

# How different air quality forecasting systems (should) operate over Portugal?

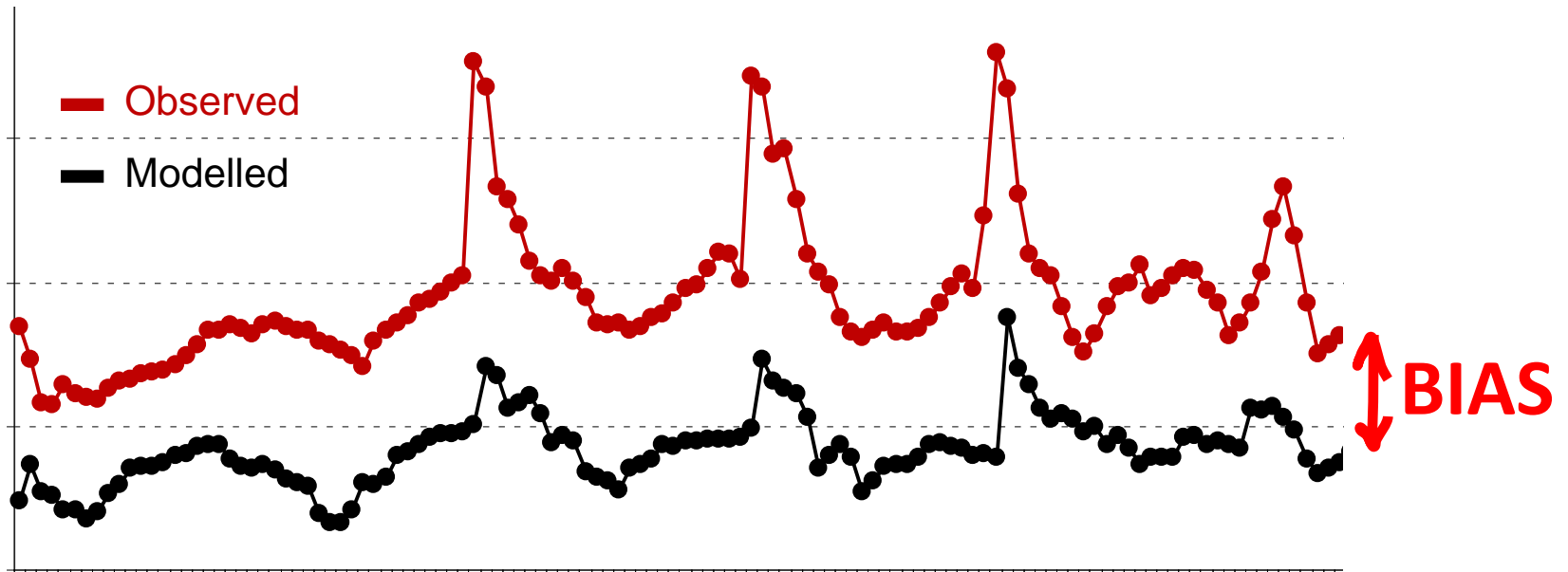


Carlos Borrego | Alexandra Monteiro | Isabel Ribeiro | Ana Isabel Miranda  
University of Aveiro | Portugal

M. T. Pay | S. Basart | J. M. Baldasano  
BSC | Barcelona Supercomputing Center

HARMO14 conference  
Kos, Greece | 2-6 October 2011

# Motivation



Test, comprehend and evaluate different bias correction techniques

Very often, large errors and bias occur on forecasting modelling



To improve the air quality forecast  
using bias-correction



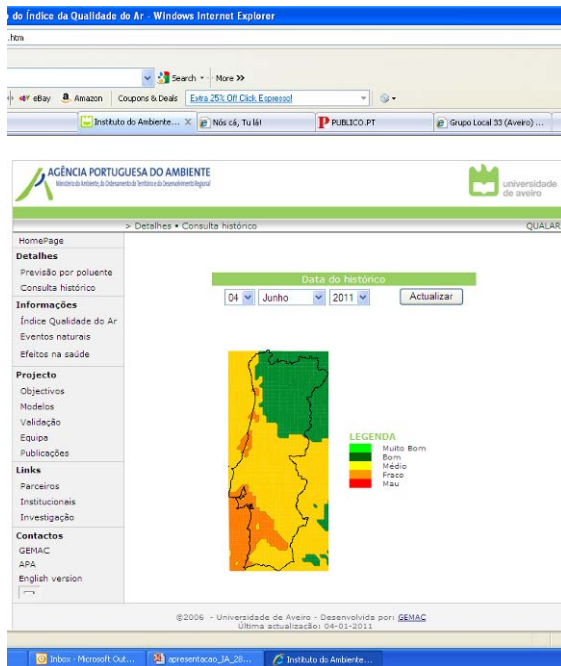
**Evaluate and test different bias  
correction techniques**



# How?

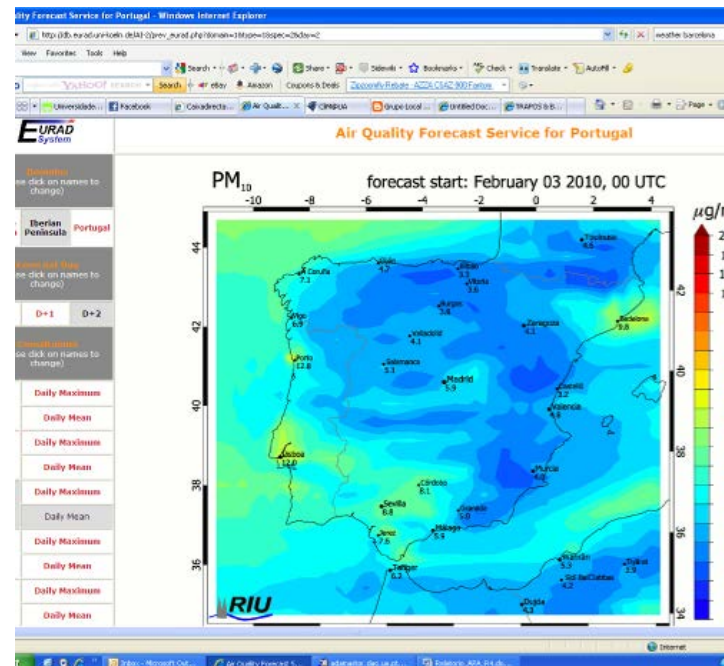
3 different models deliver daily operational forecasts over Portugal  
Their performance with bias-correction was investigated for 2010 year

