

*21st International Conference on  
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***SOURCE APPORTIONMENT ANALYSIS IN PM AND  
O<sub>3</sub> CONCENTRATIONS DURING COVID-19  
LOCKDOWN PERIOD IN MADRID (SPAIN)***

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<http://artico.lma.fi.upm.es>



# CASE STUDY

## ➤ DOMAINS:

D1 : Iberian Peninsula (IP) (25 km)

D2 : Madrid Community ( 5 km)

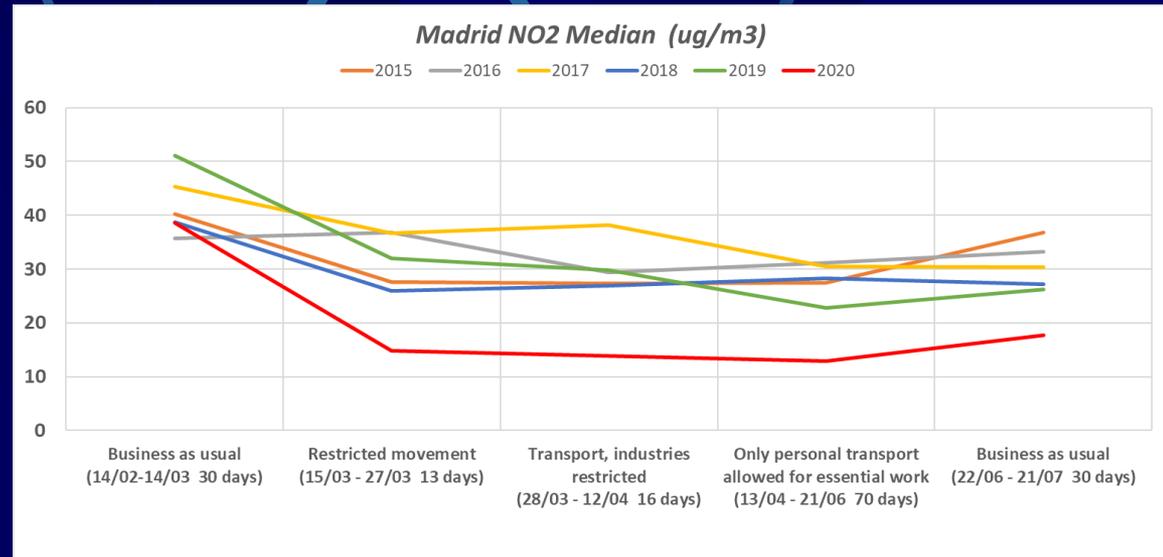
D3 : Madrid City (1 km) (Phase 2)

3D : 35 vertical levels

## ➤ SIMULATIONS (2020 meteorology) :

**BAU:** Business-As-Usual  
(No lockdown)

**COVID:** Emission reduction:  
(CAMS-COPERNICUS  
COVID-19 lockdown scaling **factors\***)



\*Time-resolved emission reductions for atmospheric chemistry modelling in Europe during the COVID-19 lockdowns  
Guevara et al. Atmos. Chem. Phys., 21, 773–797, 2021 <https://doi.org/10.5194/acp-21-773-2021>

NO2 observations analysis (Madrid)  
(red line effects of the COVID-19 lockdown)



# CASE STUDY

## ➤ PERIODS:

- **01/02/2020 – 07/03/2020** (Pre-lockdown) (36 days)
- **08/03/2020 – 12/04/2020** (Lockdown) (36 days)

- On March, 8, 2020, the first emission reductions were observed by the initial restrictions
- On March, 15, 2020, the national lockdown was effective.
- On March, 28, 2020, the Spanish government banned all non-essential activity.
- On April, 13, 2020, workers in some non-essential sectors, such as construction and industry, who could not work remotely were allowed to return to work.



# CASE STUDY

## MODELS:

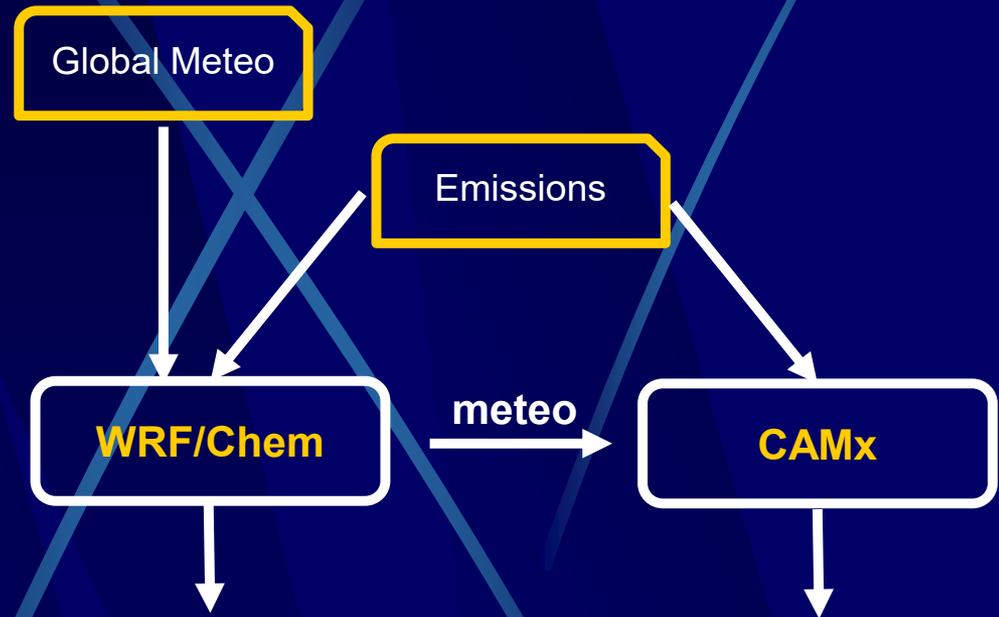
- **WRF/Chem** CBMZ-MOSAIC
- **WRF-CAMx** CB06-CF

## INITIAL & BOUNDARY CONDITIONS:

- **Meteorology:** NCEP GDAS Final Analysis 0.25 (ds083.3) 6-hourly
- **Air quality:** WACCM Forecast 0.9x0.125 (ds313.6) 6-hourly

## EMISSIONS:

- **Anthropogenic:** CAMS-REG-AP (v4.2\_ry 2019) 0.05x0.1 (COPERNICUS)
- **EMIMO model (UPM)**
- **Biogenic MEGAN**



- **Hourly simulated concentrations** are compared with **observational hourly data** from the Madrid municipality and regional air quality observation networks (**48 monitoring station**).
- Representative and unique value calculated using the **average values of the 48 monitoring stations** and the corresponding **model value**.



# WRF/Chem CONFIGURATION

- **GAS-AEROSOL MECHANISMS: CBMZ-MOSAIC**
- **AEROSOL : Yes**
- **DRY DEPOSITION: Binkowski And Shankar**
- **WET DEPOSITION: Easter And Chapman**
- **PHOTOLYSIS: Fast-J**
- **MICROPHYSICS: Lin**
- **LW/SW RADIATION: Rapid Radiative Transfer Method for Global (RRTMG)**
- **PBL: Yonsei University (YSU)**
- **SURFACE LAYER: Monin-Obukhov**
- **LAND SURFACE: Noah**
- **CUMULUS: Grell-3D (G3)**

**INTERNATIONAL AIR QUALITY ASSESSMENT EXPERIMENT  
MODEL ASSESSMENT INITIATIVE (AQMEII- USA-EUROPE JOINT SIMULATION  
EXPERIMENT)**



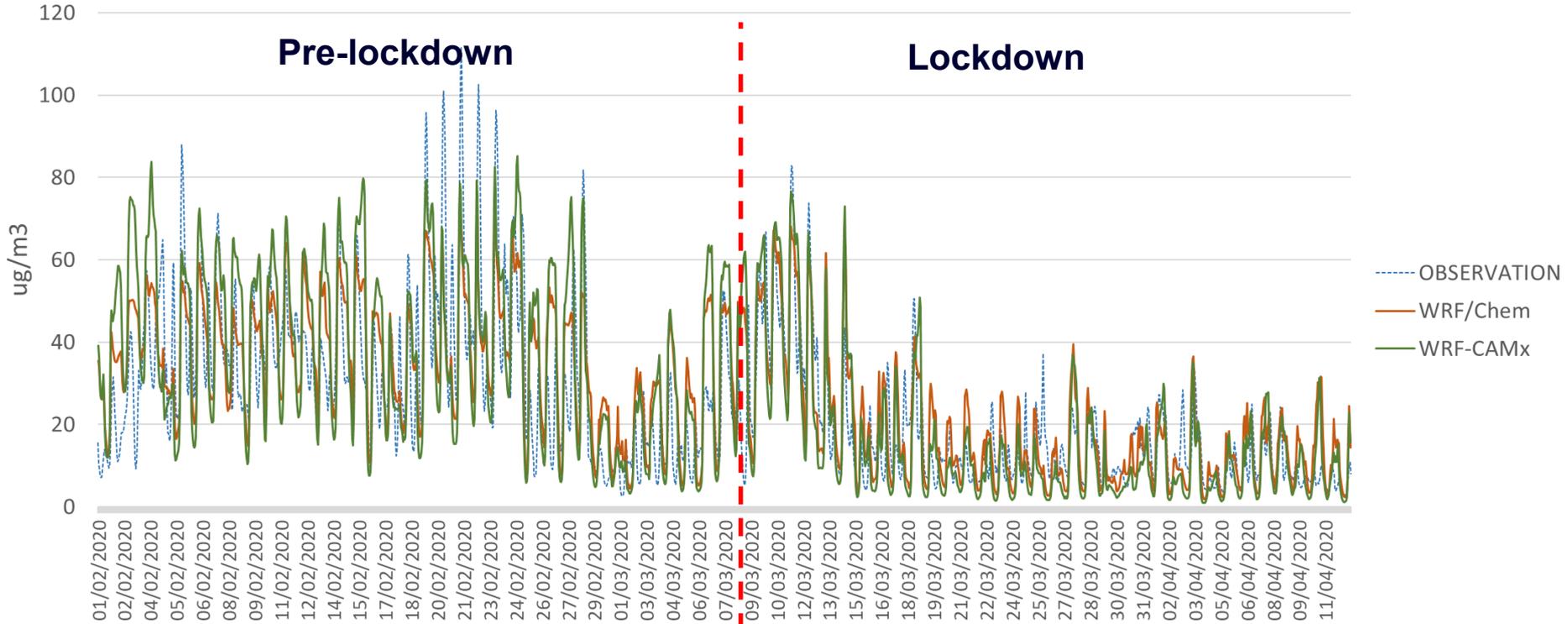
# WRF-CAMx OSAT-PSAT CONFIGURATION

- Advection solver: Piecewise Parabolic Method (PPM)
- Chemistry solver: Euler-Backward Iterative (EBI)
- Dry Deposition: ZHANG03
- Chemical mechanism: CB6r4 photochemistry
- Aerosol mechanism: Two mode (Coarse and Fine - CF) scheme.
- Inorganic PM chemical: ISORROPIA (Inorganic gas-aerosol partitioning)
- Organic PM chemical: SOAP2.2 (Secondary organic aerosol)
- **Ozone and Particulate Source Apportionment Technology (OSAT and PSAT)**



