

CHALLENGES AND OPPORTUNITIES FOR OPEN LOTOS-EUROS MODEL TO REPRODUCE THE DYNAMICS FOR TROPICAL ANDES DOMAIN

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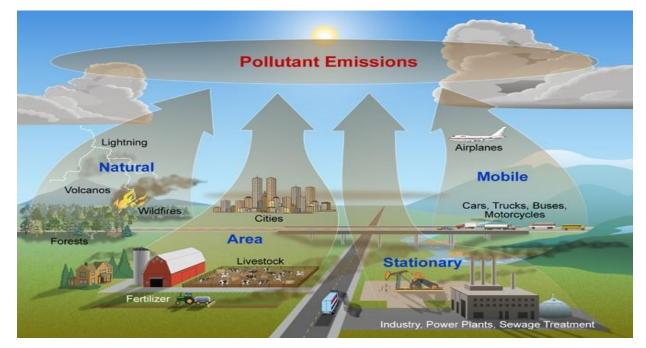
OUTLINE

- Air Quality
- Air Quality Models
- LOTOS-EUROS Model
- Experiment, results and analysis
- Data Assimilation



AIR QUALITY (1/3)

• Air pollution is defined as the presence of solid, liquid or gaseous components in the atmosphere.

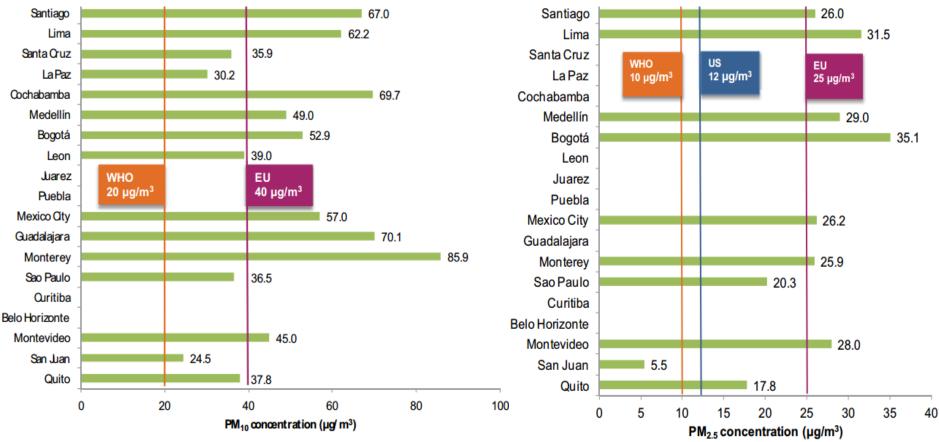


Source: http://www.vpaaz.org/





AIR QUALITY (2/3)



Annual average concentrations of PM₁₀ y PM_{2.5} -2011. Source: Air Quality In Latin America: An Overview, CAI



AIR QUALITY (3/3)



Air quality in Medellín. Source: www.catorce6.com

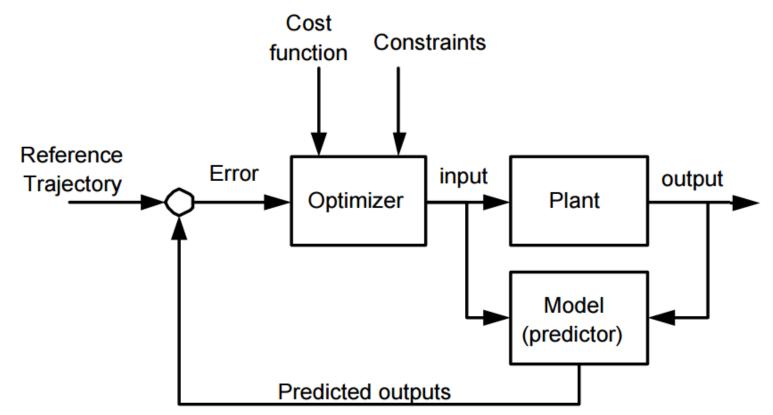
AIR QUALITY MODELS (1/3)

- Essential to any corrective action is the ability to measure and estimate the concentration of atmospheric pollutants.
- The mathematical models known as Air Quality Models (AQM), allow a permanent monitoring and in many cases predictions of the air quality behavior.