## CHIMERE | UA

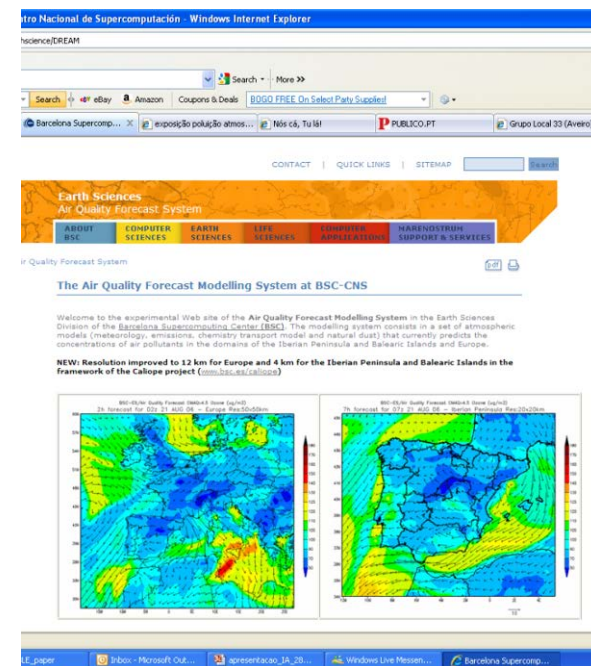


5 x 5 km

## EURAD | RIU + UA



## CALIOPE | BSC, Spain



4 x 4 km

# Bias-correction techniques

We started with 2 pos-processing methods, comparing...

## SUBST

an **additive correction** of the mean bias

$$C^{corrected}(h, day) = \frac{1}{ndays} \sum_{ndays} (C_h^{model} - C_h^{obs}) + C^{model}(h, day)$$

## RAT

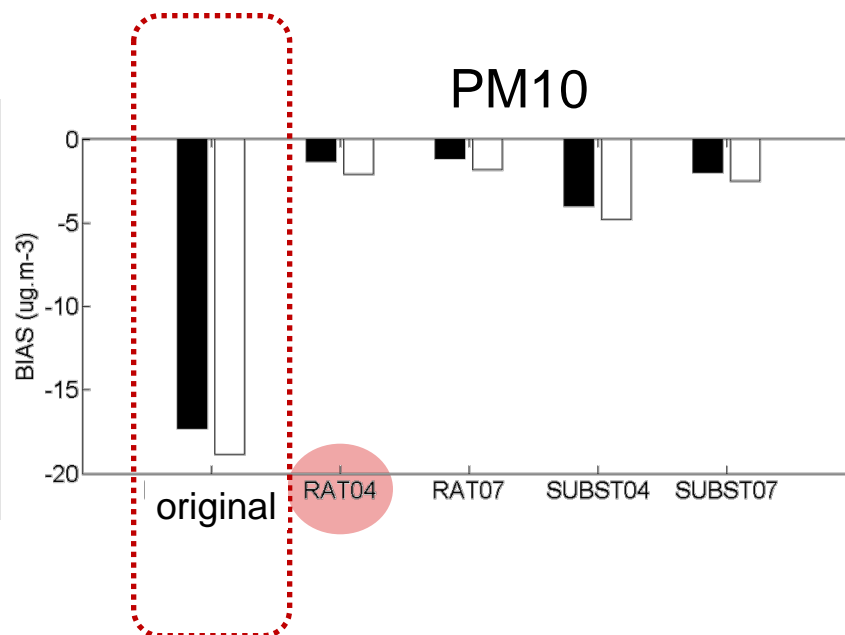
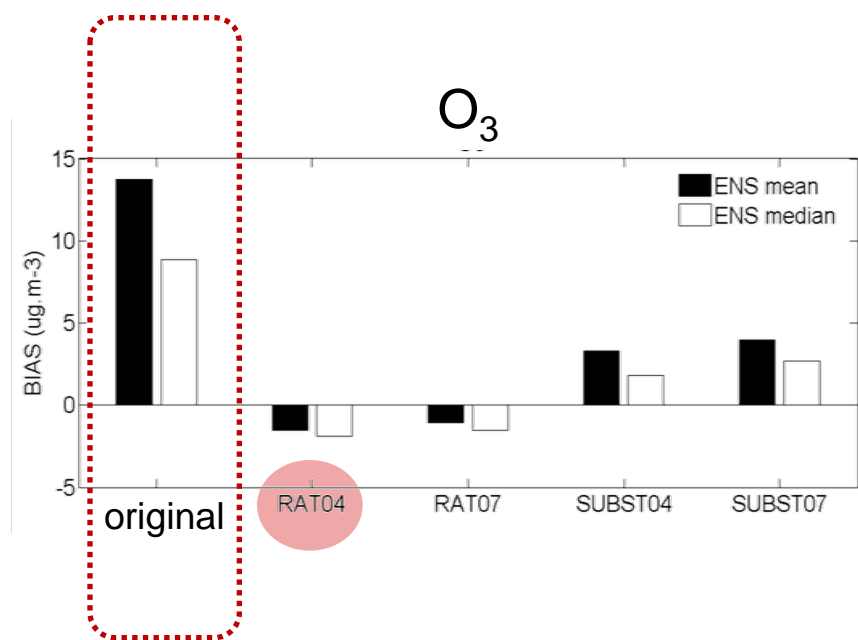
a **multiplicative ratio** correction

$$C^{corrected}(h, day) = \frac{\sum_{ndays} C^{obs}(h, day)}{\sum_{ndays} C^{model}(h, day)} \times C^{model}(h, day)$$

both tested using different period of previous days (3-4 and 7 days) to correct the forecast bias

# Bias-correction techniques

## RAT & SUBST



- after BIAS correction, model results have a decrease > 70% on average systematic error
- the multiplicative ratio: better correction technique
- synoptic conditions are characterized by a 3-4 day period.