# WRF/Chem & WRF-CAMx Performance: NO2

NO2 AVG OBSERVATION vs WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



## WRF/Chem

NMB: 18%  
RSME: 14 ug/m3  
R<sup>2</sup>: 0.67

## WRF-CAMx

NMB: 15%  
RSME: 19 ug/m3  
R<sup>2</sup>: 0.57

## WRF/Chem

NMB: 9%  
RSME: 9 ug/m3  
R<sup>2</sup>: 0.72

## WRF-CAMx

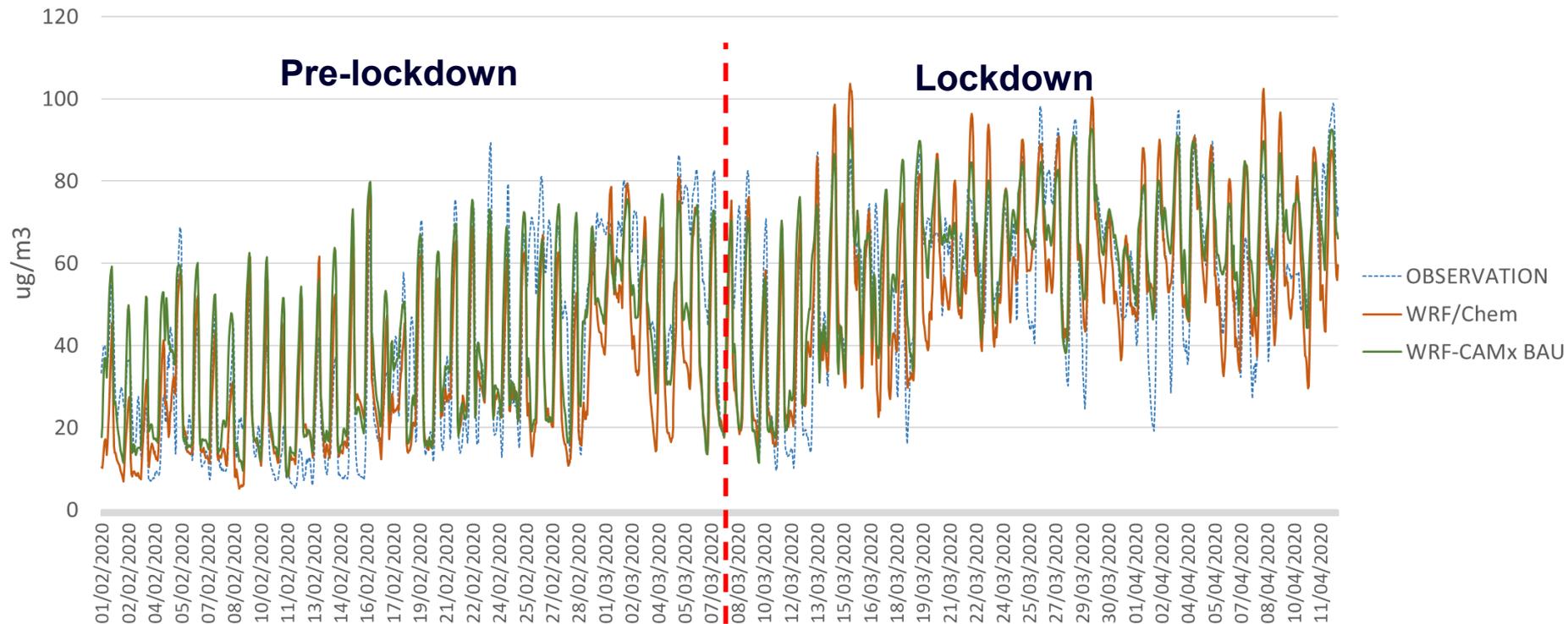
NMB: -5%  
RSME: 10 ug/m3  
R<sup>2</sup>: 0.76

AVG: Average of the 48 monitoring station values and WRF/Chem & WRF-CAMx values where the stations are located.



# WRF/Chem & WRF-CAMx Performance: O3

O3 AVG OBSERVATION vs WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



## WRF/Chem

NMB: -14%  
RSME: 15  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.75

## WRF-CAMx

NMB: 3 %  
RSME: 15  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.74

## WRF/Chem

NMB: -2 %  
RSME: 13  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.78

## WRF-CAMx

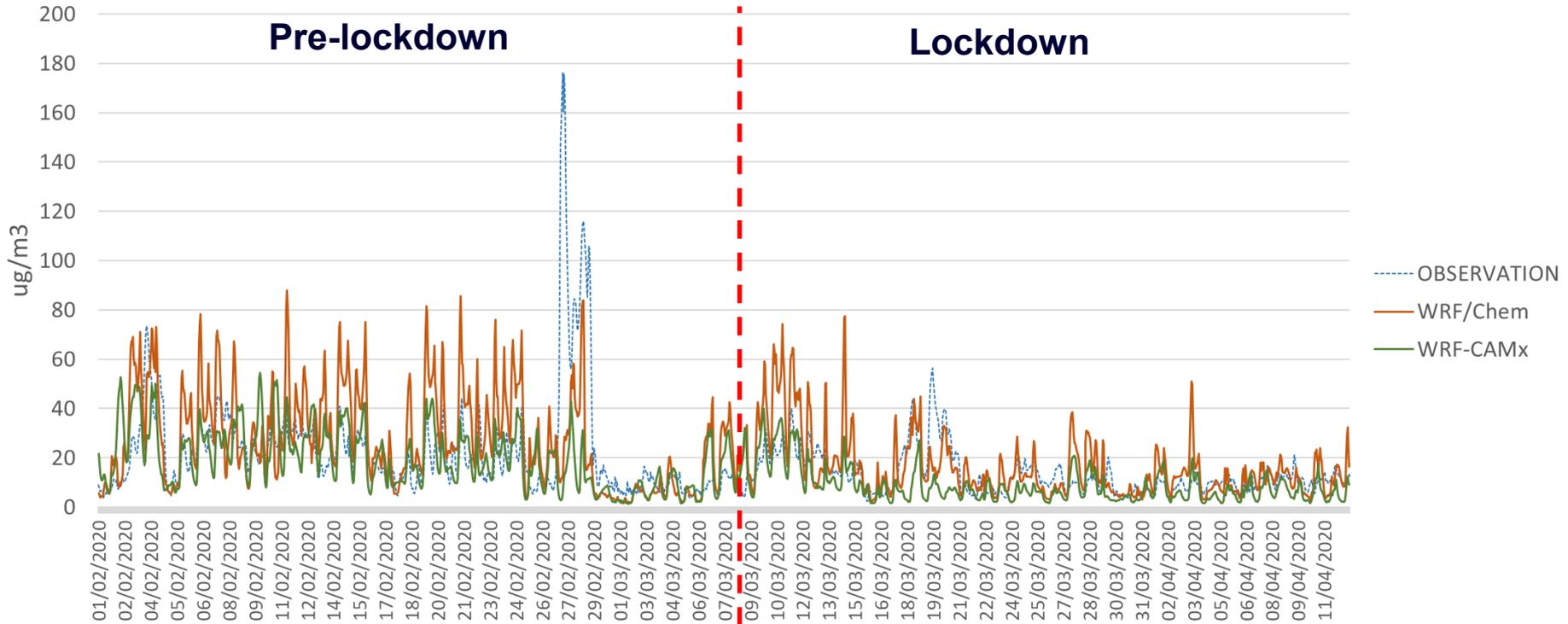
NMB: 7 %  
RSME: 13  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.76

AVG: Average of the 48 monitoring station values and WRF/Chem & WRF-CAMx values where the stations are located.



# WRF/Chem & WRF-CAMx Performance: PM10

PM10 AVG OBSERVATION vs WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



## WRF/Chem

NMB: 18 %  
RSME: 14  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.67

## WRF-CAMx

NMB: -18 %  
RSME: 20  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.46

## WRF/Chem

NMB: 9 %  
RSME: 9  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.78

## WRF-CAMx

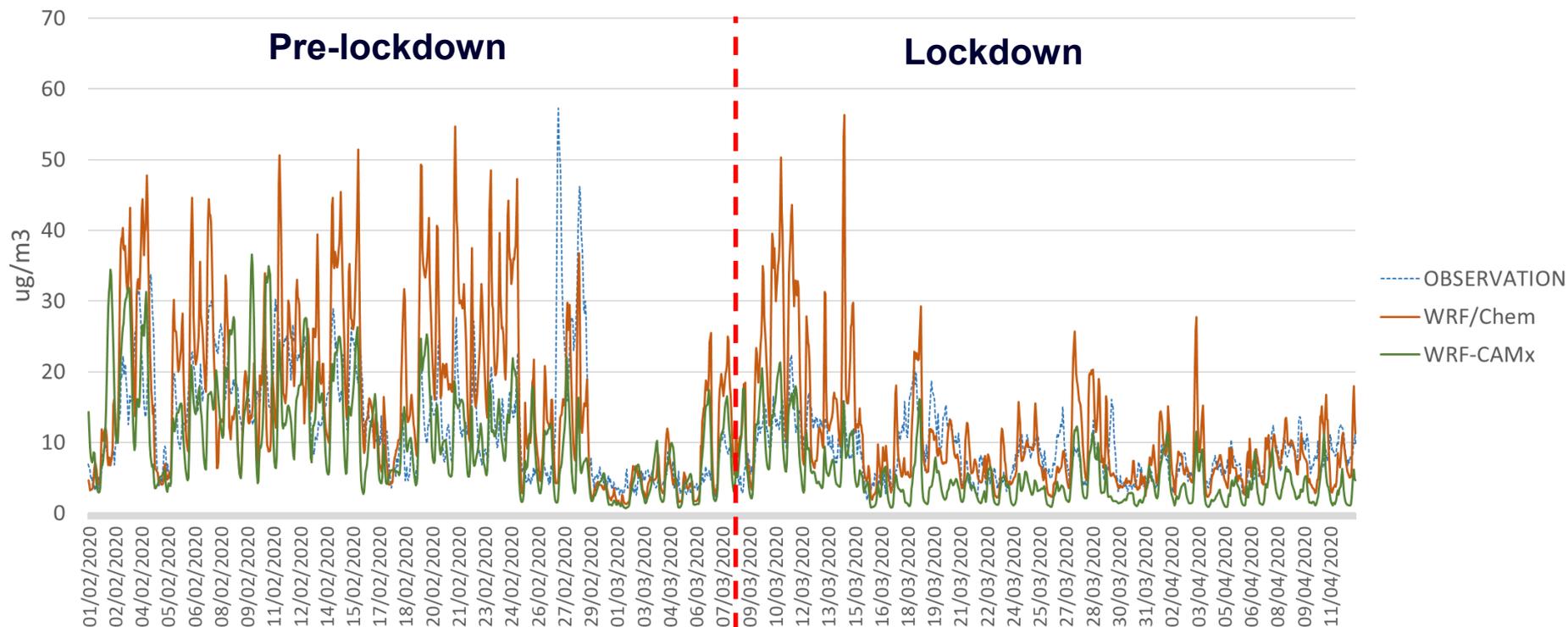
NMB: -11 %  
RSME: 9  $\mu\text{g}/\text{m}^3$   
 $R^2$ : 0.67

AVG: Average of the 48 monitoring station values and WRF/Chem & WRF-CAMx values where the stations are located.