Is it possible to model the atmosphere behavior at the Aburrá Valley scale so that it can to monitor environmental pollutants and predict their behavior?



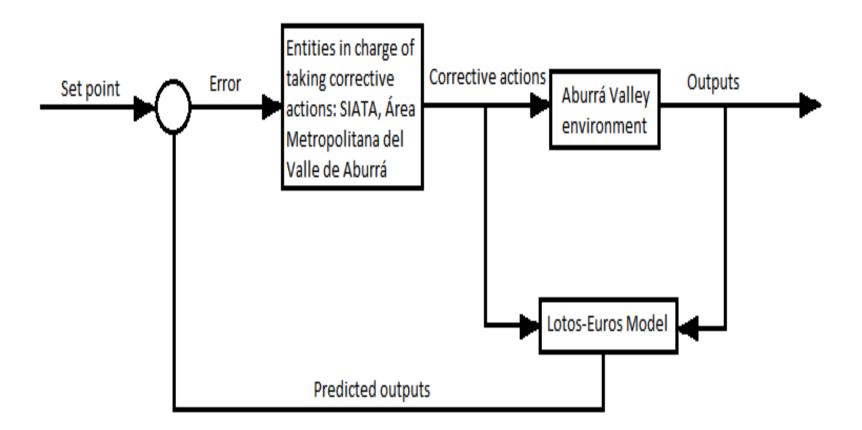
AIR QUALITY MODELS (2/3)



MPC block diagram. Sourcer: Stable Reconfigurable Generalized Predictive Control With Application to Flight Control. (Shi, Kelkar, & Soloway, 2005)



AIR QUALITY MODELS (3/3)



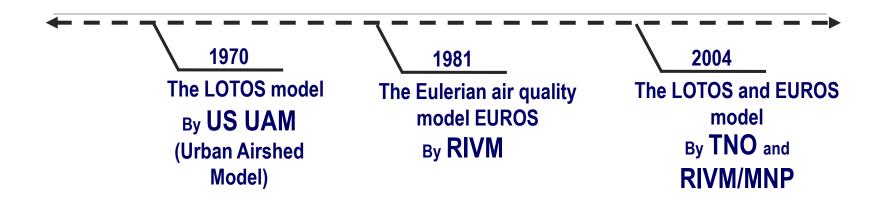
MPC block diagram for the problem of air quality in the Aburrá Valley



LOTOS-EUROS MODEL (1/3)

The LOTOS-EUROS

(LOng Term Ozone Simulation- EURopean Operational Smog model)





LOTOS-EUROS MODEL (2/3)

SmogProg, Netherlands

Used by Dutch authorities as official forecasts to predict Ozone concentrations and PM in national territory.

PANDA, China

Used to collect a set of models and looks for modeling and predicting pollutants concentrations in Chinese territory.





FIFA WORLD CUP 2016, Brazil

Used to monitoring and predicting Ozone concentrations, Nitrogen Dioxide and PM 2.5 while was the FIFA World Cup.





LOTOS-EUROS MODEL (3/3)

 $\frac{\partial C}{\partial t} + U \frac{\partial C}{\partial x} + V \frac{\partial C}{\partial y} + W \frac{\partial C}{\partial z} = \frac{\partial}{\partial t} \left(H \frac{\partial C}{\partial t} \right)$

$$\left(K_{h}\frac{\partial C}{\partial x}\right) + \frac{\partial}{\partial y}\left(K_{h}\frac{\partial C}{\partial y}\right) + \frac{\partial}{\partial z}\left(K_{z}\frac{\partial C}{\partial z}\right) + E$$

Entrainment and Diffusion

Emissions

Chemistry

 $K_{h} = \eta |Def|$ $|Def| = \sqrt{\left[\left(\frac{\partial U}{\partial x} + \frac{\partial V}{\partial y}\right)^{2} + \left(\frac{\partial U}{\partial x} - \frac{\partial V}{\partial y}\right)^{2}\right]}$

 $\frac{\partial C}{\partial t} = -\Lambda C$

 $\Delta D = C_0 (1 - e^{-\Lambda t}) \Delta z$

Model Input

LOTOS-EUROS can use one of two mechanisms of simplified reactions, Carbon Bond-IV (CB-IV) or CB99.