# Bias-correction techniques

## Kalman Filter (KF)

- KF performance is sensitive to **error ratio** ( $\sigma^2\eta/\sigma^2\varepsilon$ ):

$\sigma^2\eta$  forecast-error white-noise variance

$\sigma^2\varepsilon$  true forecast-bias white-noise variance



optimal error ratio to generate  
the best forecast

- an **optimal error ratio** was estimated minimizing **RMSE** and maximizing the **CORR** for all the stations
- Due to the relatively low extension of Portugal, it was assume **no spatial variability** of optimal error ratios over the country



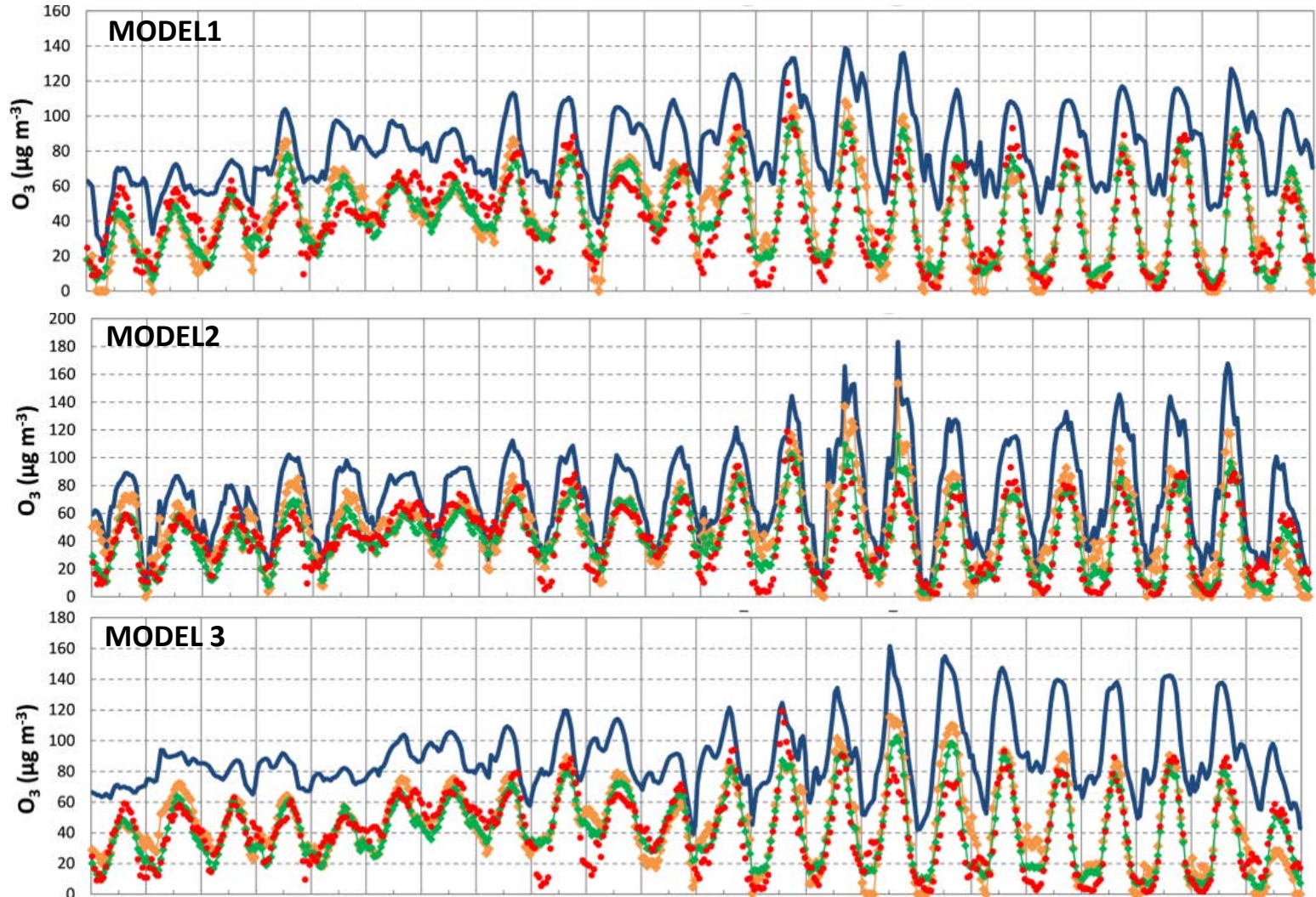
How do bias-correction techniques perform in general?