# WRF/Chem & WRF-CAMx Performance: PM25

PM2.5 AVG OBSERVATION vs WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



## WRF/Chem

NMB: 27%  
RSME: 11 ug/m3  
R<sup>2</sup>: 0.53

## WRF-CAMx

NMB: -16%  
RSME: 9 ug/m3  
R<sup>2</sup>: 0.48

## WRF/Chem

NMB: 24%  
RSME: 6 ug/m3  
R<sup>2</sup>: 0.57

## WRF-CAMx

NMB: -14 %  
RSME: 5 ug/m3  
R<sup>2</sup>: 0.55

AVG: Average of the 48 monitoring station values and WRF/Chem & WRF-CAMx values where the stations are located.



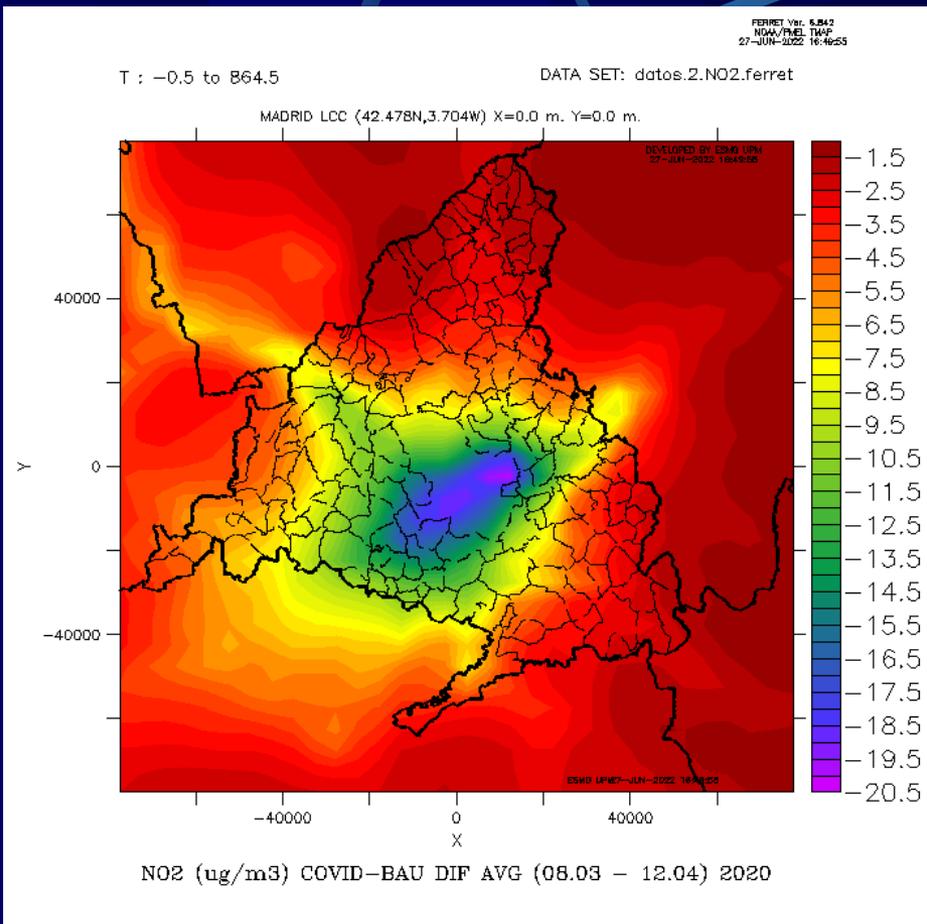
# WRF/Chem & WRF-CAMx Performance: SUMMARY

	Model	NMB (%)		RMSE ( $\mu\text{g}/\text{m}^3$ )		R <sup>2</sup> [0,1]	
		Pre-lockdown	Lock-down	Pre-lockdown	Lock-down	Pre-lockdown	Lock-down
NO <sub>2</sub>	WRF/Chem	18	9	14	9	0.67	0.72
	WRF-CAMx	15	-5	19	10	0.57	0.76
O <sub>3</sub>	WRF/Chem	-14	-2	15	13	0.75	0.78
	WRF-CAMx	3	7	15	13	0.74	0.76
PM10	WRF/Chem	18	-18	14	20	0.67	0.46
	WRF-CAMx	-18	-11	20	9	0.46	0.67
PM2.5	WRF/Chem	27	24	11	6	0.53	0.57
	WRF-CAMx	-16	-14	9	5	0.48	0.55

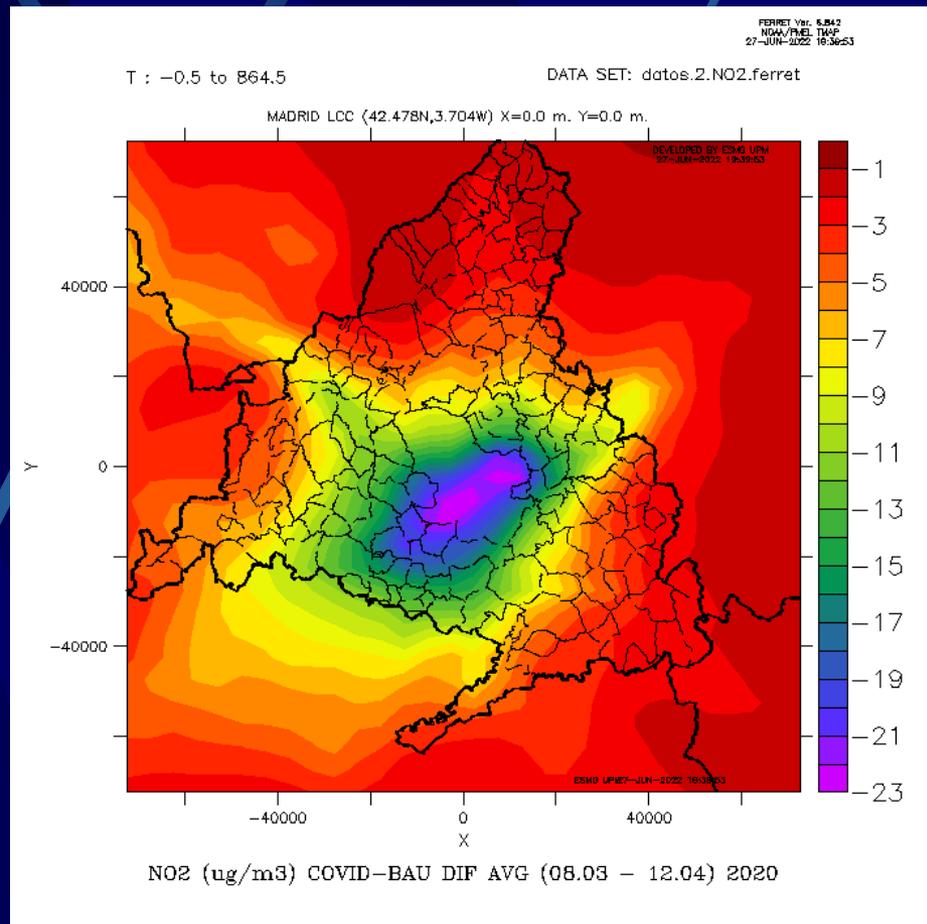
Both RMSE and R<sup>2</sup> quantify how well a regression model fits a dataset. The **RMSE** tells us how well a regression model can predict the value of the response variable in **absolute terms** while **R<sup>2</sup>** tells us how well a model can predict the value of the response variable in **percentage terms**.