Deposition

+(R)+Q

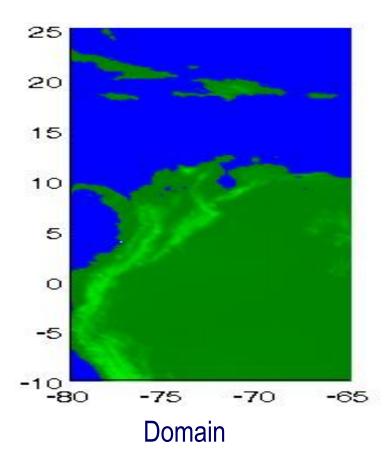
Dry and Wet Deposition



EXPERIMENT

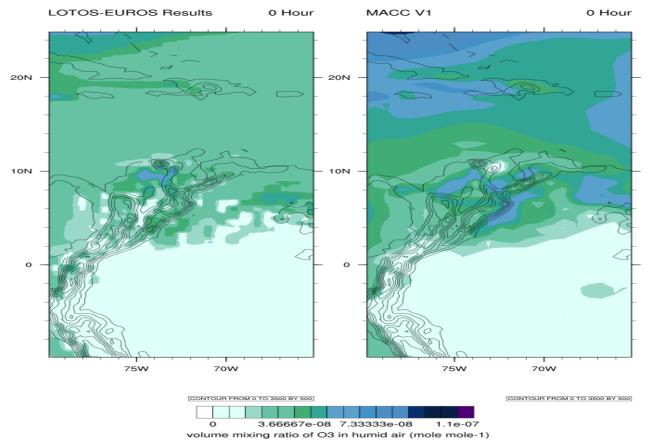
Experiment Parameters

Domain	Between -80 to -65 west degrees, and 25 to-10 north degrees
Resolution	0.25°x 0.25°
Metereologic al Data	ECMWF database
Emissions	MACC 1 and EDGAR databases
Date	Between the days March 24 and April 4, 2015.





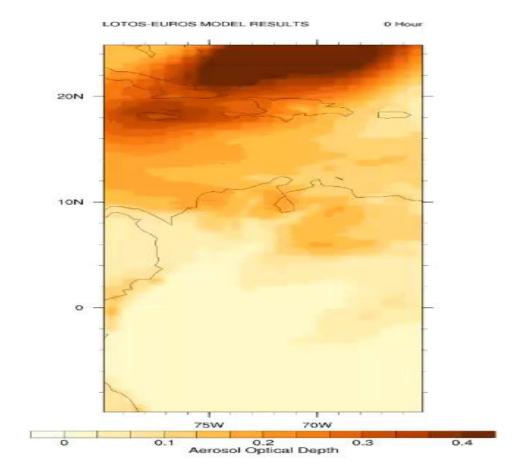
RESULTS (1/2)





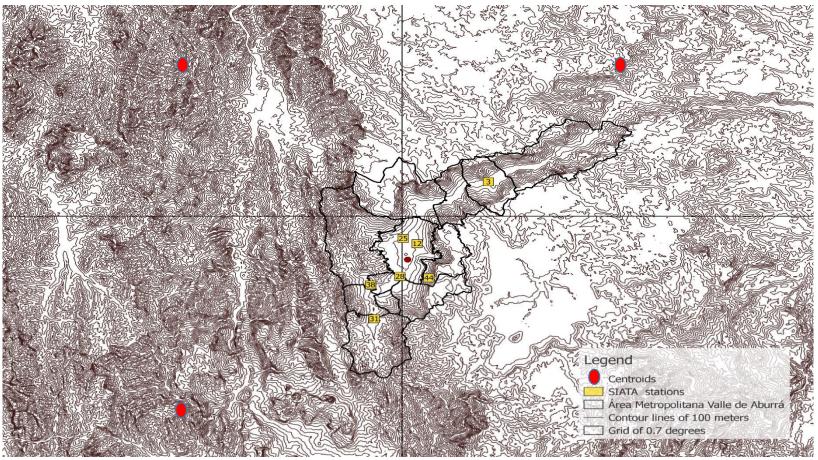
UNIVERSIDAD

RESULTS (2/2)