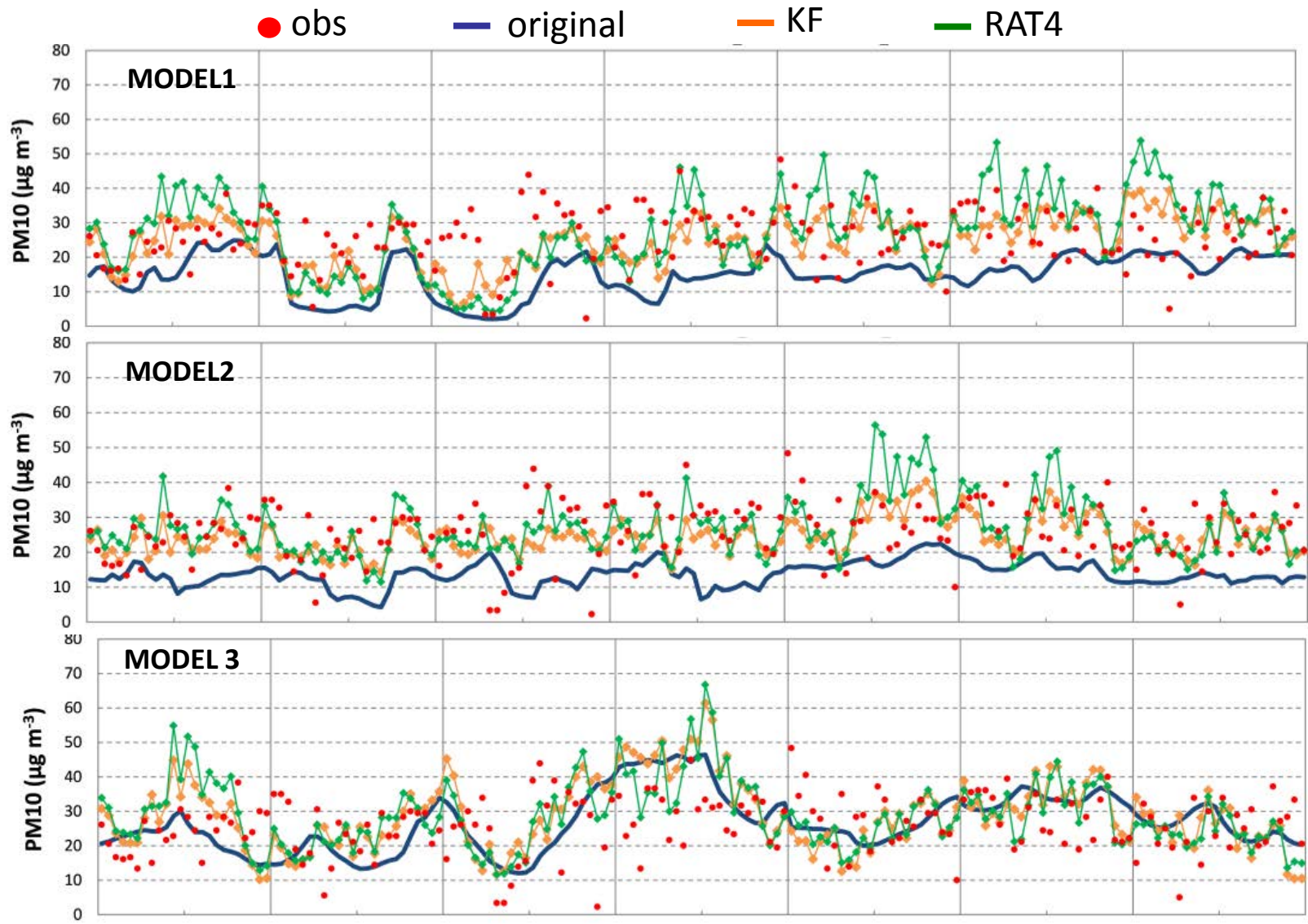


# O<sub>3</sub> time series

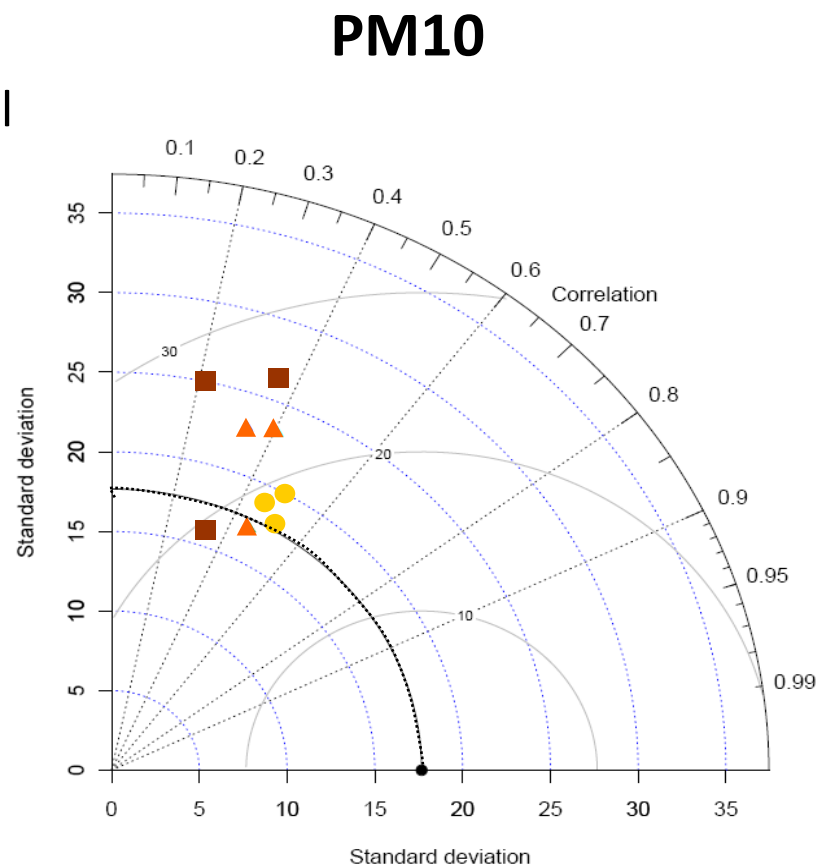
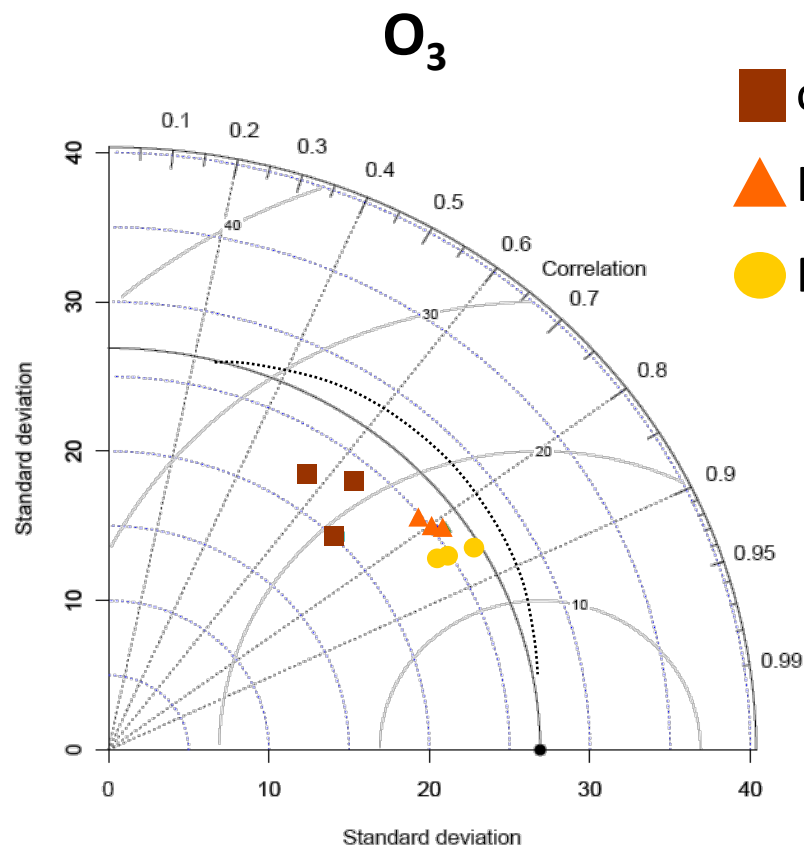
● obs      — original      — KF      — RAT4



