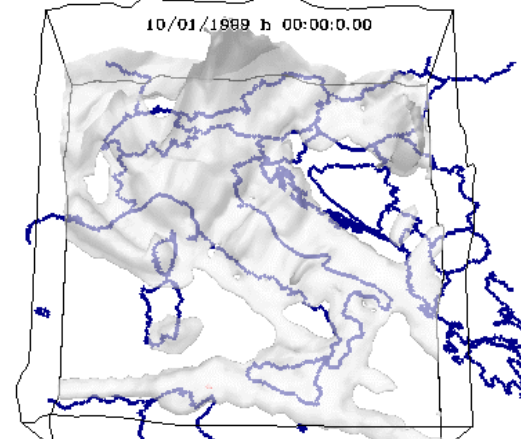


**Chemical-transport**  
sub-system



**Boundary conditions**

**FARM**



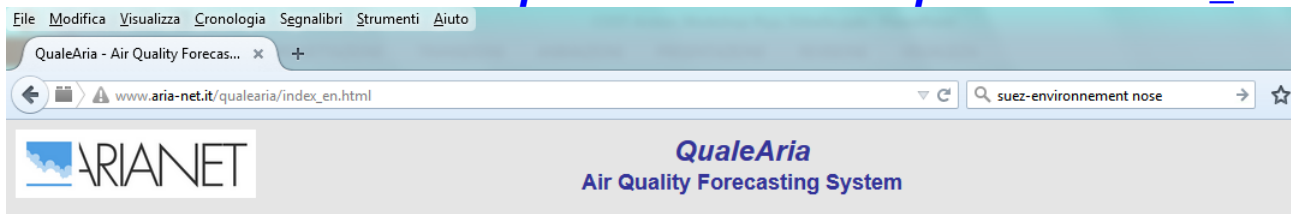
# Flexible Air quality Regional Model (FARM)

## Main features and developments:

- ✓ Inclusion of **map factors** and **different coordinate systems**;
- ✓ **Emission** of pollutants from area and point sources, with plume rise calculation and mass assignment to vertical grid cells; 3D emissions allowed;
- ✓ **3D dispersion** by advection and turbulent diffusion;
- ✓ Transformation of chemical species by **gas-phase chemistry**, with flexible mechanism configuration through KPP pre-processor (KPP, Kinetic Pre-Processor: Damian et al, 2002; Sandu et al., 2003; Daescu et al. 200);
- ✓ Treatment of **PM10** and **PM2.5**;
- ✓ **Dry removal** of pollutants dependent on local meteorology and land-use;
- ✓ Removal through **precipitation scavenging** processes;
- ✓ One and two-way **nesting** on arbitrary number of grids;
- ✓ Treatment of additional inert **tracers**;
- ✓ Inclusion of **data assimilation** techniques;
- ✓ Online calculation of photolysis rates using **TUV** model (Tropospheric Ultraviolet and Visible radiation model; Madronich *et al*, 1989);
- ✓ **Parallel processing** using **OpenMP**, **MPI** and **Hybrid** paradigms;
- ✓ **SW management and code optimization.**







[hourly average concentrations](#)

[1<sup>st</sup> day max 8hr mean](#)  
[2<sup>nd</sup> day max 8hr mean](#)  
[3<sup>rd</sup> day max 8hr mean](#)

**NO<sub>2</sub>**  
[hourly average concentrations](#)

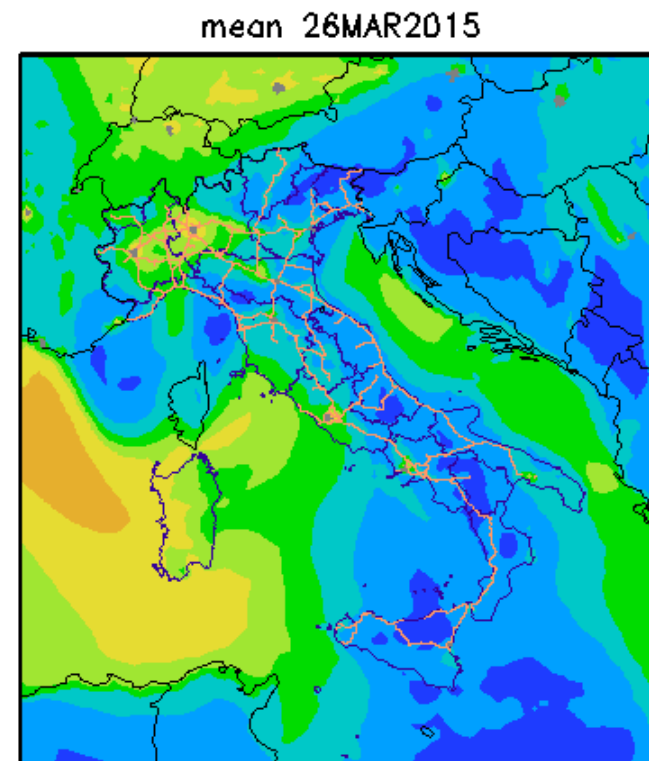
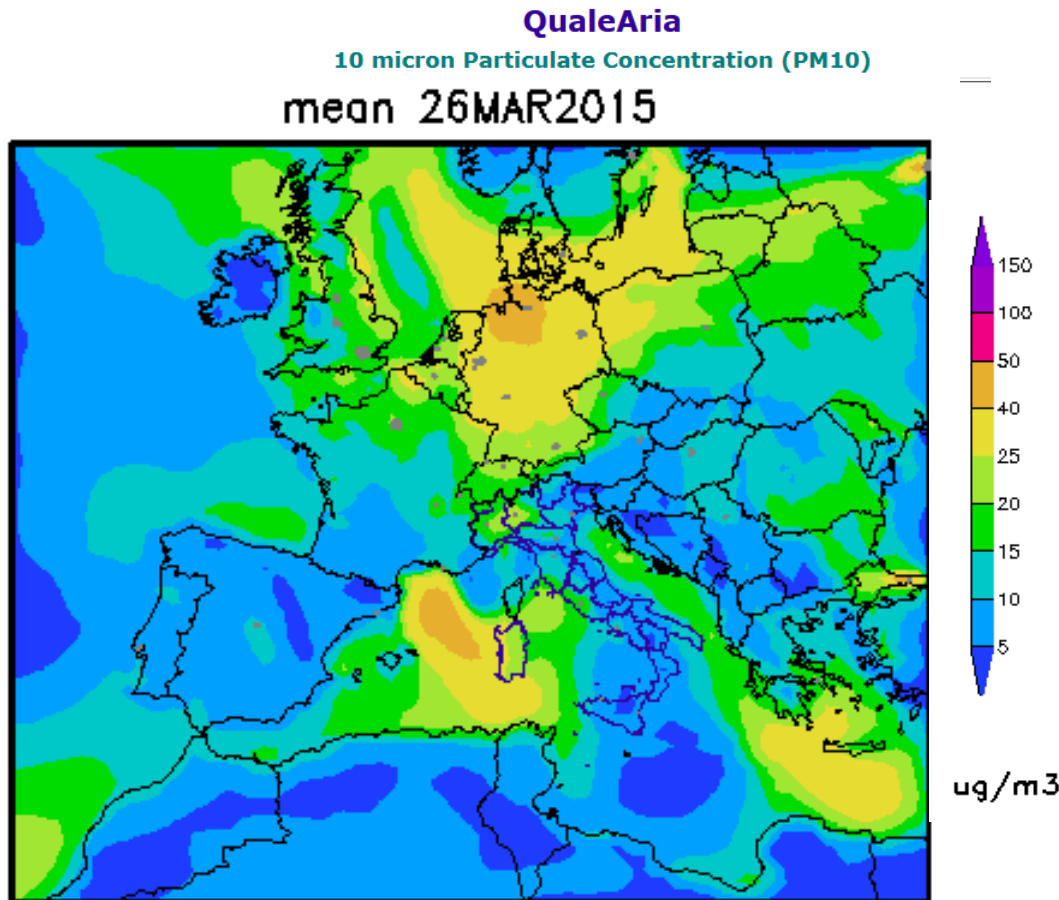
[1<sup>st</sup> day mean](#) [1<sup>st</sup> day max](#)  
[2<sup>nd</sup> day mean](#) [2<sup>nd</sup> day max](#)  
[3<sup>rd</sup> day mean](#) [3<sup>rd</sup> day max](#)