# NO2 Madrid COVID-BAU 08/03-12/04 2020



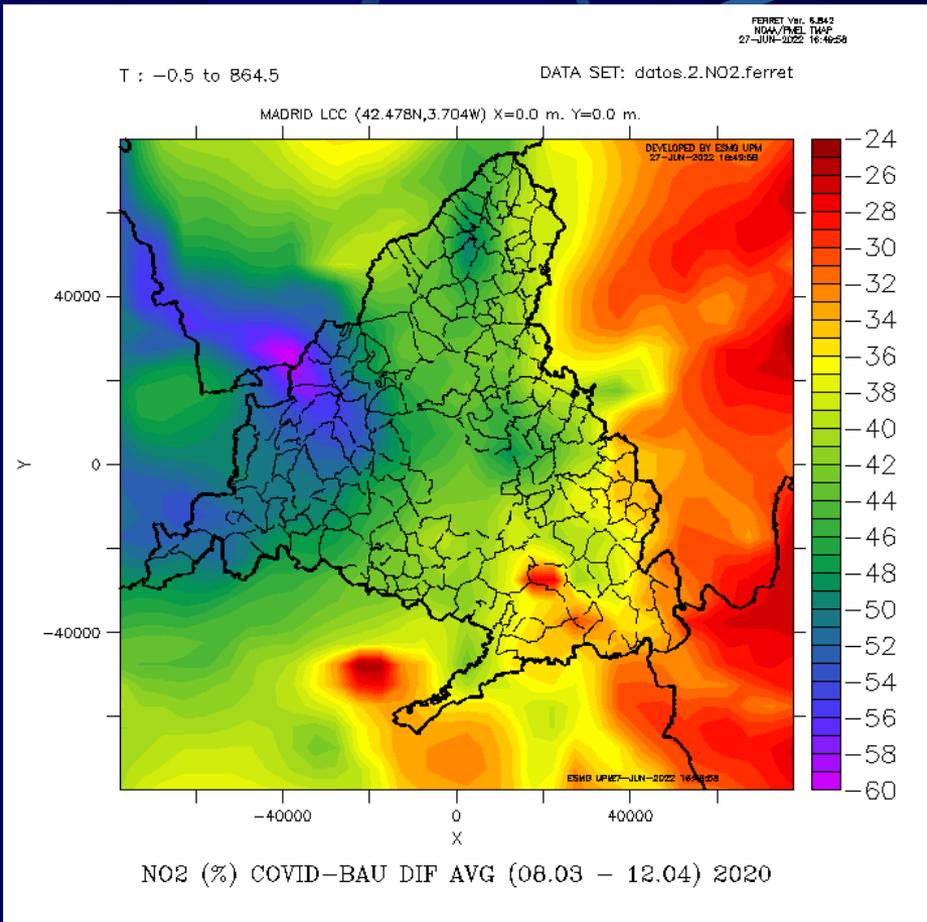
WRF/Chem



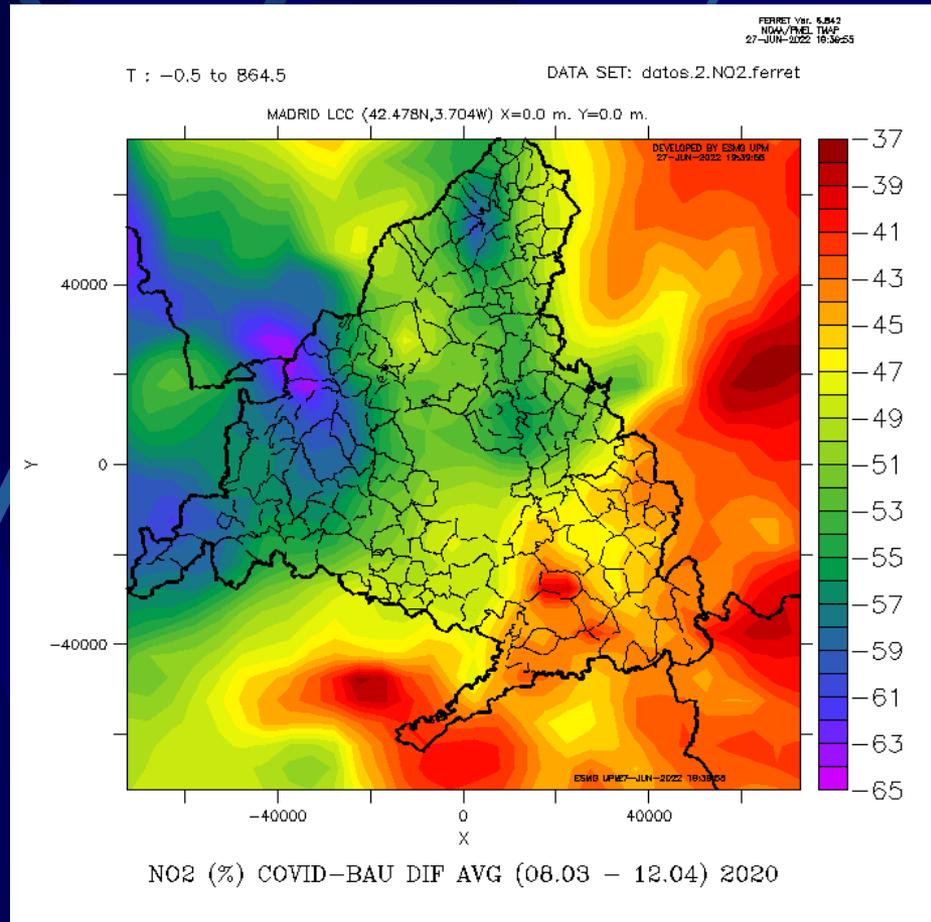
WRF-CAMx



# NO2 Madrid COVID-BAU (%) 08/03-12/04 2020



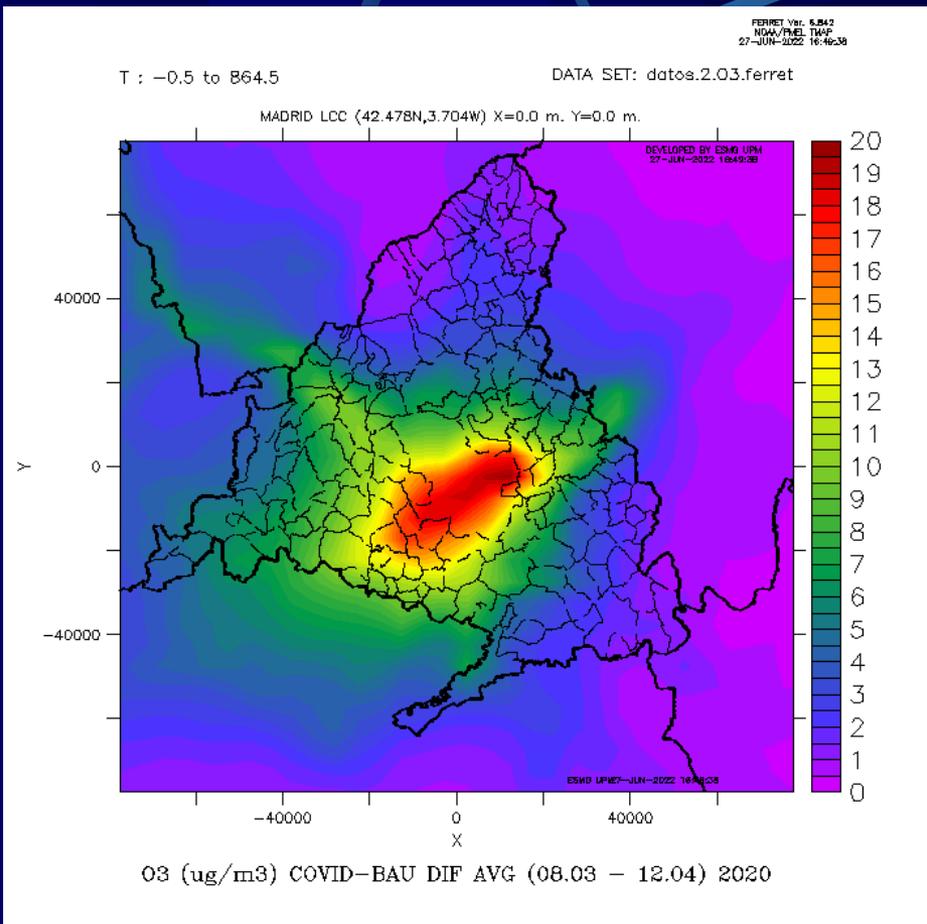
WRF/Chem



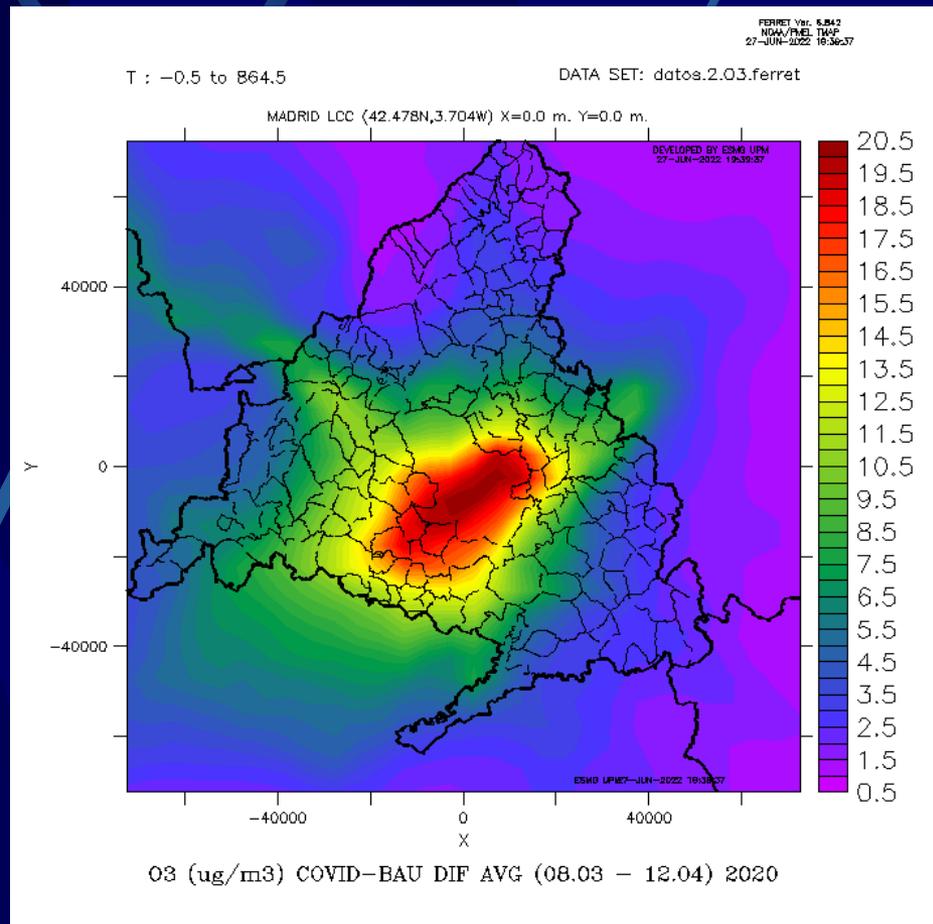