# PM10 time series



# Taylor diagram results



Models skills improved significantly with bias-correction

No evident technique better than the other (mainly for O<sub>3</sub>!!)



Did bias-correction techniques  
improve forecast performance?








# PM10 episodes | daily limit value exceedances

DATE	STATION	MODEL 1	MODEL 2	MODEL 3
04/07/2010	SOB	0	0	0
05/07/2010	SOB	0	1	0
06/07/2010	SOB	0	1	1
28/07/2010	SOB	1	1	1
29/07/2010	FUN	0	0	0
29/07/2010	SOB	1	1	1
04/08/2010	SOB	0	0	0
06/08/2010	SOB	0	1	0
07/08/2010	SOB	1	1	1
08/08/2010	FUN	1	1	1
09/08/2010	CAM	1	1	1
09/08/2010	ERV	0	1	1
09/08/2010	FUN	1	1	1
09/08/2010	OLI	0	1	1
10/08/2010	FUN	1	1	1
10/08/2010	MVE	1	1	1
11/08/2010	CAM	0	0	0
11/08/2010	FUN	0	0	0
11/08/2010	OLI	0	0	0
12/08/2010	FUN	0	0	0
30/08/2010	ERV	0	0	0
30/08/2010	SOB	1	1	0
31/08/2010	ERV	0	0	1
31/08/2010	SOB	1	1	0
20/10/2010	ERV	0	0	0
20/10/2010	OLI	0	1	0
21/10/2010	ERV	1	0	1
21/10/2010	OLI	1	1	1
22/10/2010	OLI	1	1	0
22/10/2010	SOB	1	1	1
23/10/2010	ERV	1	0	1
23/10/2010	SOB	1	1	1
27/10/2010	OLI	1	1	1
28/10/2010	OLI	1	1	1
28/10/2010	SOB	0	1	0
06/11/2010	OLI	0	1	1
11/11/2010	OLI	1	1	0
13/12/2010	SOB	0	0	0


**FORECAST**  
**ORIGINAL MODEL**  
  
**FORECAST AFTER**  
**BIAS CORRECTION**



# Problems & advantages of each technique

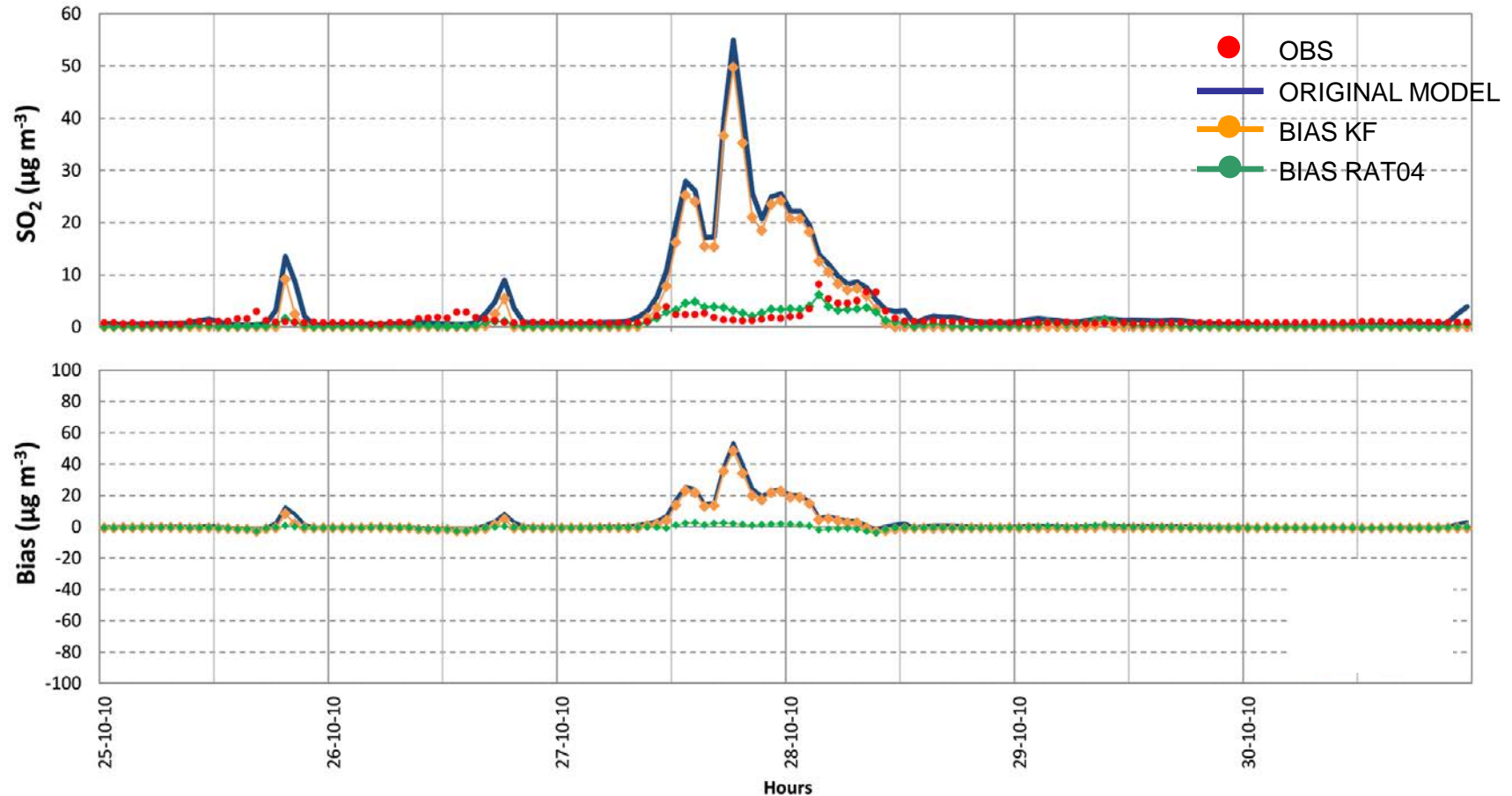
to understand the weakness and the strength of each technique...in order to improve them and its application