**SO<sub>2</sub>**  
[hourly average concentrations](#)

[1<sup>st</sup> day mean](#) [1<sup>st</sup> day max](#)  
[2<sup>nd</sup> day mean](#) [2<sup>nd</sup> day max](#)  
[3<sup>rd</sup> day mean](#) [3<sup>rd</sup> day max](#)

**CO**  
[hourly average concentrations](#)

[1<sup>st</sup> day max 8hr mean](#)  
[2<sup>nd</sup> day max 8hr mean](#)  
[3<sup>rd</sup> day max 8hr mean](#)



File Modifica Visualizza Cronologia Segnalibri Strumenti Aiuto

ARPALAZIO - Centro Regio... +

www.arpalazio.net/main/aria/sci/previsioni/pm10.php?region=roma

arpalazio previsioni qualita aria

## ARPALAZIO

Centro Regionale della Qualità dell'Aria

Vai alla Sezione Documenta

Sezione Misure e Valutazioni

- Base dati »
- Anno in Corso »
- Situazione »
- Meteorologica »
- Stato della Qualità dell'Aria »
- Near-Realtime »
- Previsioni »

### Concentrazione di Particolato 10 micron(PM10)

Previsioni a 120h disponibili

mean 26MAR2015

4670  
4660  
4650  
4640  
4630  
4620

760 770 780 790 800 810

150  
100  
75  
50  
40  
25  
20  
15  
10  
5

ug/m3

**Ultimi Report Giornalieri**  
 Frosinone: 18-03-2015  
 Latina: 17-03-2015  
 Rieti: 17-03-2015  
 Roma: 18-03-2015  
 Comune di Rom:  
 18-03-2015  
 Viterbo: 18-03-2015

**Bollettino Quotidiano**  
 Bollettino del 19.03.2015

**Ultimo Report Settimanale**  
 Bollettino N. 10  
 Periodo compreso tra  
 09.03.2015 ed 15.03.2015

**News**  
 04.03.2014  
 Pubblicati nella base dati de  
 sezione **Misure e Valutazioni**  
 dati delle campagne  
 monitoraggio della quali  
 dell'aria effettuate con i mez  
 mobili dell'Agenzia.

04.03.2014  
 Pubblicata la versio  
 aggiornata del bollett  
 settimanale N.07.

<http://www.arpalazio.net/main/aria/sci/previsioni/pm10.php?region=roma>

# Bias adjustment forecast techniques

Kalman Filter (KF, Delle Monache *et al.*, JGR 2006):

A recursive algorithm [...] in which information from recent past forecasts and observations is used to revise the estimate of the current raw forecast.

The new KF forecast can be formed with the model forecast as:

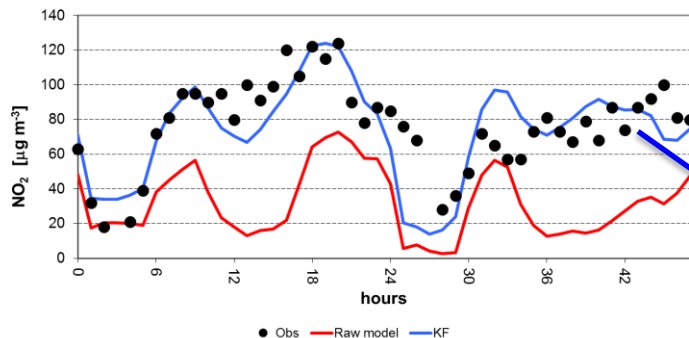
$$KF_{t_n} = f_{t_n} - \hat{x}_{t_n}$$

where  $\hat{x}_{t_n}$  is an optimal predictor of the forecast bias.

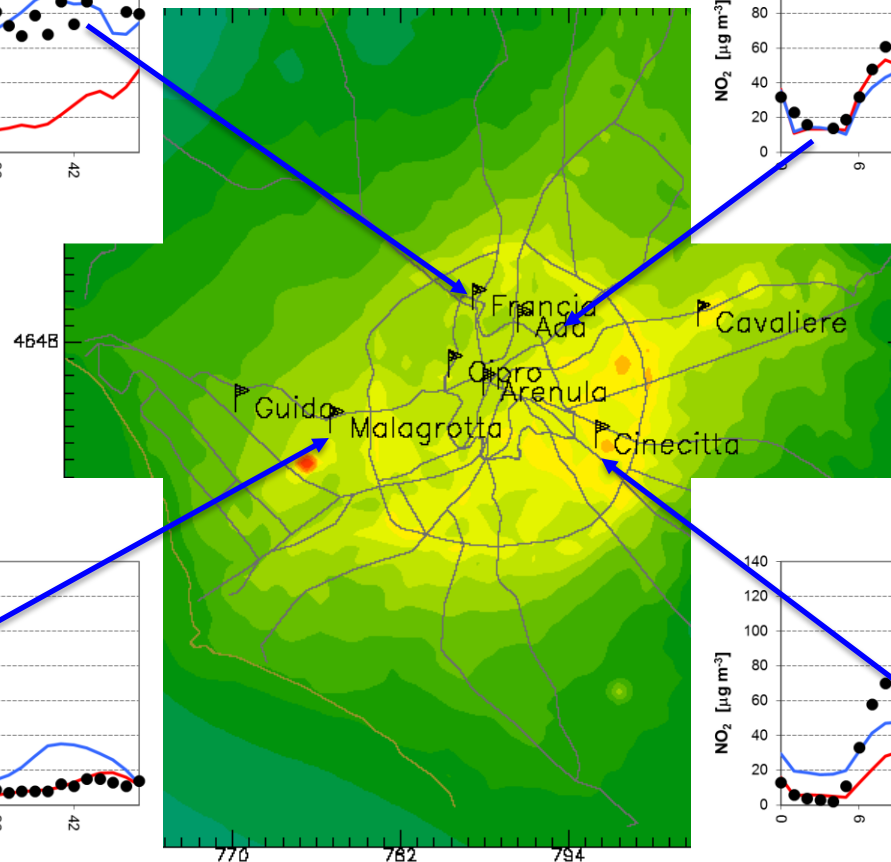
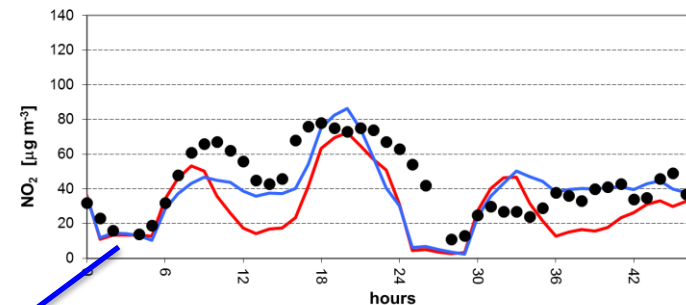
# Bias adjustment forecast techniques

## NO<sub>2</sub>

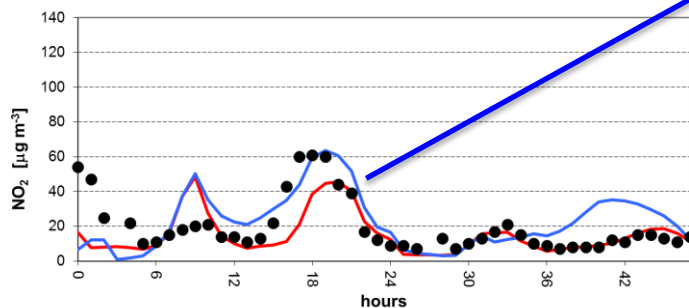
Francia - RM (U/T)



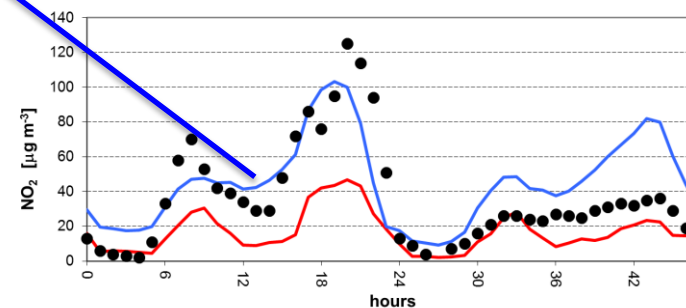
Villa Ada - RM (U/B)



Malagrotta - RM (U/I)



Cinecittà - RM (U/B)