WRF-CAMx



# O3 Madrid COVID-BAU 08/03-12/04 2020



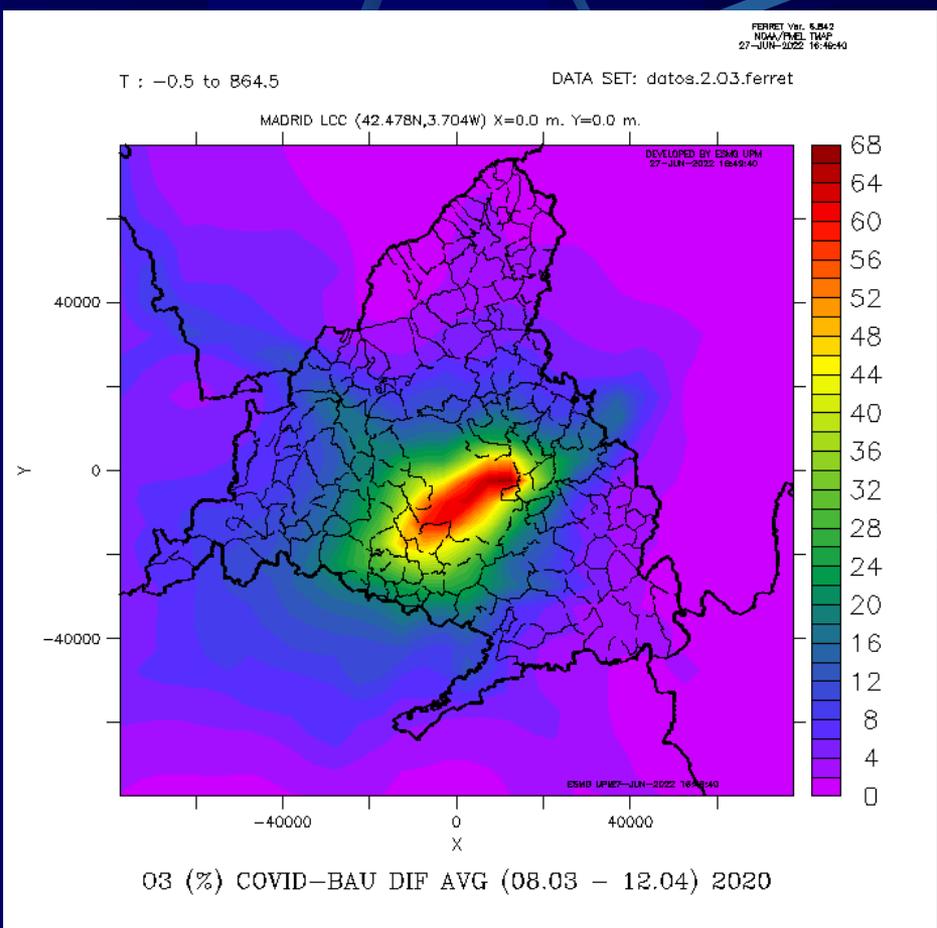
WRF/Chem



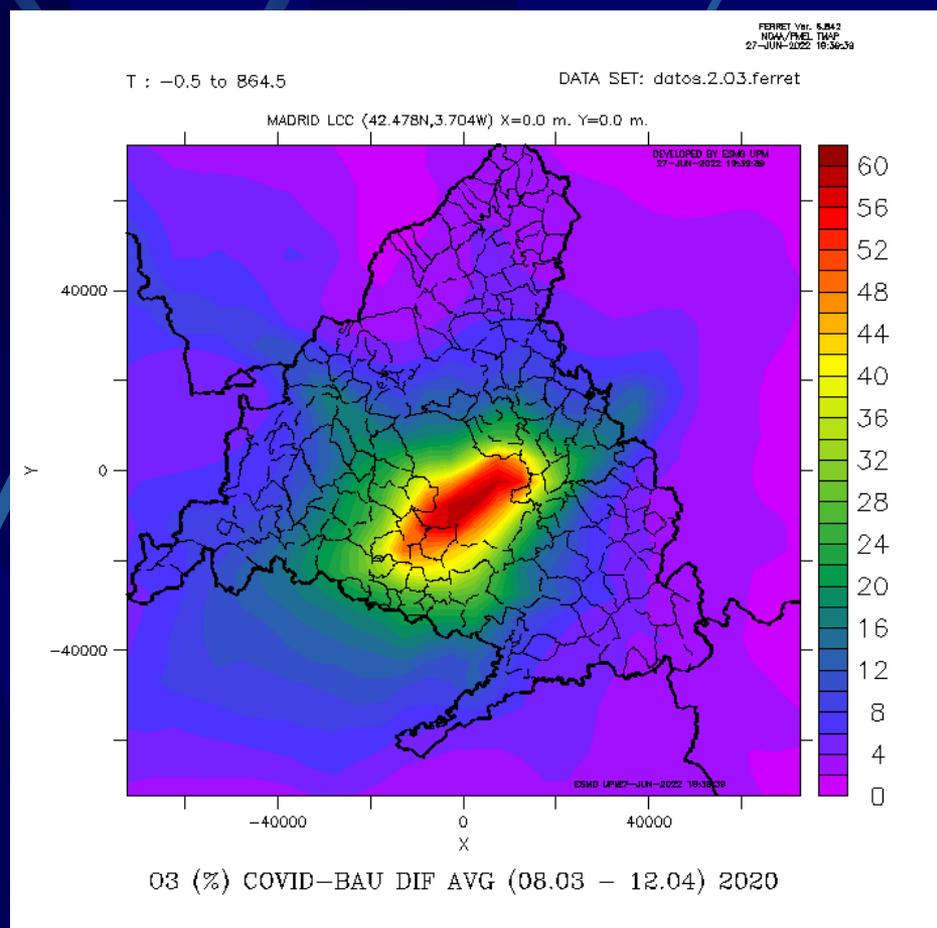
WRF-CAMx



# O3 Madrid COVID-BAU (%) 08/03-12/04 2020



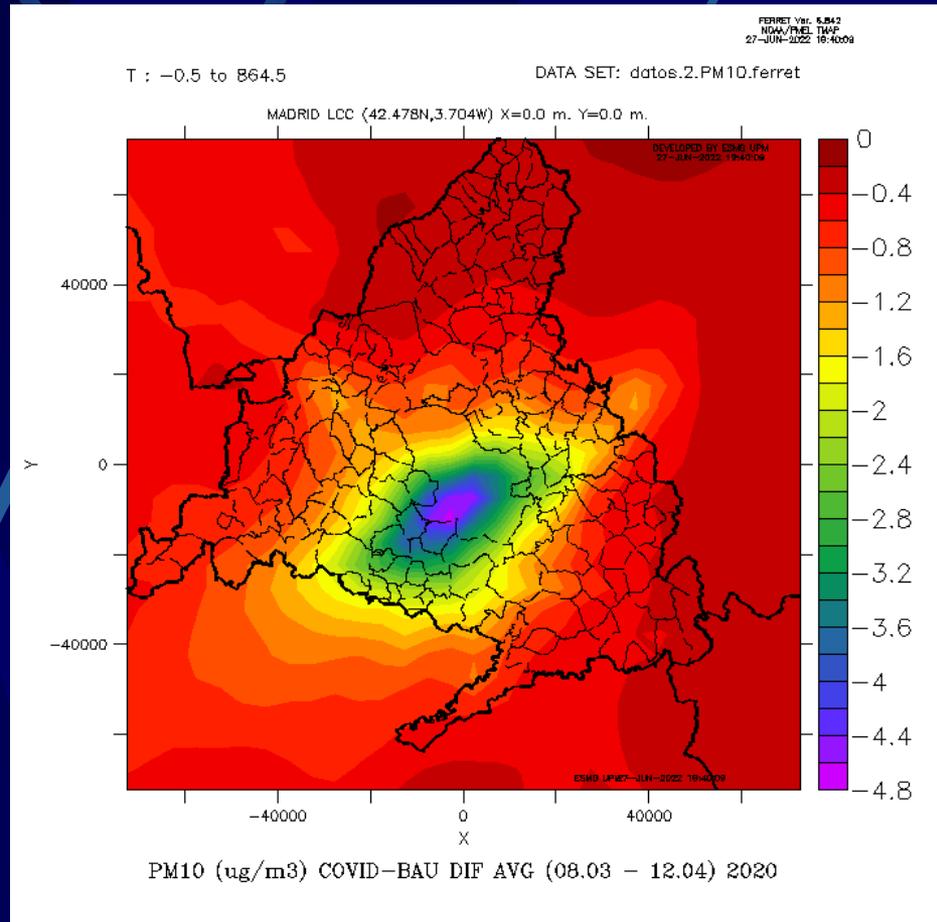
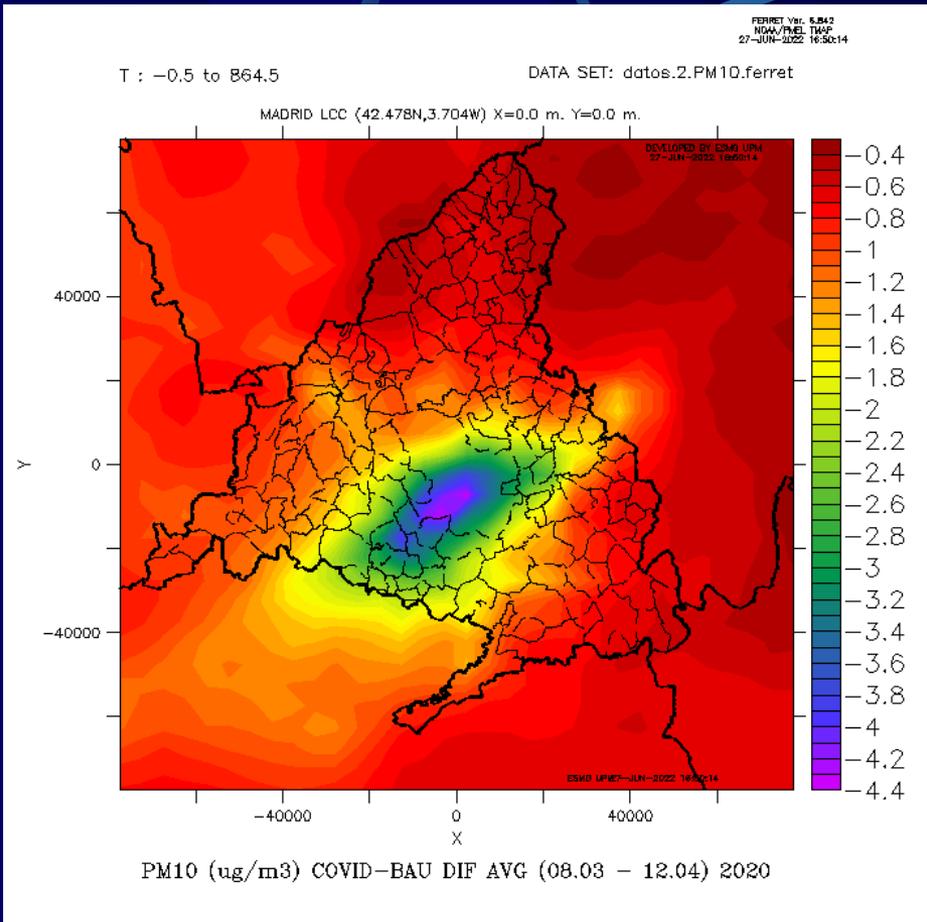
WRF/Chem