# where Kalman filter fails...

SO<sub>2</sub> - MVE - BR

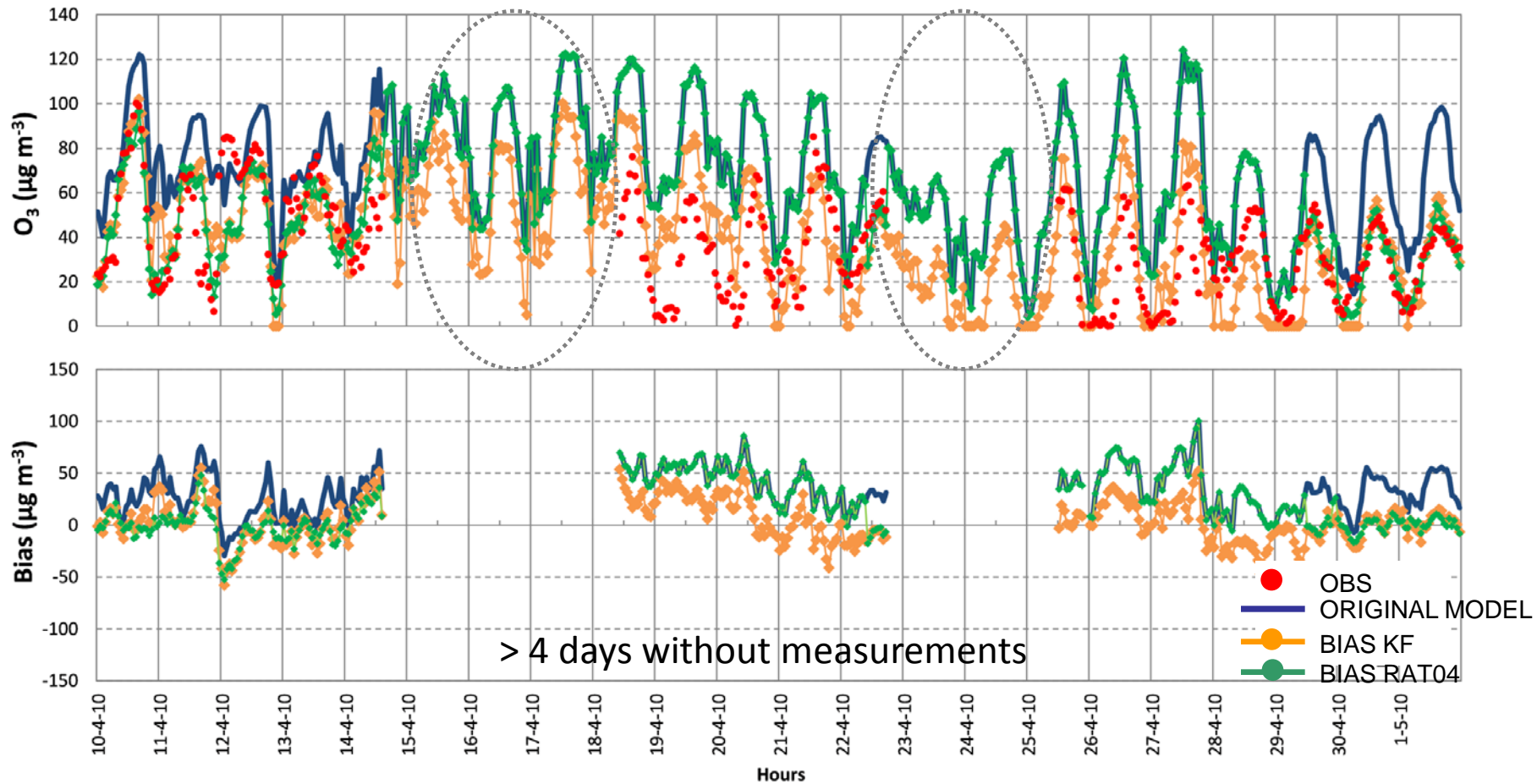


When model predict an episode consistently, KF trust in model more than in observations...which do not happen with RAT04