● Obs    — Raw model    — KF

ROMATODAY

CRONACA

EVENTI

ZONE

SEGNALA

📍 ZONE Centro Storico Esquilino Eur Ostia Laurentina Trastevere Testaccio San Giovanni [Tutte le zone](#)

# Blocco del traffico: stop ai veicoli più inquinanti venerdì 9 gennaio

Il blocco per domani, venerdì 9 gennaio, interessa l'area all'interno della Fascia Verde. E le categorie di autoveicoli più inquinanti. Sarà attivo dalle 7 e 30 alle 20.30



Redazione - 8 Gennaio 2015



5



Consiglia

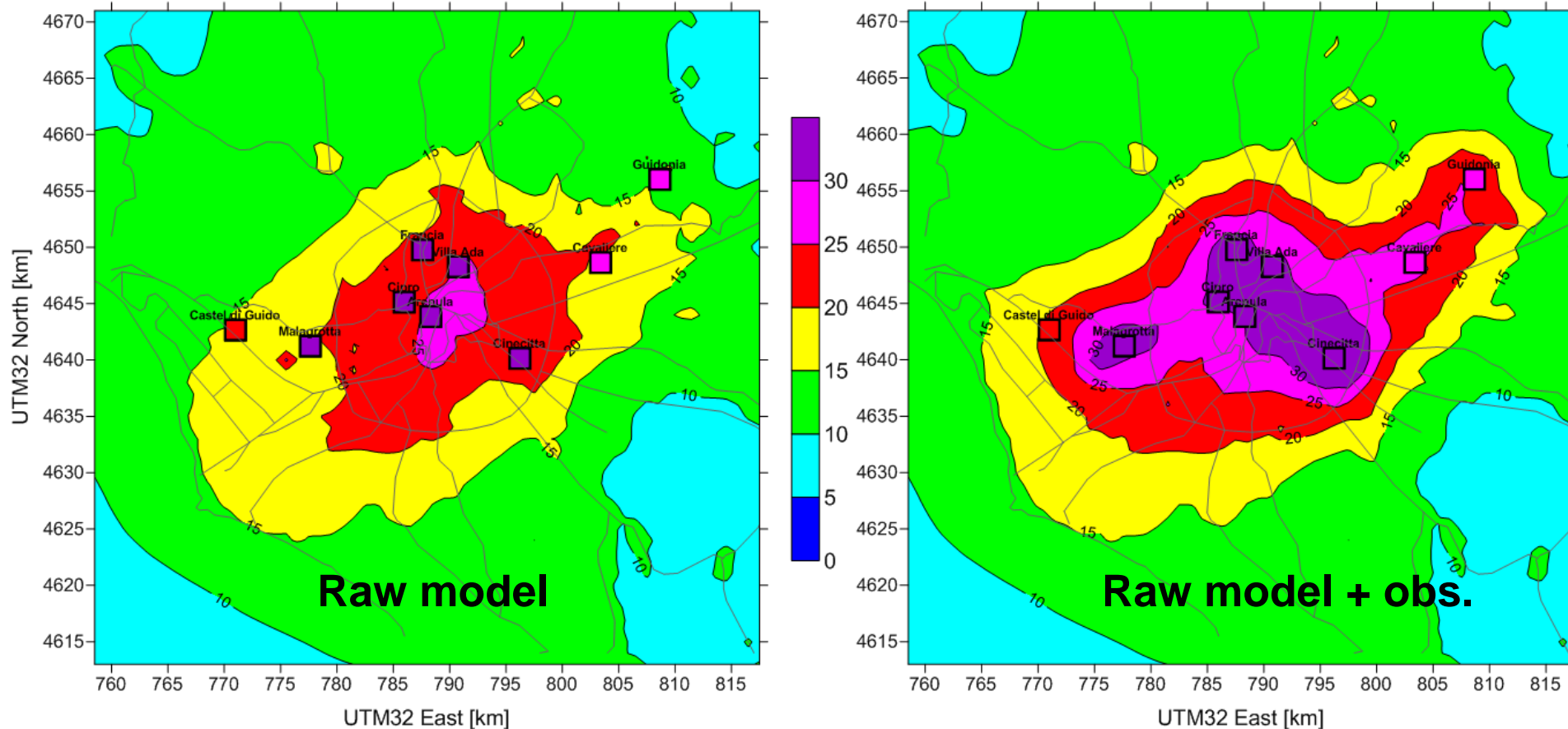
339

**Ancora smog oltre gli standard.** A causa di un'alta concentrazione di inquinanti nell'atmosfera, come rilevato dai superamenti registrati in molte centraline, e considerate le **previsioni Arpa**, che indicano condizioni di criticità, l'Amministrazione capitolina ha disposto per la giornata di domani, 9 gennaio 2015, dalle 7.30 alle 20.30, il blocco emergenziale della circolazione veicolare all'interno della Fascia Verde.

# Life + Project EXPAH (population EXposure to PAH)



January 2012 - PM<sub>2.5</sub> Monthly averages [ $\mu\text{g m}^{-3}$ ]



Silibello, C., Bolignano, A., Sozzi, R., Gariazzo, C. (2014) Application of a chemical transport model and optimized data assimilation methods to improve air quality assessment. *Air Quality, Atmosphere & Health*, 7, 3, 283-296.



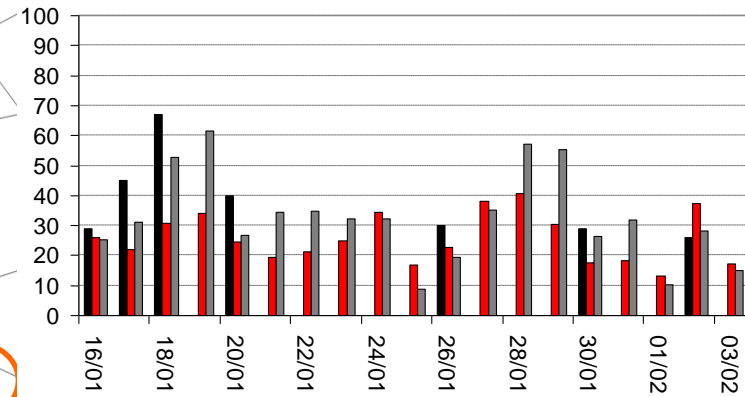
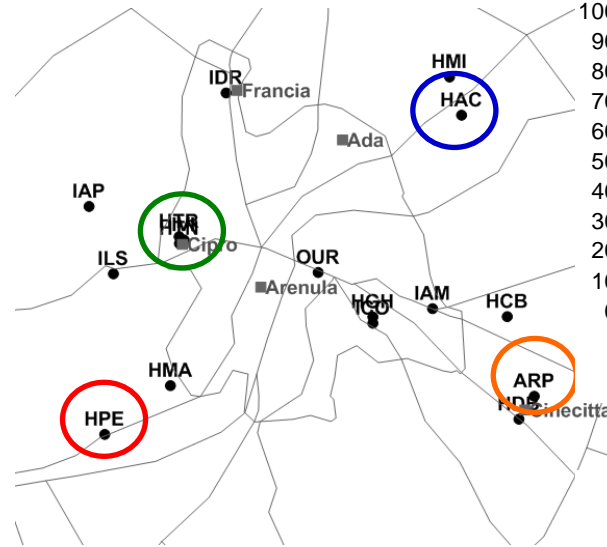
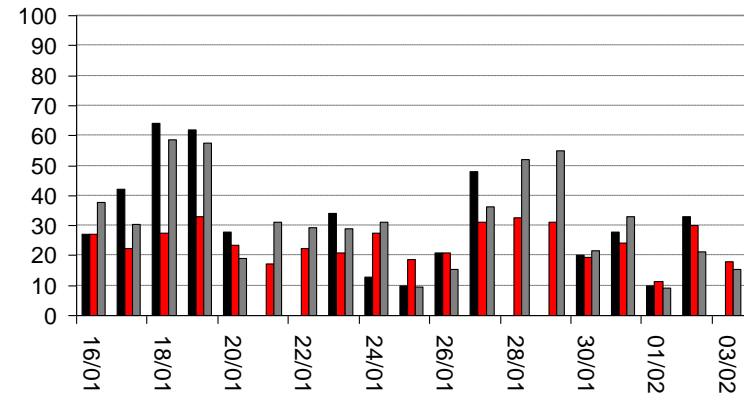
# ARIANET PM<sub>2.5</sub> Evaluation at EXPAH sites