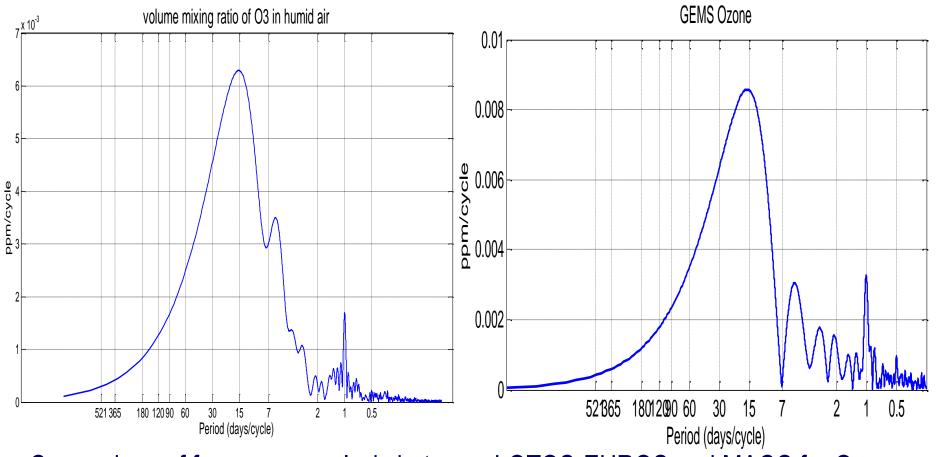
PRELIMINARY ANALYSIS (1/5)



Aburrá Valley



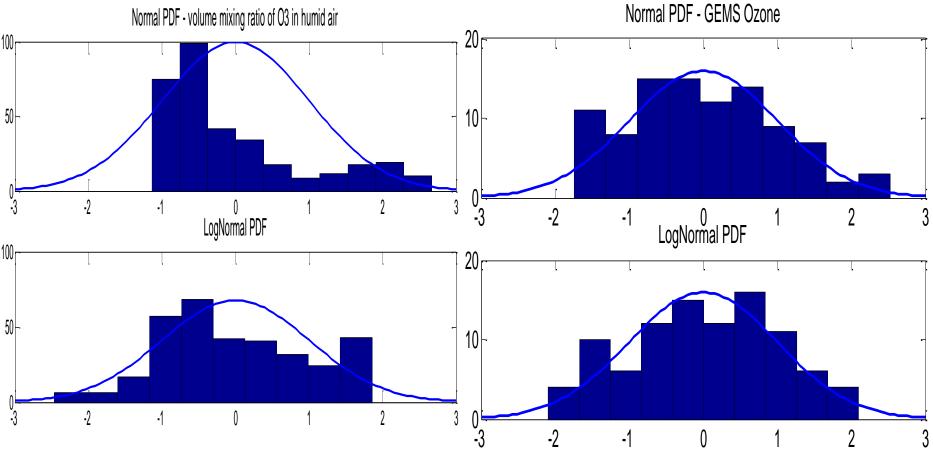
PRELIMINARY ANALYSIS (2/5)