# The “no data” problem

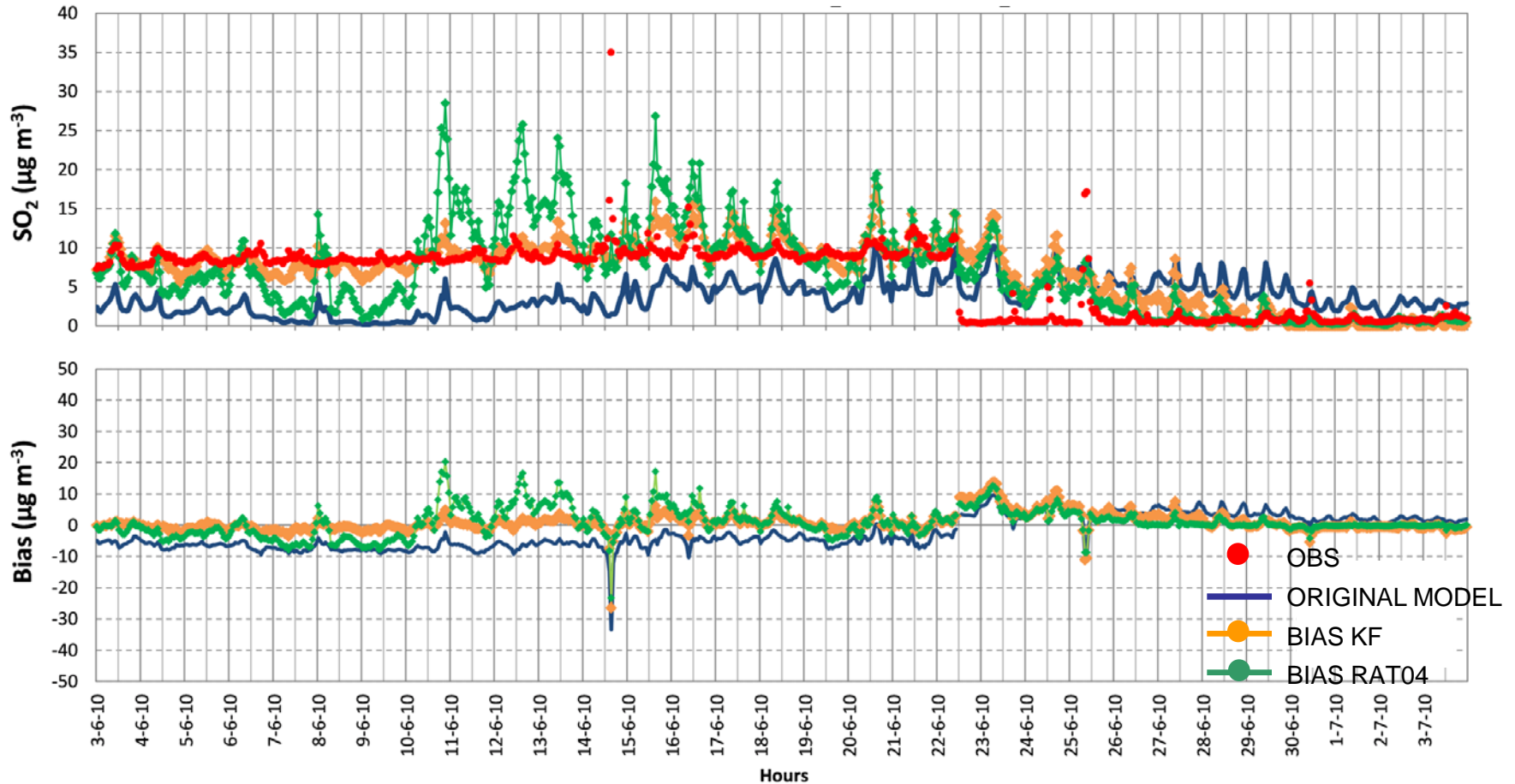
ozone - CAL - BS



Both techniques don't have values to be guided.  
Values will not be corrected until new data appears.

# The “no validated data” problem

SO<sub>2</sub> - MVE - BR

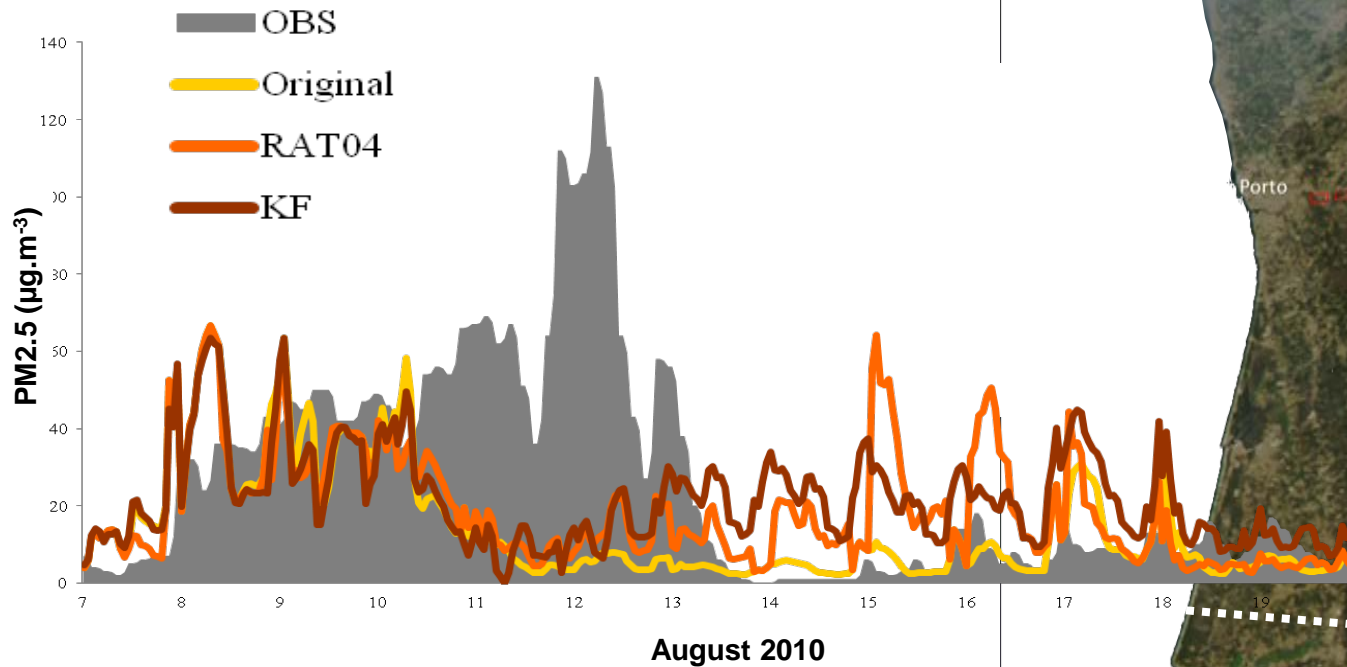


error on monitoring data (ex. calibration problems) can originate  
wrong bias-correction...