*Not used in "data assimilation" process !*

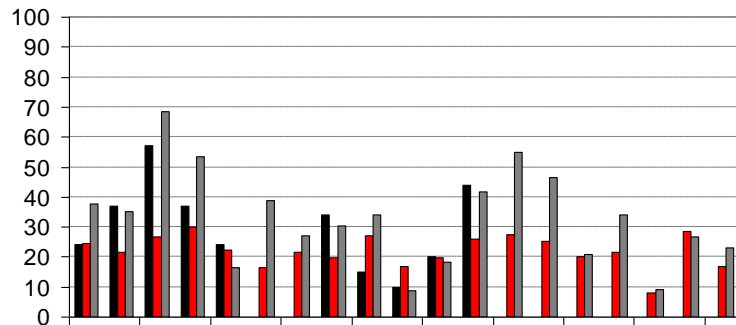
**HTR**

**HAC**

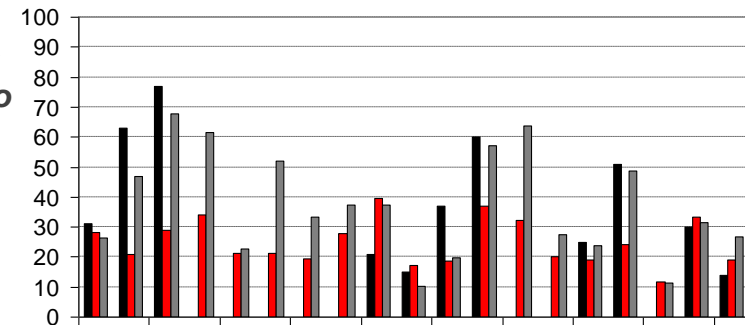


**HPE**

**ARP**

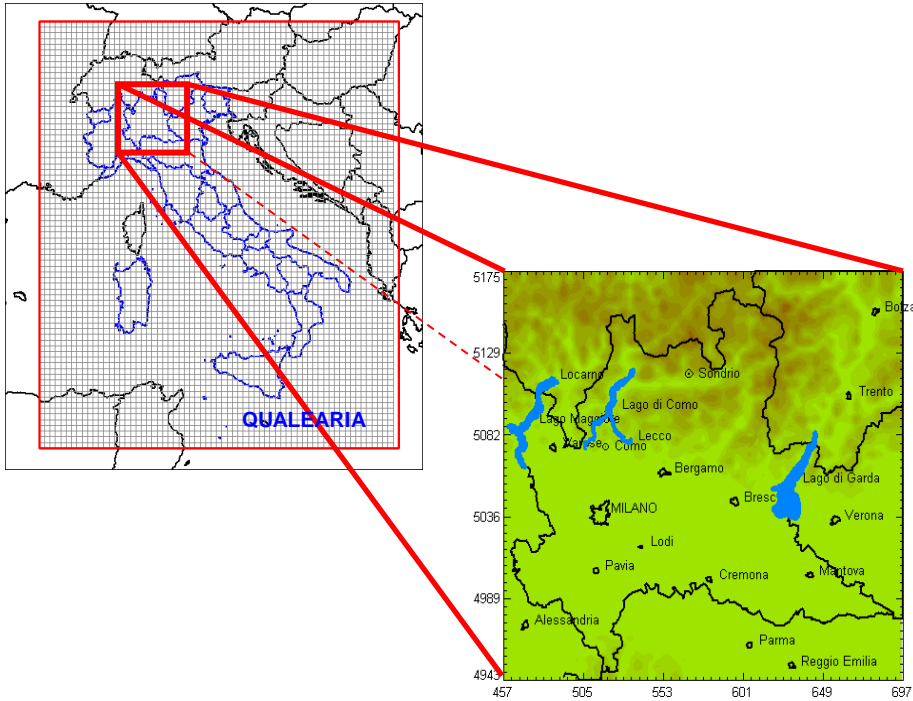


*Black circles (●) and grey squares (■) correspond to EXPAH and Lazio Region monitoring sites.*

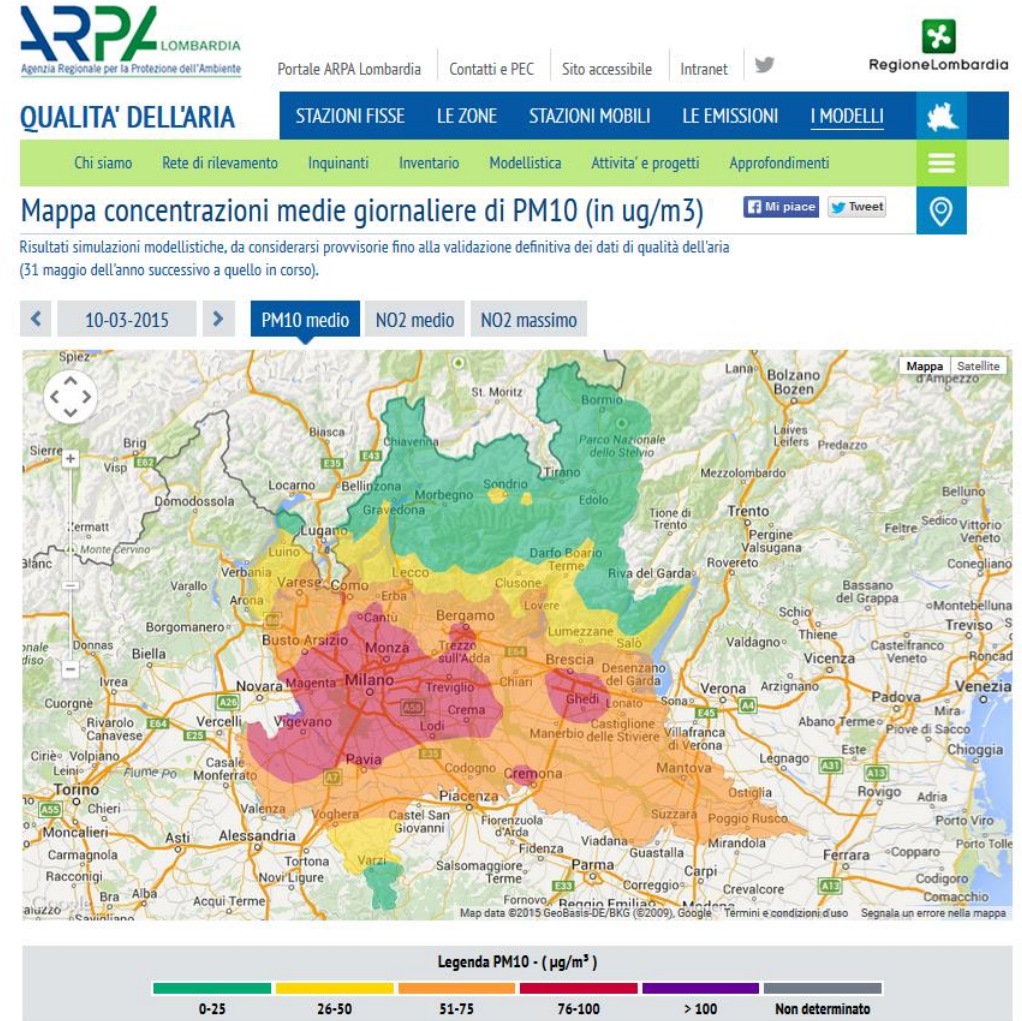


■ Measured ■ 100% model ■ Data Fusion

# Lombardy (Northern Italy) NRT system



The Regional Environmental Protection Agency (ARPA) uses past (yesterday) concentration fields (provided by FARM model) and observations (from regional monitoring network) to produce Near Real Time (NRT) air quality maps