WRF-CAMx



# PM10 Madrid COVID-BAU 08/03-12/04 2020

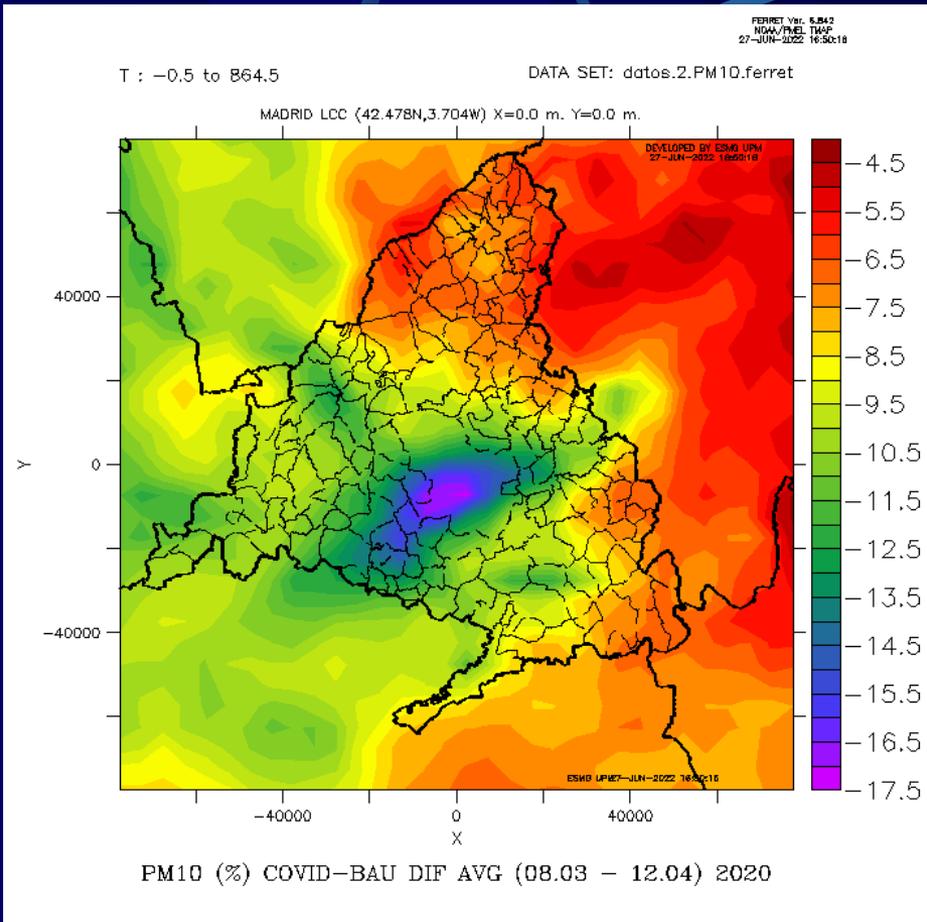


WRF/Chem

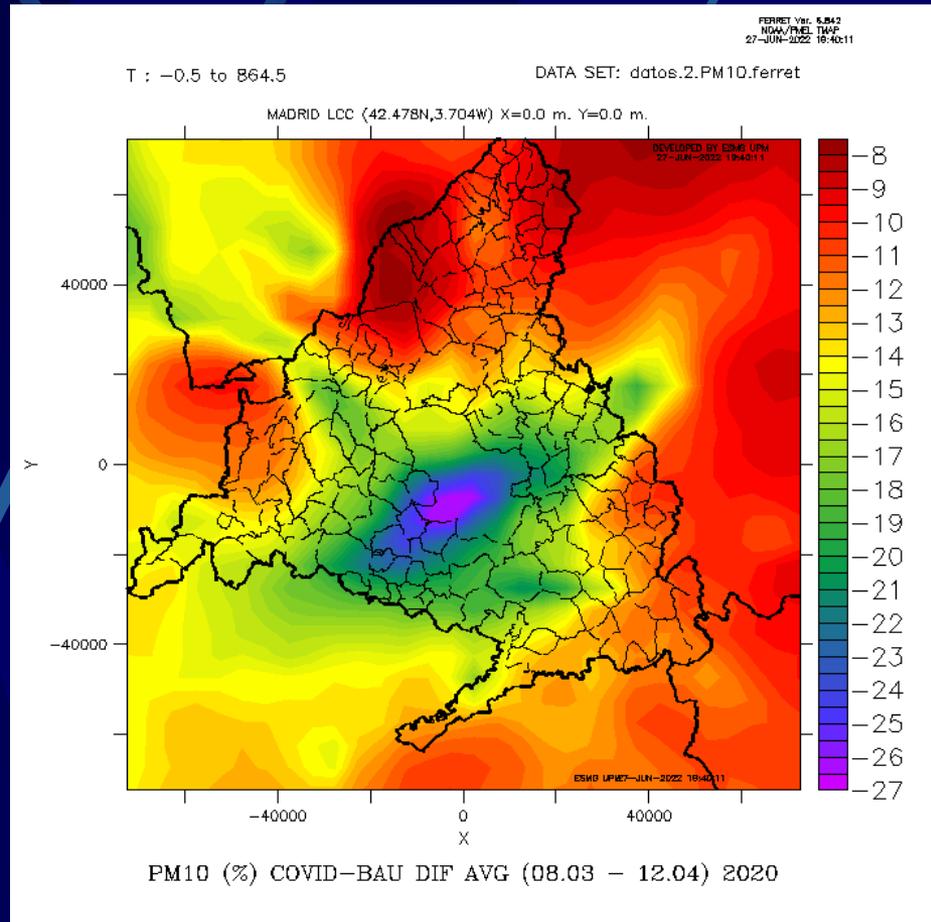
WRF-CAMx



# PM10 Madrid COVID-BAU (%)08/03-12/04 2020



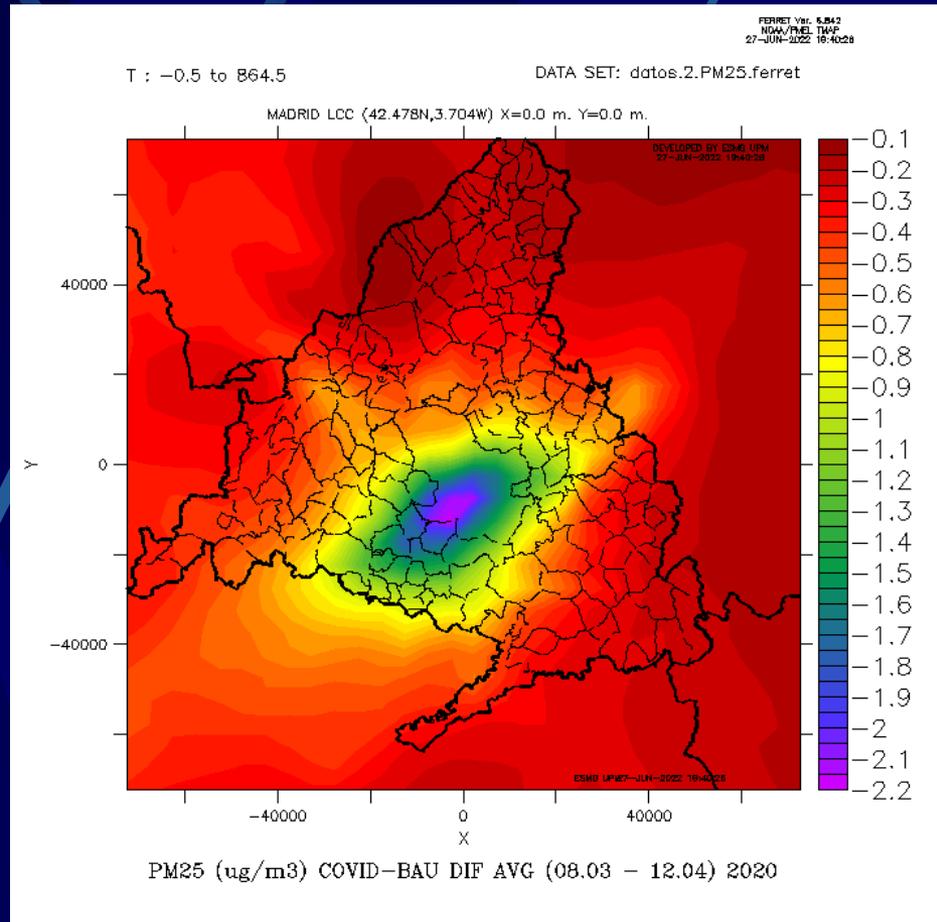
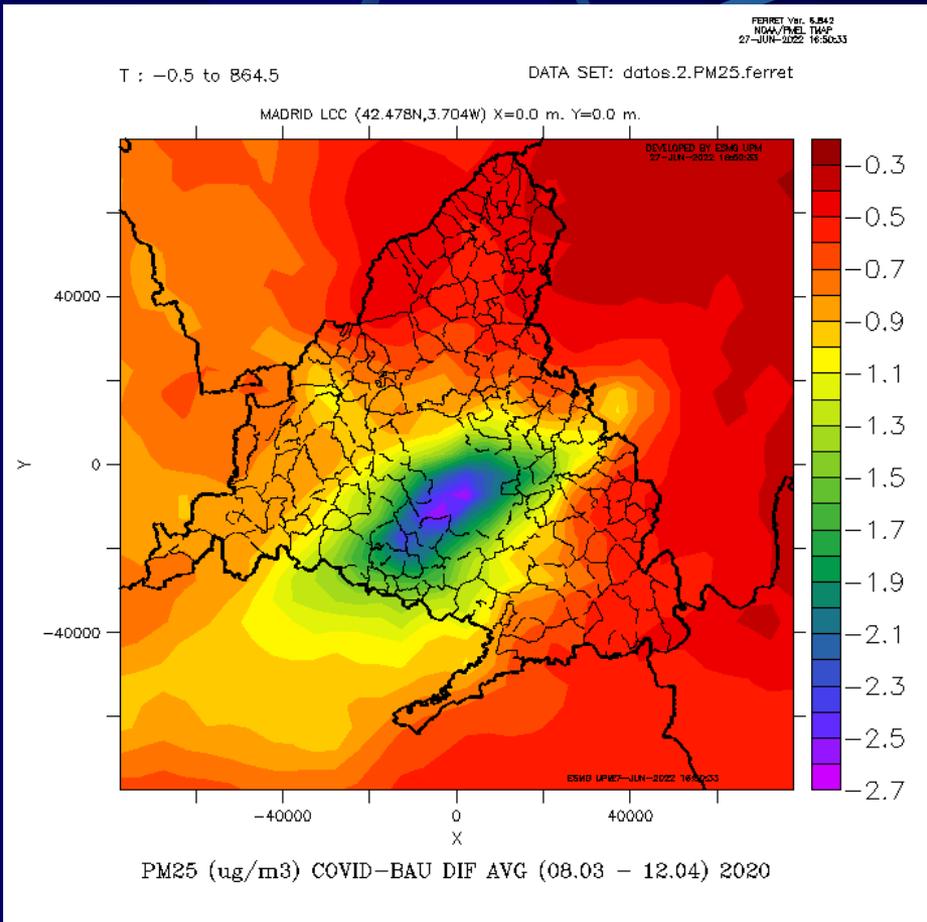
WRF/Chem