Comparison of frequency analysis between LOTOS-EUROS and MACC for O₃



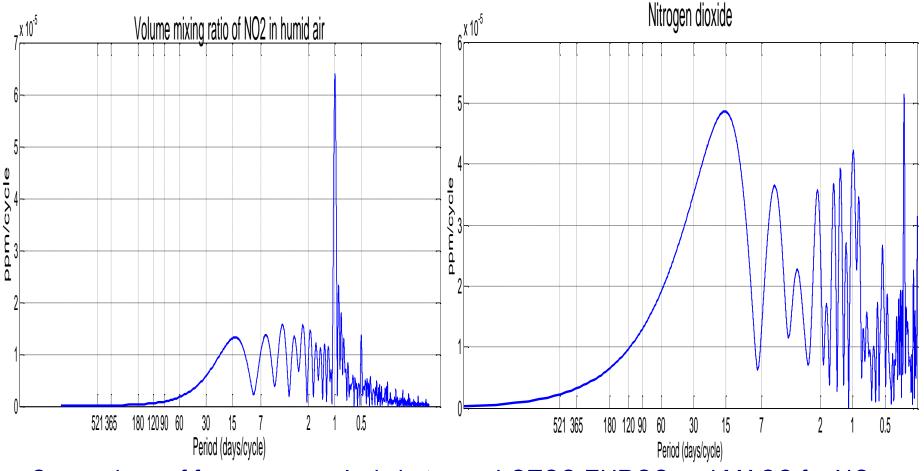
PRELIMINARY ANALYSIS (3/5)



Comparison of distribution between LOTOS-EUROS and MACC for O₃

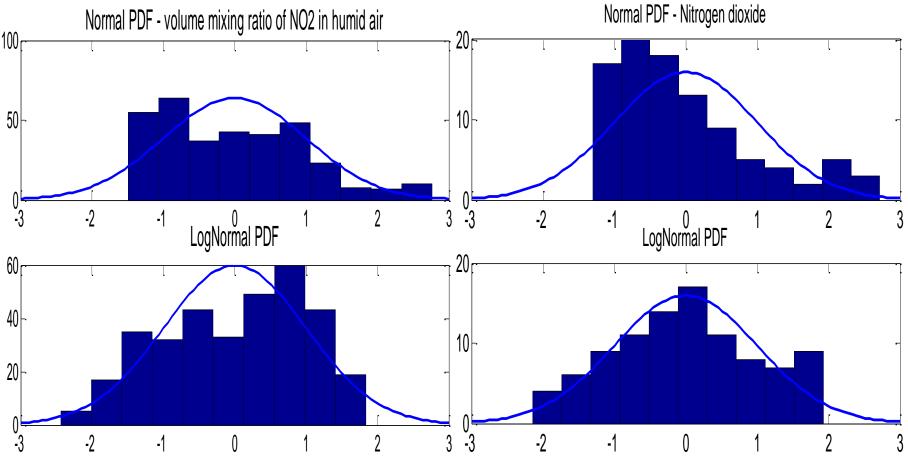


PRELIMINARY ANALYSIS (4/5)



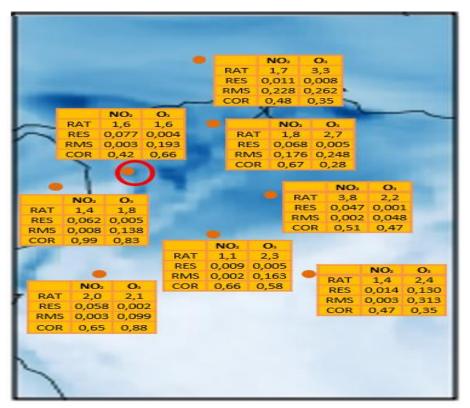
Comparison of frequency analysis between LOTOS-EUROS and MACC for NO2

PRELIMINARY ANALYSIS (5/5)



Comparison of distribution between LOTOS-EUROS and MACC for NO2

STATISTICAL MEASUREMENT



Distributions and statistical measures of the comparison points. The red circle is the Aburrá Valley (Medellín) location.

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Statistical measures features for all the domain

Variable	NO ₂	03
Ratio	1.8	2.1
Residual	0.003	0.005
rms	0.053	0.183
Corr. Coef	0.62	0.65



CHALLENGES

Units changes

We must continue testing the TNO solution and compare.

At current resolution

LOTOS-EUROS is not able to represent the dynamics in certain cities.

Zooming

With the best run of the model to provide boundary conditions.