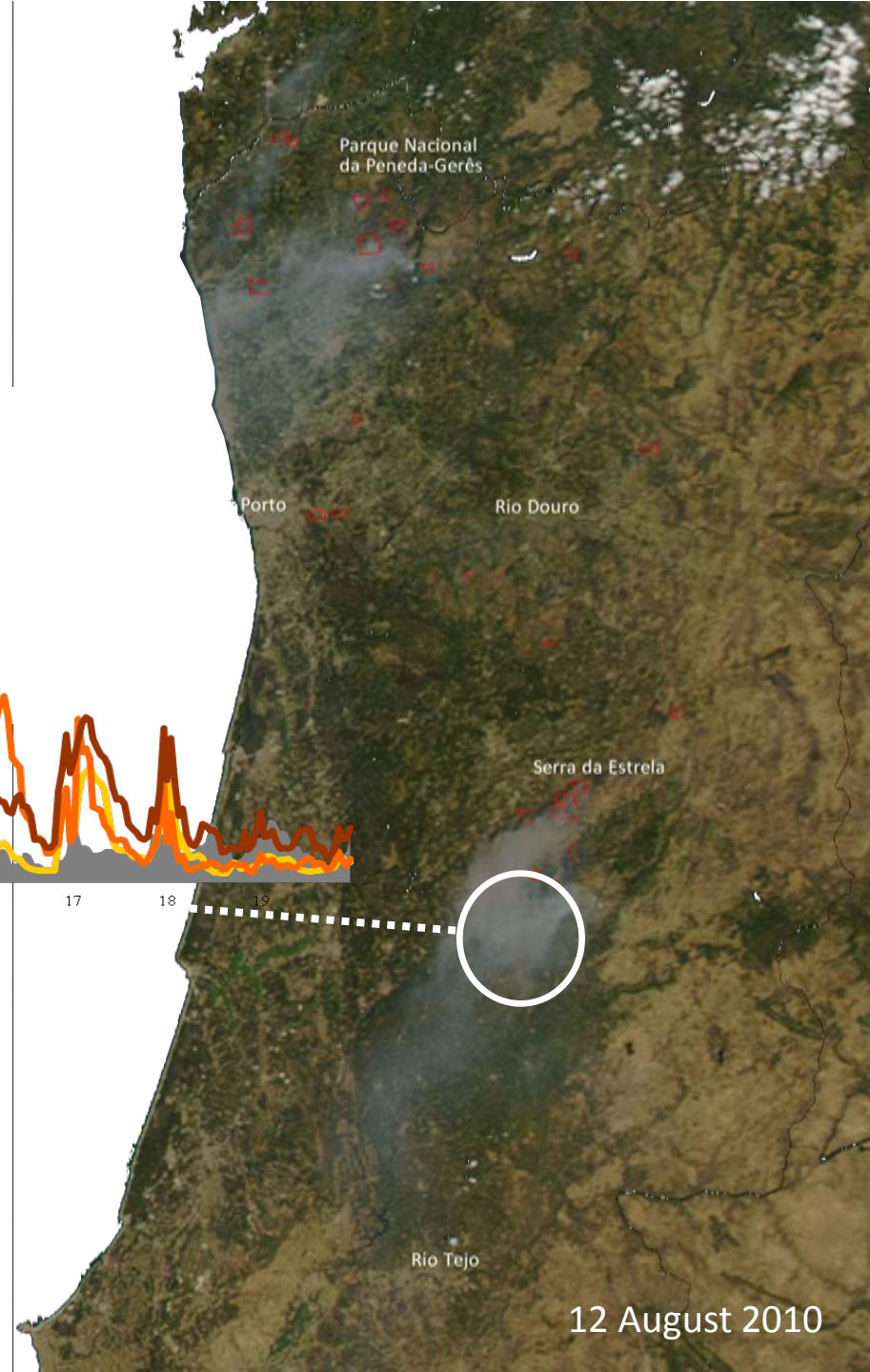
Were this bias-correction techniques able to improve the forecasting of all pollution episodes?



# Forest fire episodes



Both techniques after the episode, **worsted the forecast**, because correction is based on previous 4 days

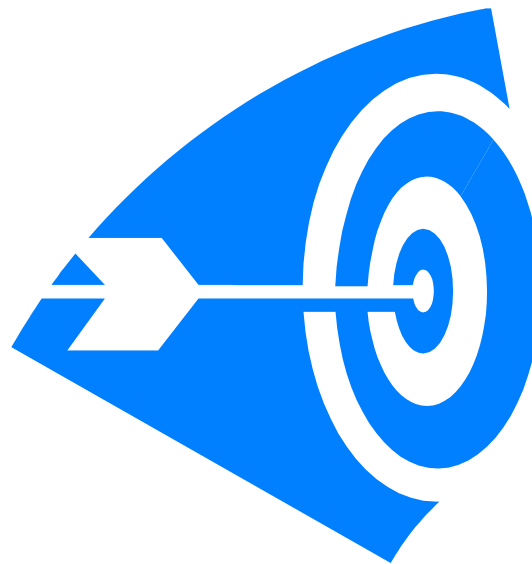


# Comments

- **Several sources of problems:**
  - no validated data;
  - lack of measurements;
  - measurement out of range, etc.
- **KF follows the model:** false modeled high peaks
- **RAT04 propagates error:** no modeled high peaks
- KF is more robust than RAT04 when there is no data: bias is corrected faster in KF.
- Solutions can be found for each problem identified:
  - “No data”: use short periods (< 4days) for bias-correction
  - “calibration problem”: introduce criteria to identify this data problem...



**Thank you for your attention!**



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