WRF-CAMx



# PM25 Madrid COVID-BAU 08/03-12/04 2020

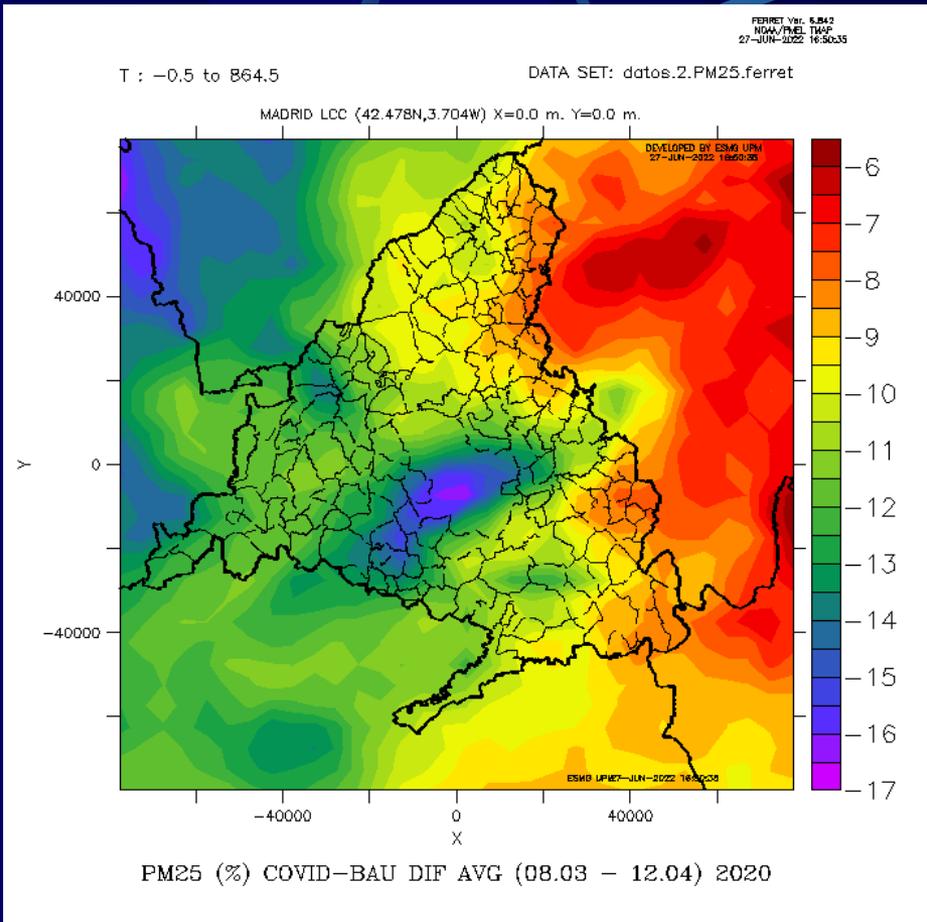


WRF/Chem

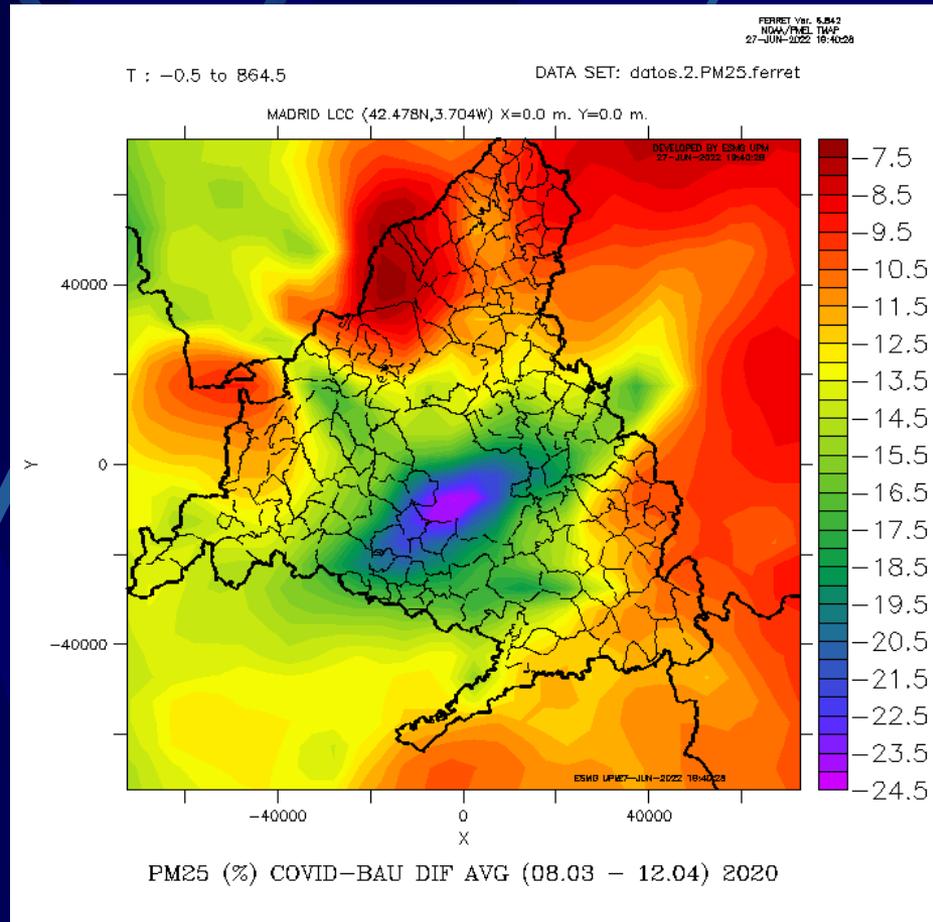
WRF-CAMx



# PM25 Madrid COVID-BAU (%) 08/03-12/04 2020



WRF/Chem

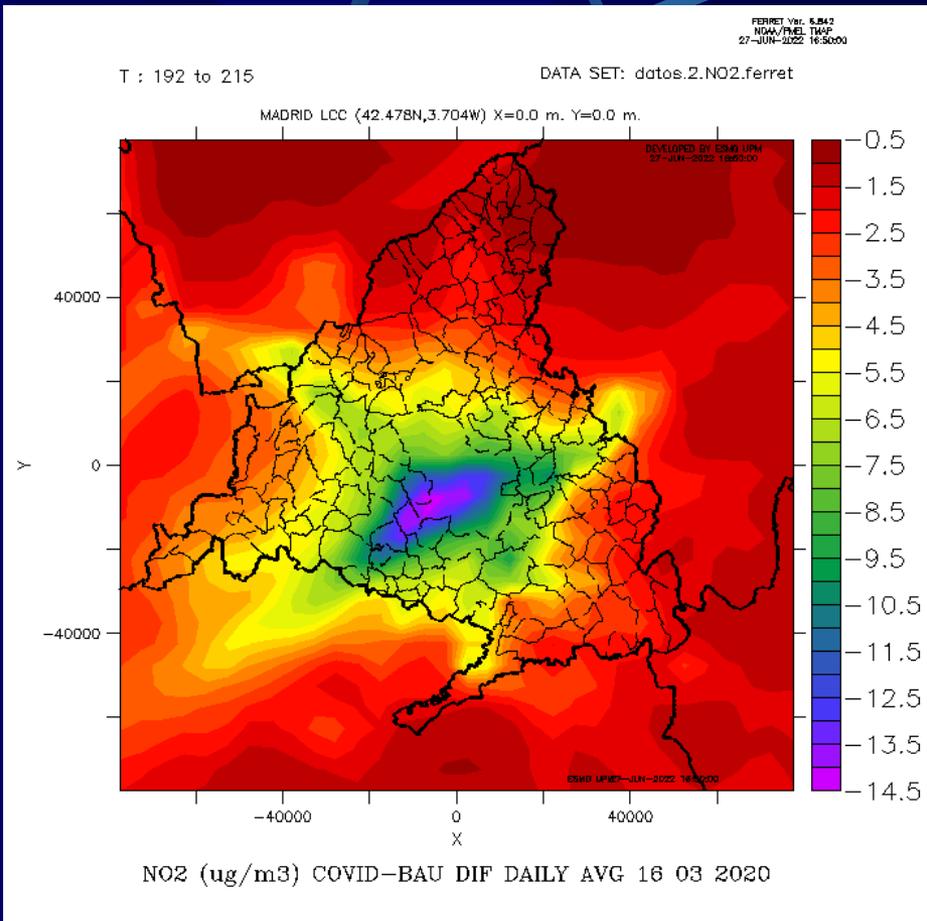


WRF-CAMx

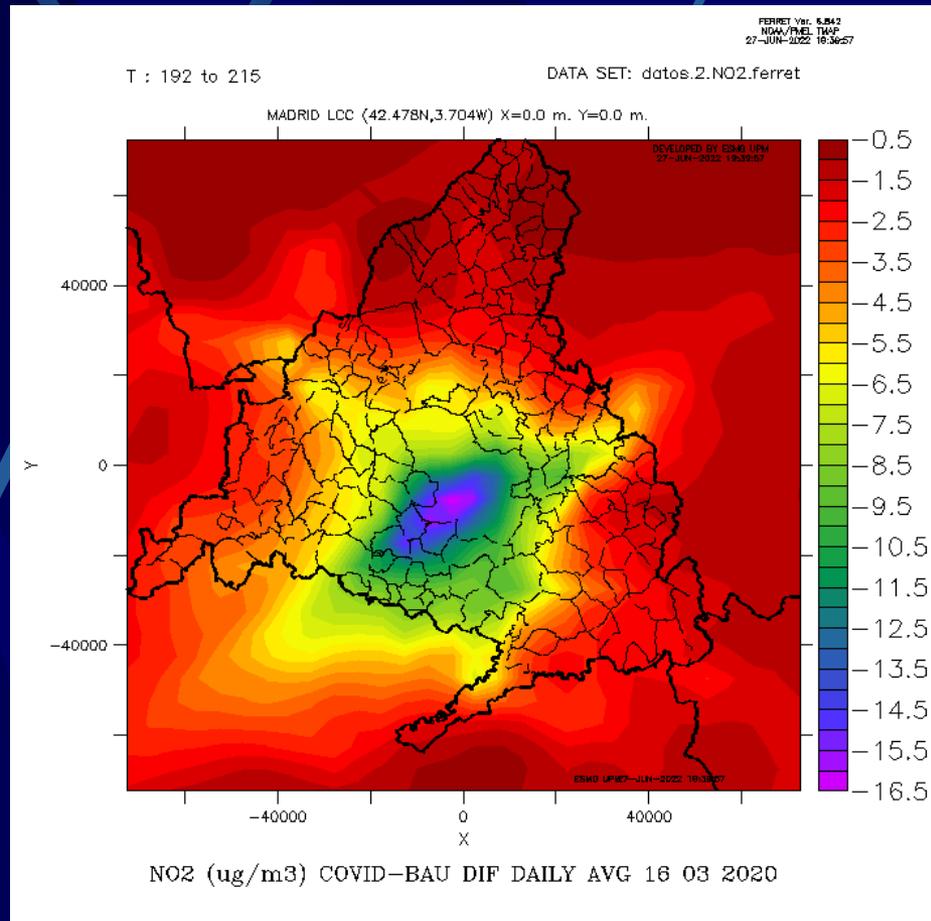


# NO2 Madrid COVID-BAU 16/03/2020

## National Lockdown (Monday)



WRF/Chem