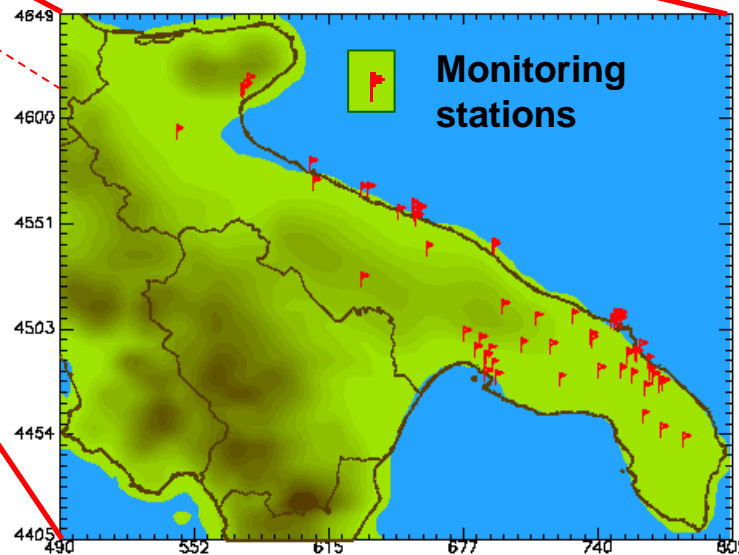
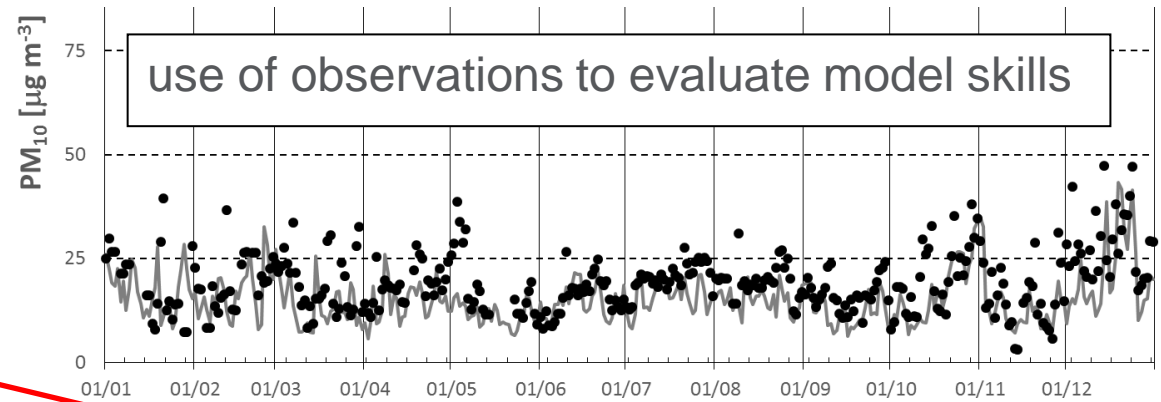
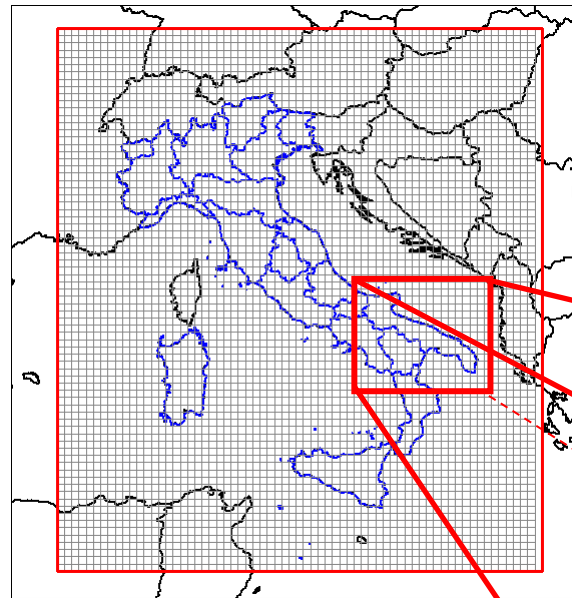


[http://www2.arpalombardia.it/sites/qaria/\\_layouts/15/qaria/IModelli.aspx](http://www2.arpalombardia.it/sites/qaria/_layouts/15/qaria/IModelli.aspx)



# An example of air quality assessment

## Apulia Region – Southern Italy



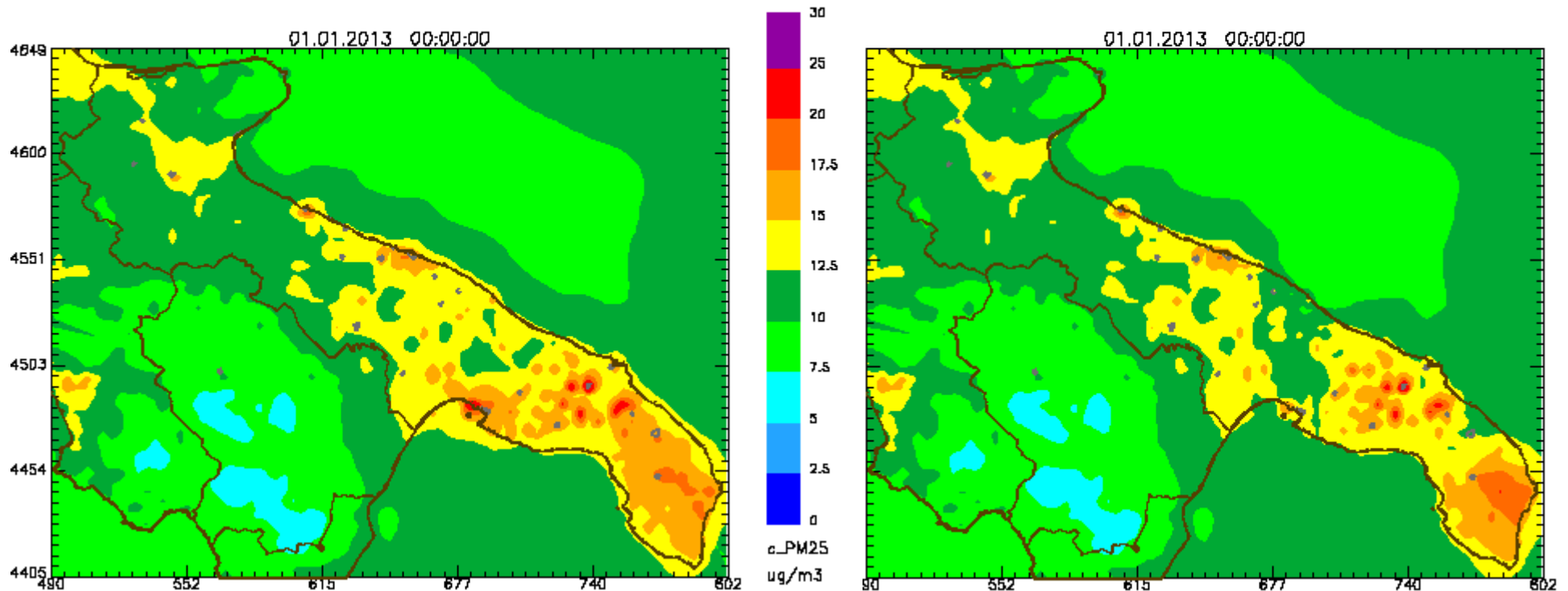
# An example of air quality assessment

## PM<sub>2.5</sub>

Min = 6.539 – Max = 27.78 [ $\mu\text{g}/\text{m}^3$ ]

Min = 6.539 – Max = 27.04 [ $\mu\text{g}/\text{m}^3$ ]