Data Assimilation

Ensemble Kalman filter or Variational Methods.

Meteo data

WRF

Emissions Not available





OPPORTUNITIES FOR THE TEAM

LOTOS-EUROS Coupling with a meteorological model like WRF. The WRF model is currently implemented in the region for the GIGA Research Group of the Universidad de Antioquia.

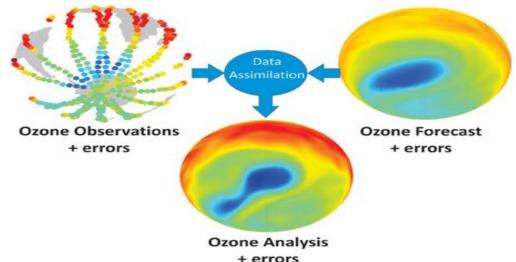
WRF is able to do a representation of the meteorology in a higher resolution than the databases available for the region.

Data Assimilation



DATA ASSIMILATION (1/2)

Data assimilation is a mathematical process that provides integration between measured values (observations) and a dynamical transport model, to improve the operation of the model.



Data Assimilation. Source: Data assimilation: making sense of Earth Observation, (Lahoz and Schneider, 2014)



DATA ASSIMILATION (2/2)

Filtering methods.

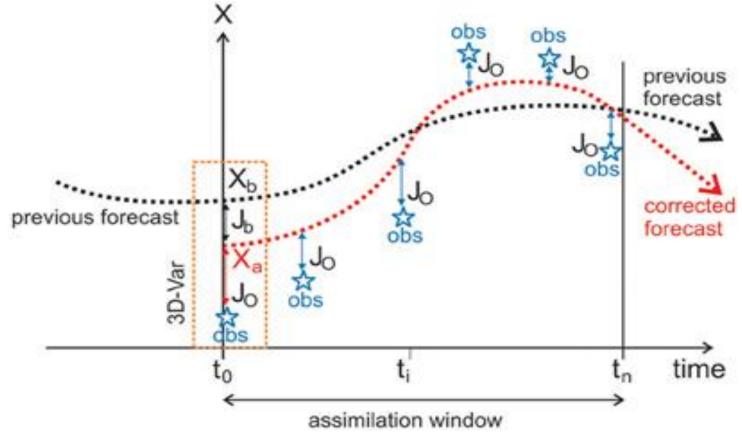
Sequential method that looks for improvements in the prediction of the model reducing the covariance error between observations and model outputs

Variational methods.

Looks for the optimal states set that minimize cost functions between observations made and model outputs



VARIATIONAL METHODS (1/2)



Variational Methods. Source: Data assimilation: making sense of Earth Observation, (Lahoz and Schneider, 2014)



VARIATIONAL METHODS (2/2)

• Consider the discrete model of a nonlinear dynamical system given by

 $X(t_{i+1}) = M_i (X(t_i), U(t_i))$ $Y(t_i) = H (X(t_i)) + \eta(t_i)$

• The method 4D-Var minimize the functional cost like shown next using the initial state value as decision variable

$$J(X_0) = \frac{1}{2} \left(X^b - X_0 \right)^T B_o^{-1} \left(X^b - X_0 \right) + \frac{1}{2} \sum_{i=0}^N \left(Y(t_i) - H(X(t_i)) \right)^T R_i^{-1} \left(Y(t_i) - H(X(t_i)) \right)$$



ENSEMBLE KALMAN FILTER

- The EnKF was designed to resolve two major problems related to the use of the Extended Kalman Filter (EKF) with nonlinear dynamics in large state spaces.
- The EnKF is a sequential filter method, it means that the model is integrated forward on time, and when a measurement is available, is used to reinitialize the model before the integration.



FUTURE WORKS

One of the main objectives is to increase the Resolution LOTOS-EUROS to allow the representation of the pollutants dynamics in the Aburrá Valley

To contribute to forecasting systems of Air Quality in Aburrá Valley using LOTOS-EUROS Model through Data Assimilation taking into account the need for more data provided by SIATA and other governmental agencies.



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THANKS!

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