integration of model results and observations



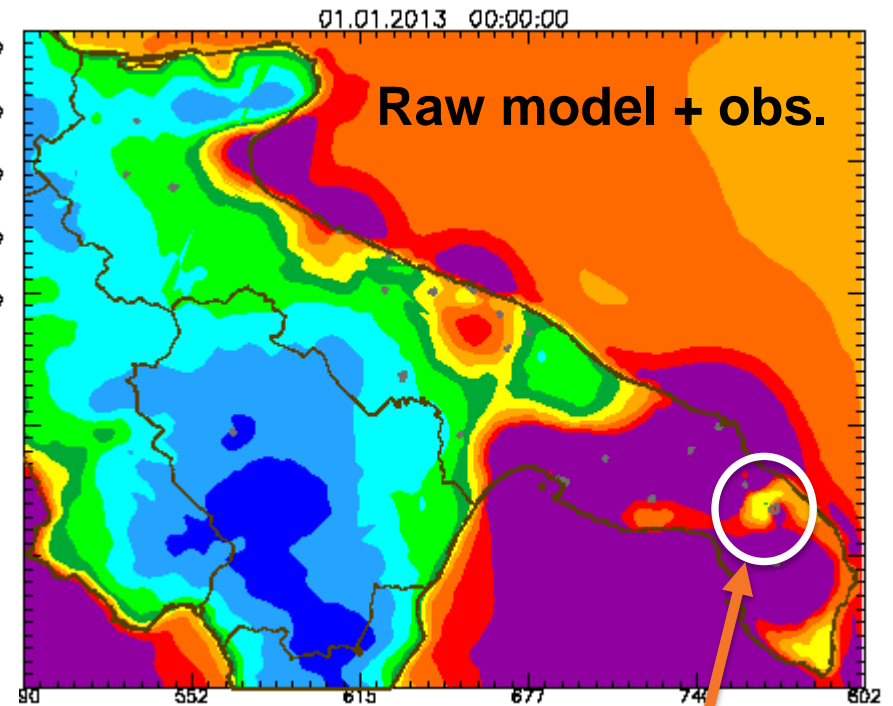
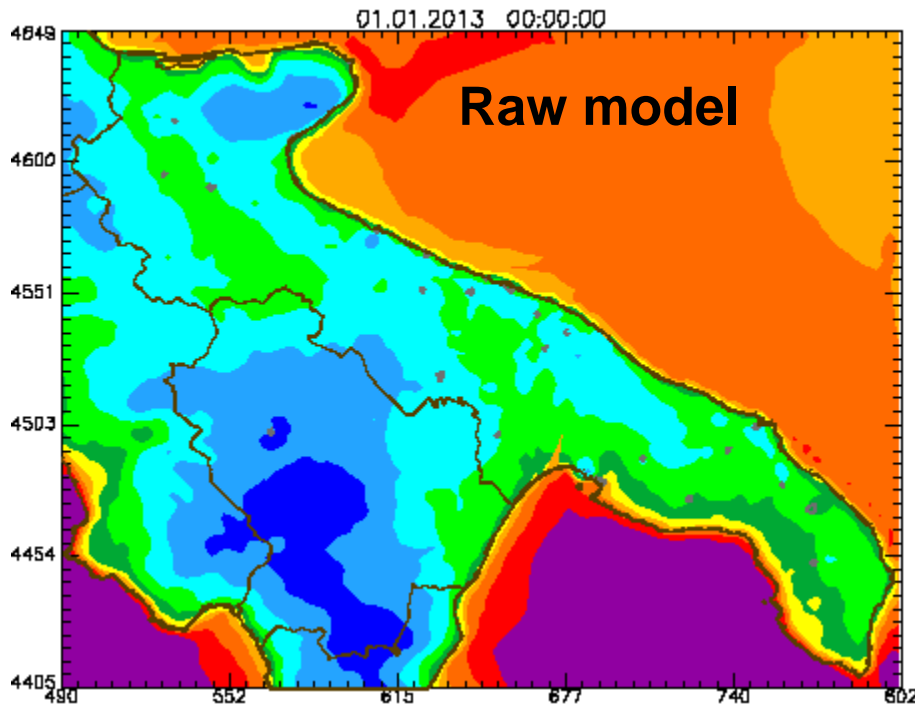
Raw model

Raw model + obs.

Yearly average limit value:  $25 \mu\text{g m}^{-3}$

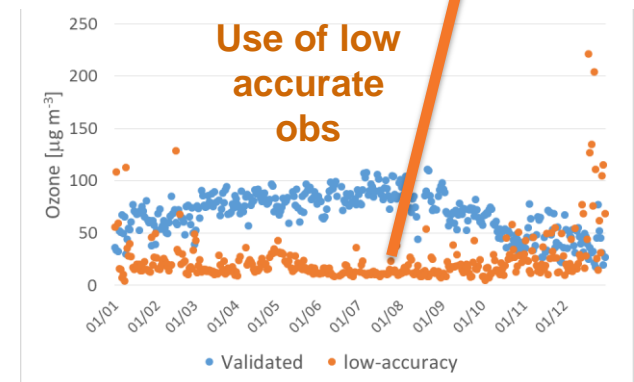
# An example of air quality assessment

O<sub>3</sub>



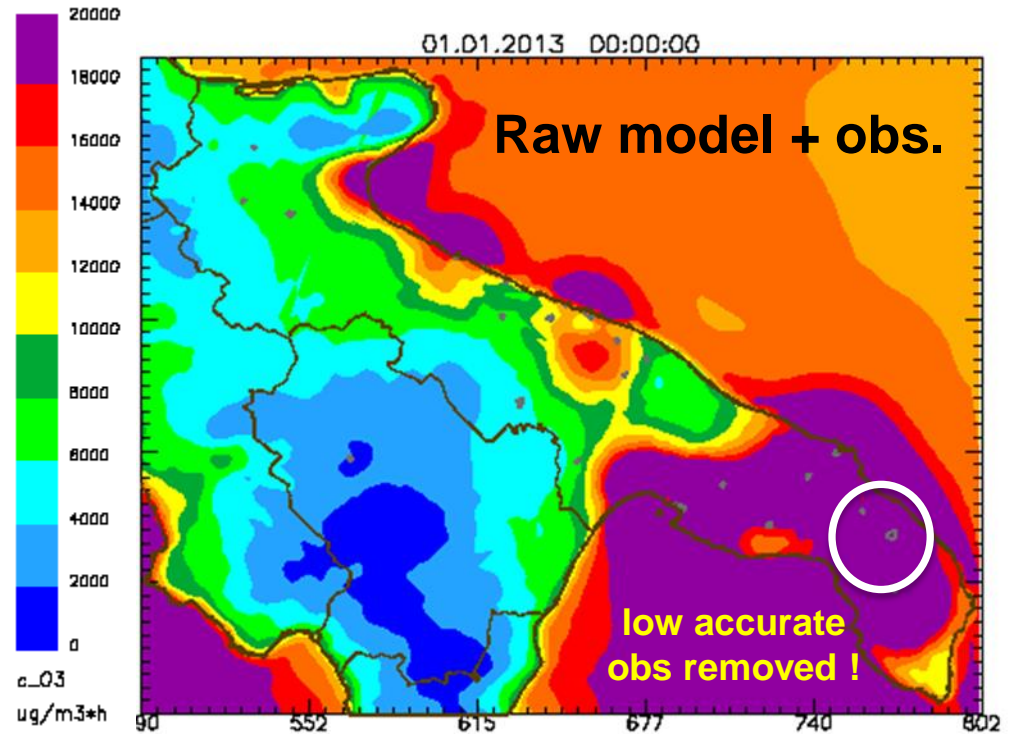
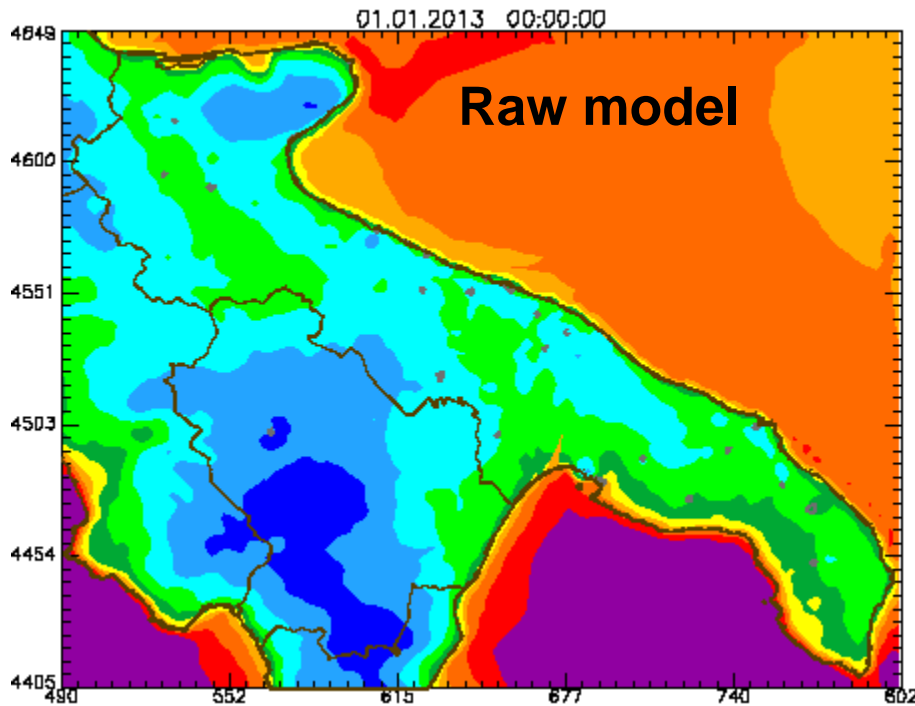
AOT40 – limit value  $18000 \mu\text{g m}^{-3} \text{ h}$

AOT40 means accumulated amount of ozone over the threshold value of 40 ppb



# An example of air quality assessment

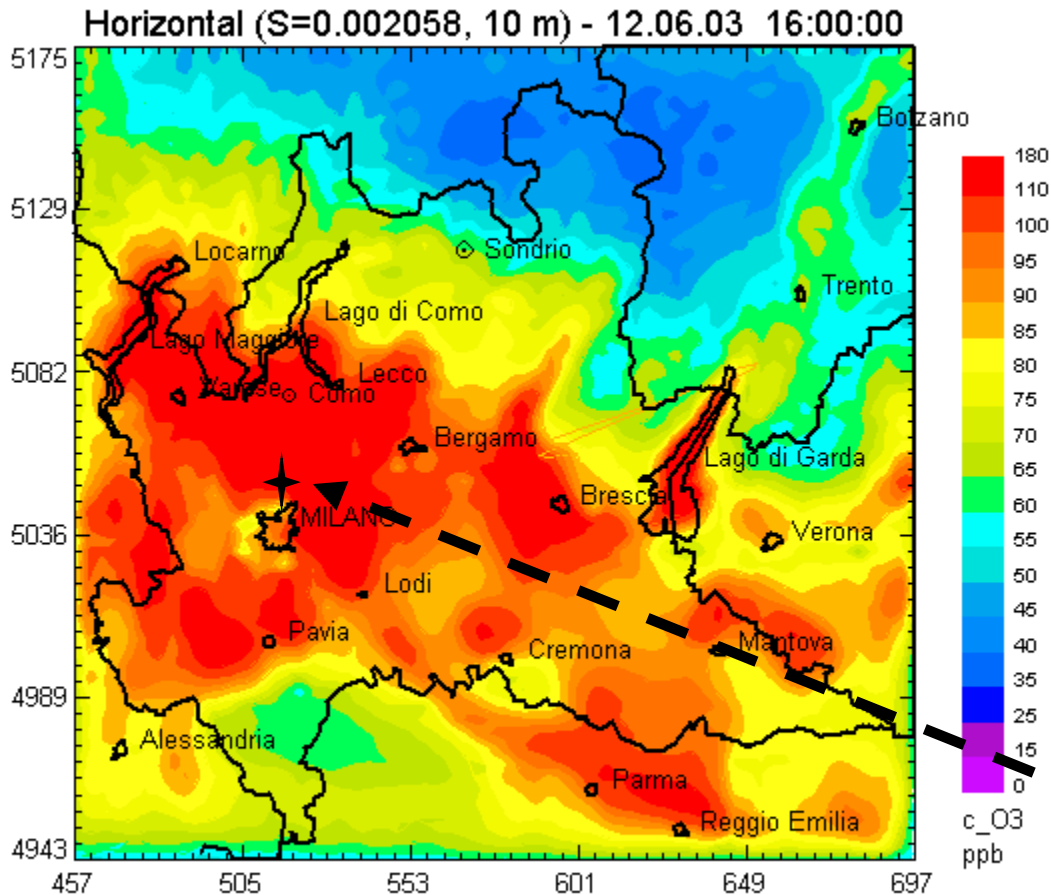
O<sub>3</sub>



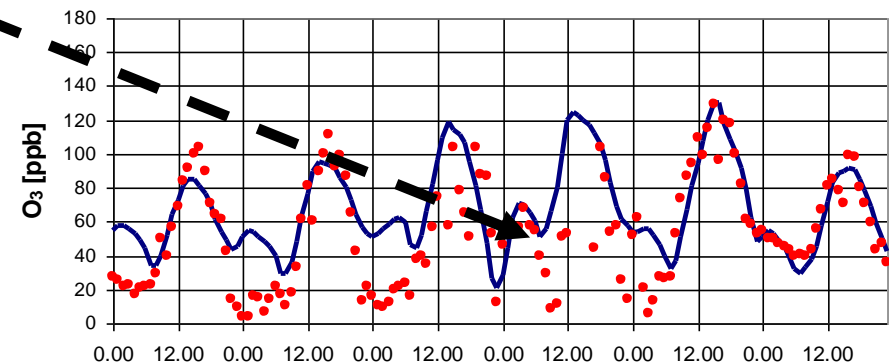
AOT40 – limit value 18000  $\mu\text{g m}^{-3} \text{h}$

# ARIANET Models support measurements interpretation

## “Ozone nocturnal peak”



Computed Measured





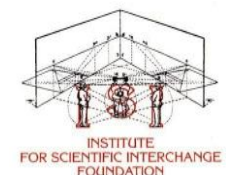
# Torino MSS simulation



Ongoing project funded by P.O.R./F.E.S.R. 2007-2013



ELISE Partnership:

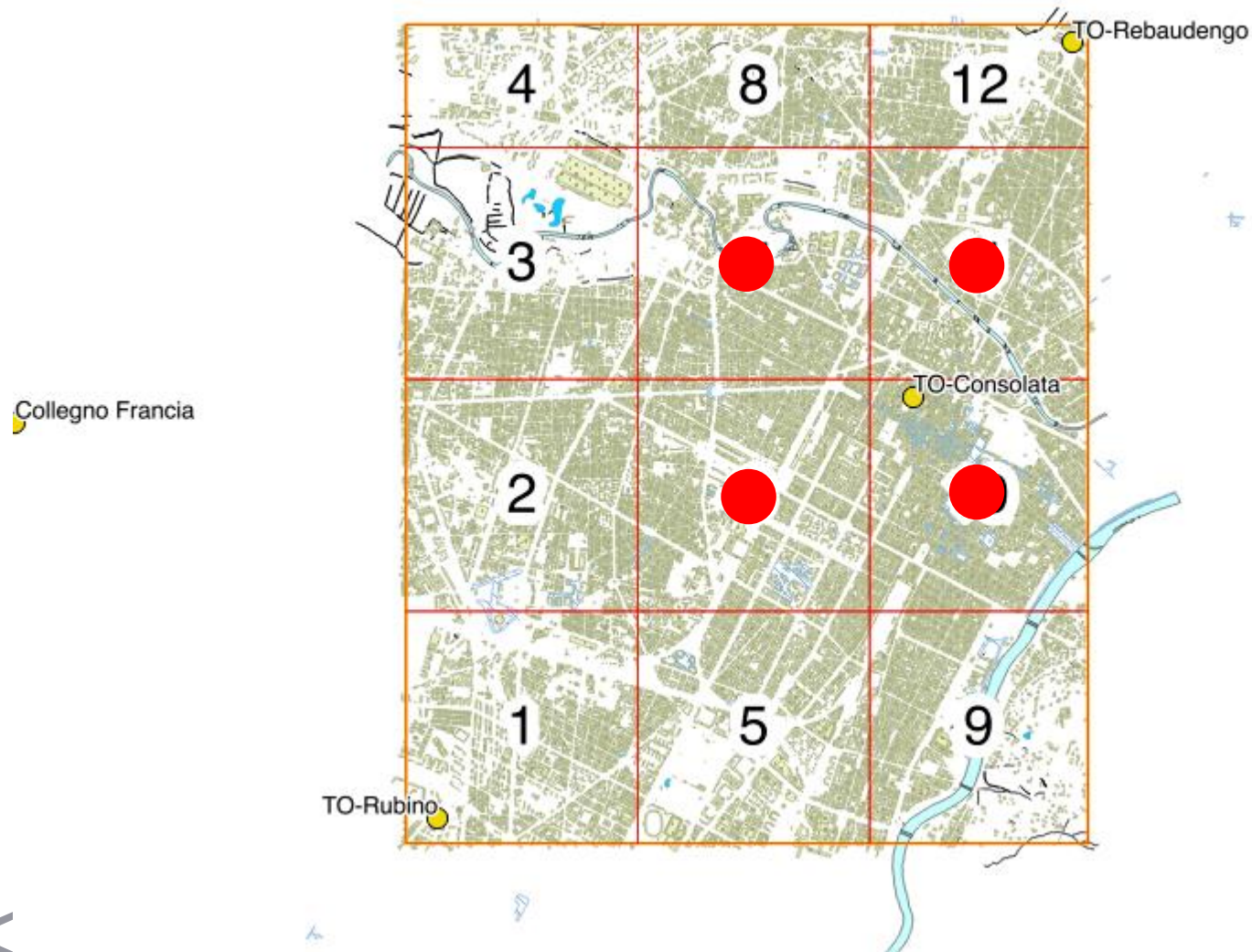


**Total domain : 6 km x 7.2 km – Horizontal resolution: 6x6 m<sup>2</sup>**



# Torino MSS simulation

Domain is splitted into 12 «tiles»: maximum size is 341 x 341 cells

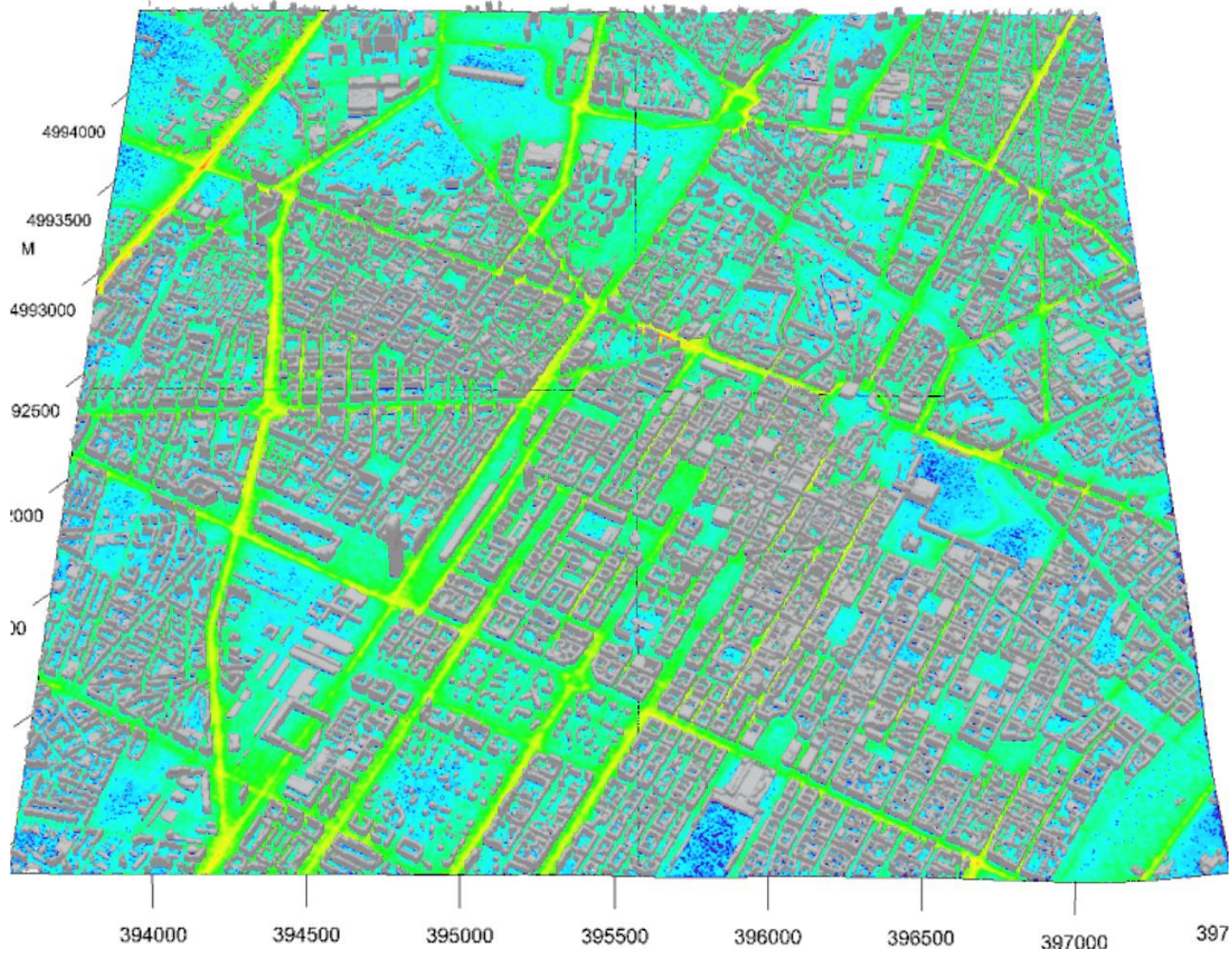
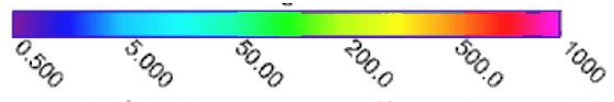




# Torino MSS simulation



03/06/2015 13:00:0.00



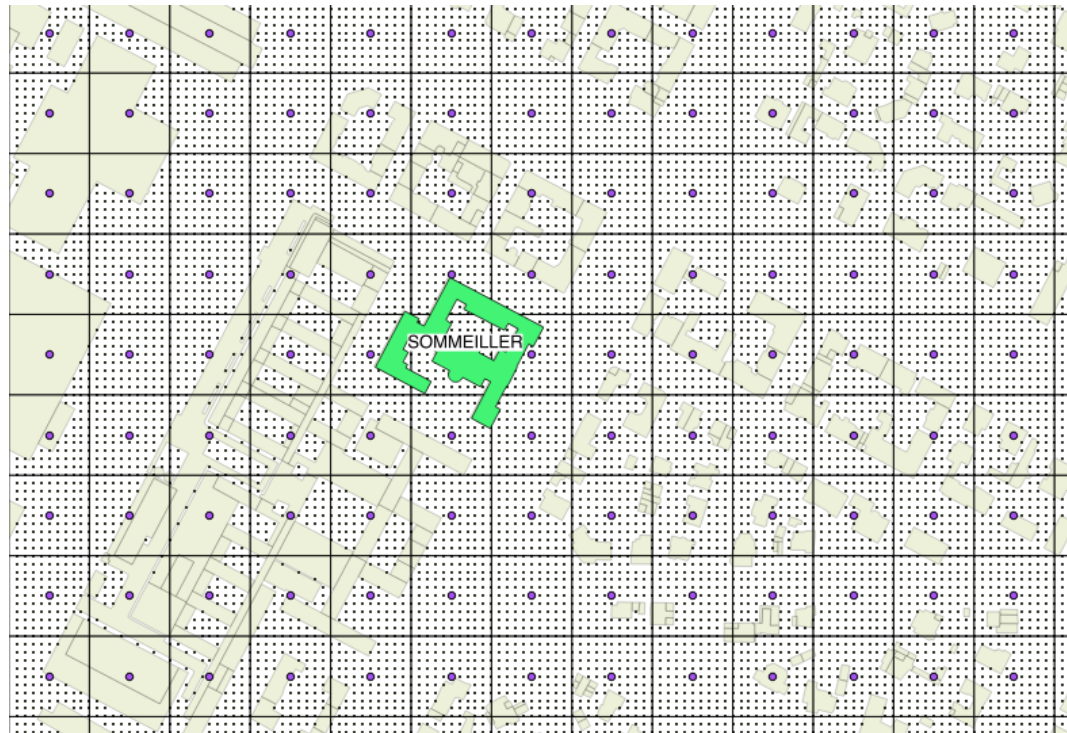
**NO<sub>x</sub>**  
**μg m<sup>-3</sup>**

**hourly NO<sub>x</sub> ground level concentrations at high resolution on the 4 tiles covered by red points**



# Torino MSS simulation

*Between April and June 2015, 150 low-budget mobile NO<sub>2</sub> sensors carried by selected high school students will provide high resolution temporal and spatial monitoring of the city air quality.*



Monitoring data, after being time- and space- averaged (1 hour, 60 m cells), will be fed into the modelled fields (computed by **MSS** model) in order to provide a more realistic picture



Personal exposure  
Decision support  
Environmental awareness ...

- The integration of air quality models and observations is a challenging issue for air quality assessment and forecast (**KF techniques**)
- Both observations and models are affected by uncertainties
- The precision of the analysis (product of **DA techniques**) is the sum of the precisions of the observation and model output
- DA reveal critical situations in both modelling and monitoring
- **potential of new sensing technologies: opportunity to deploy a large number of sensors possibly measuring a wide range of pollutants** (smaller scales simulation provide insights about their location)
- **Increase the accuracy**, if needed, of these new sensing technologies to produce more reliable analysis

# Acknowledgments

***The modelling systems used in this presentation are developed and distributed by Arianet S.r.l. and Aria Technologies S.A.***



***The contribution of Arianet, Aria Technologies, Simularia and many other coworkers is acknowledged.***