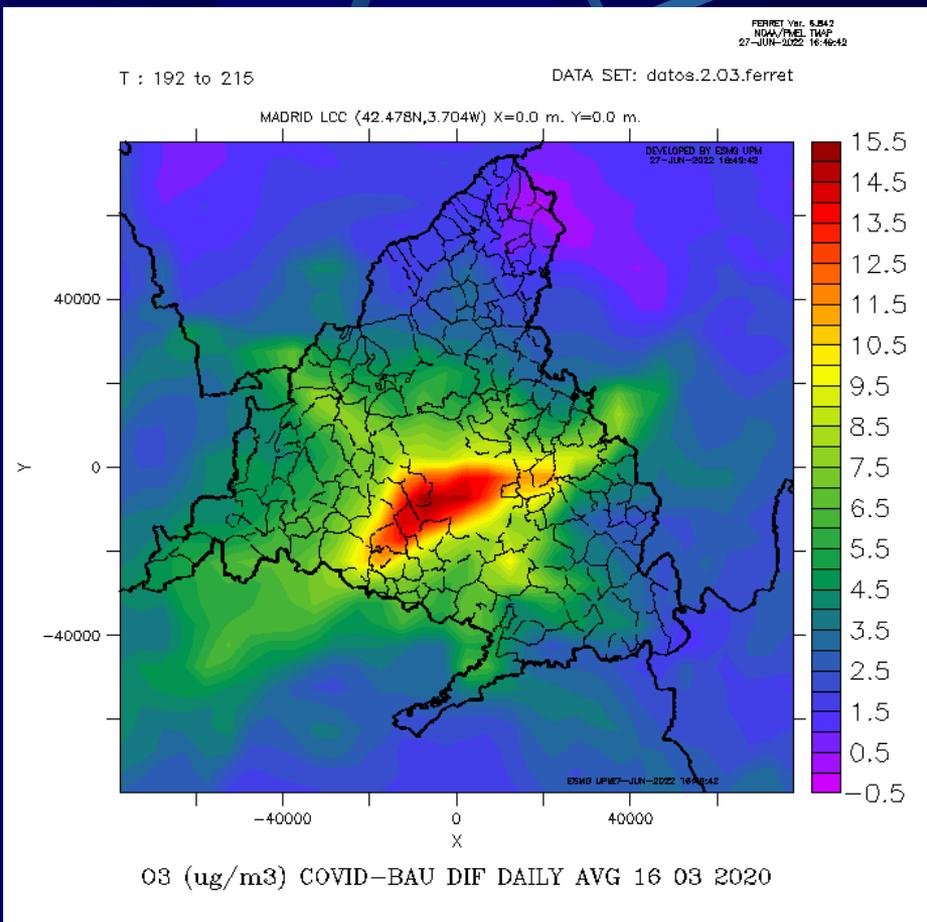


WRF-CAMx

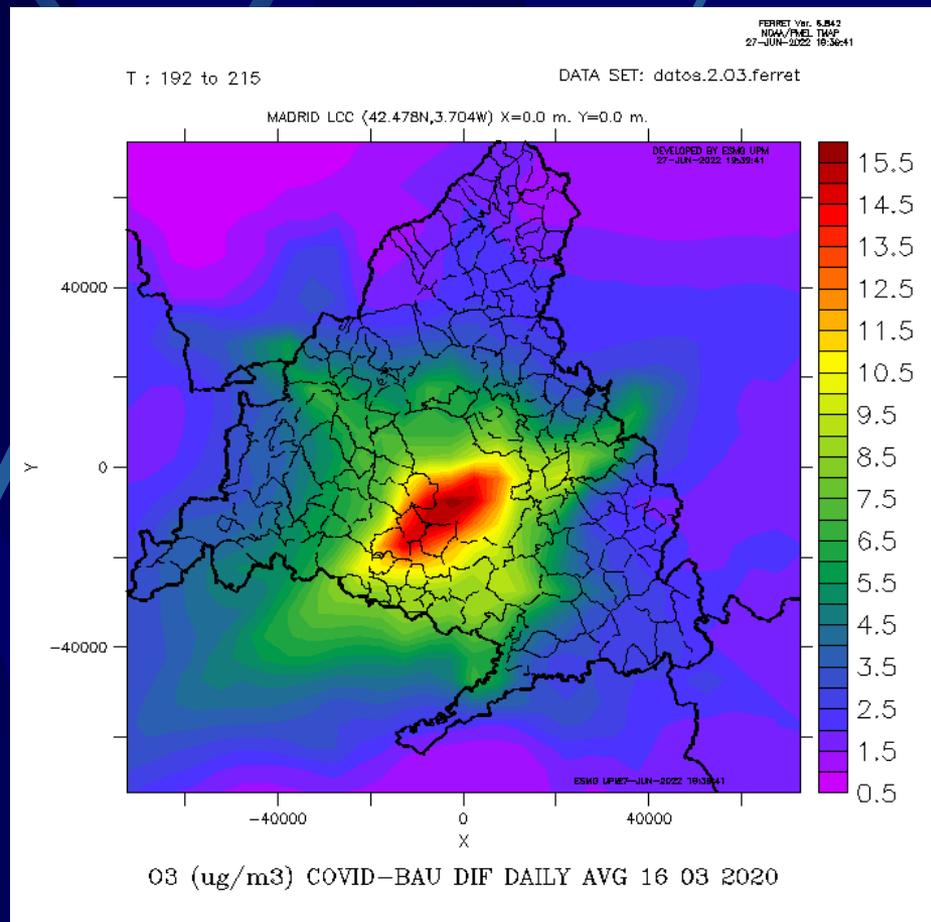


# O3 Madrid COVID-BAU 16/03/2020

## National Lockdown (Monday)



WRF/Chem

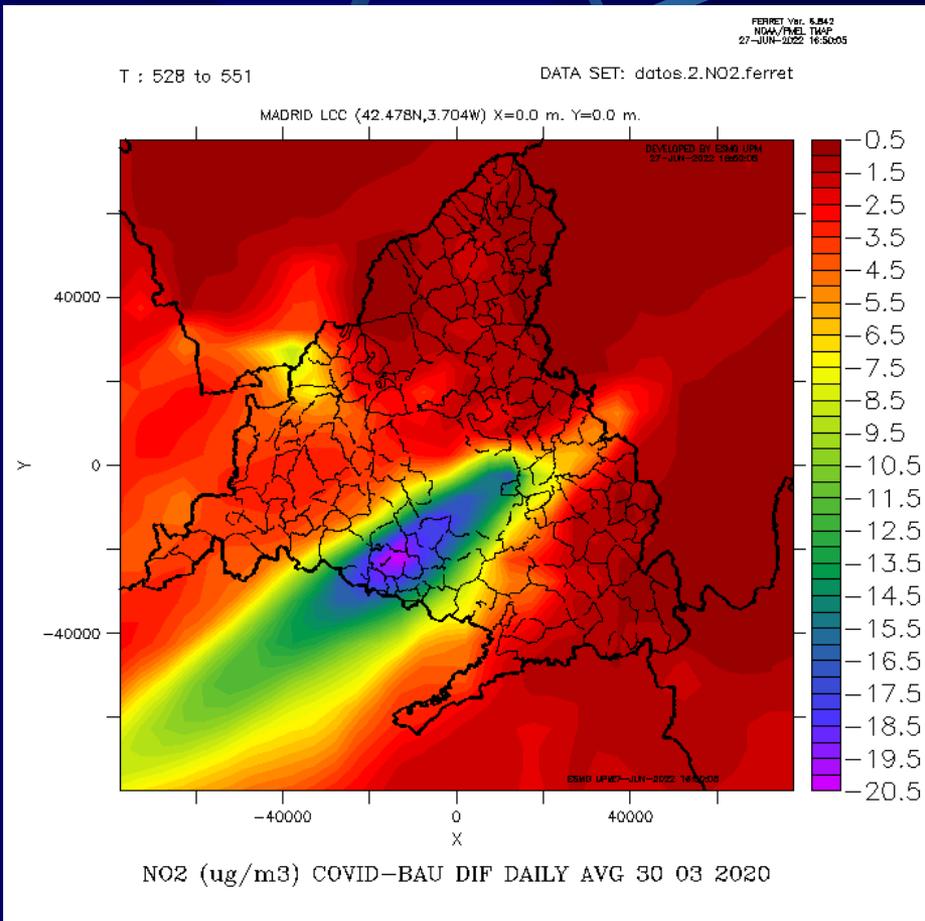


WRF-CAMx

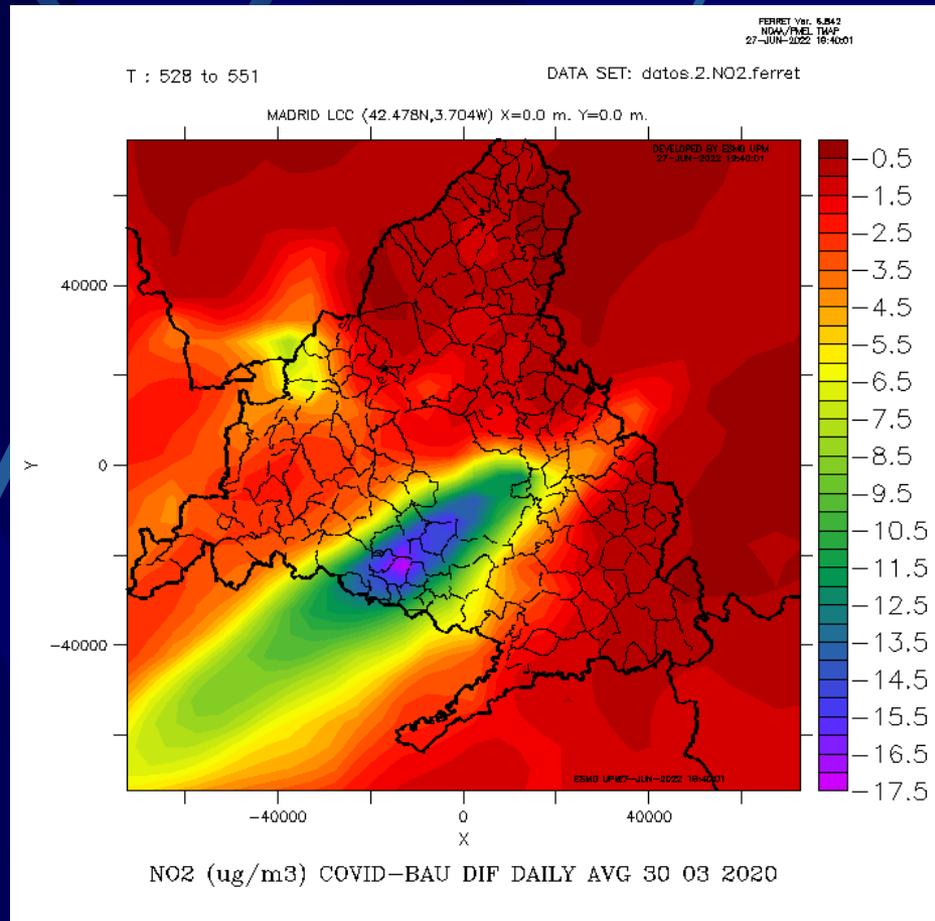


# NO2 Madrid COVID-BAU 30/03/2020

## Banned all non-essential activity (Monday)



WRF/Chem

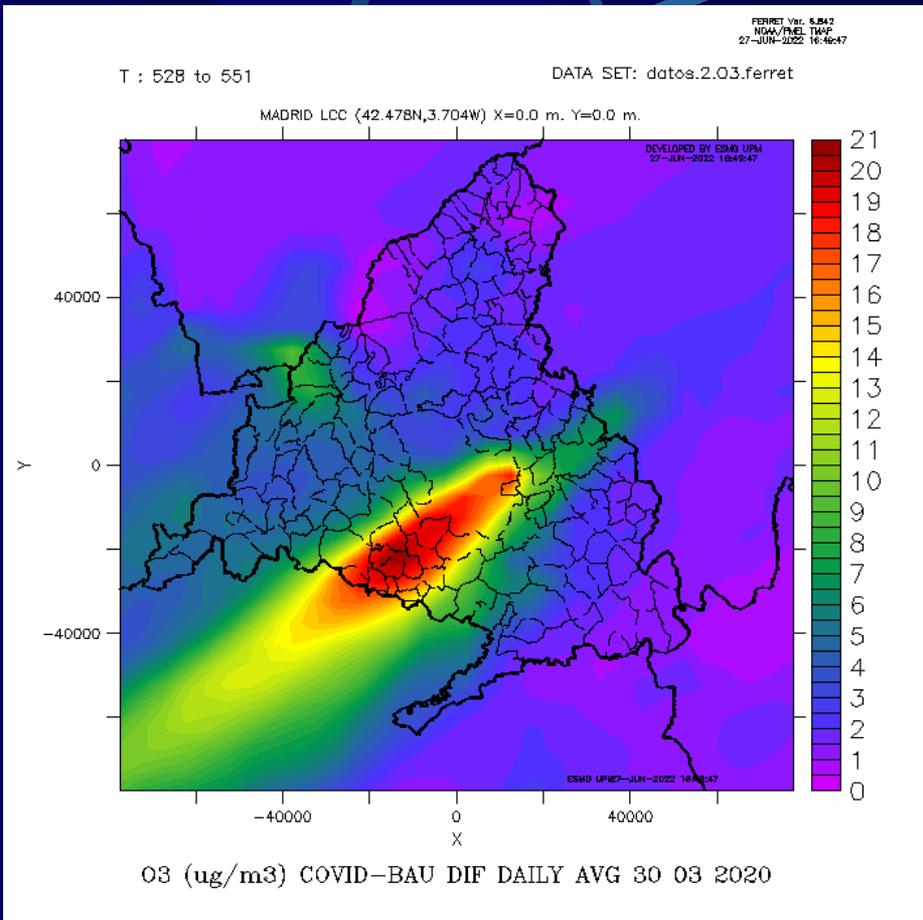


WRF-CAMx

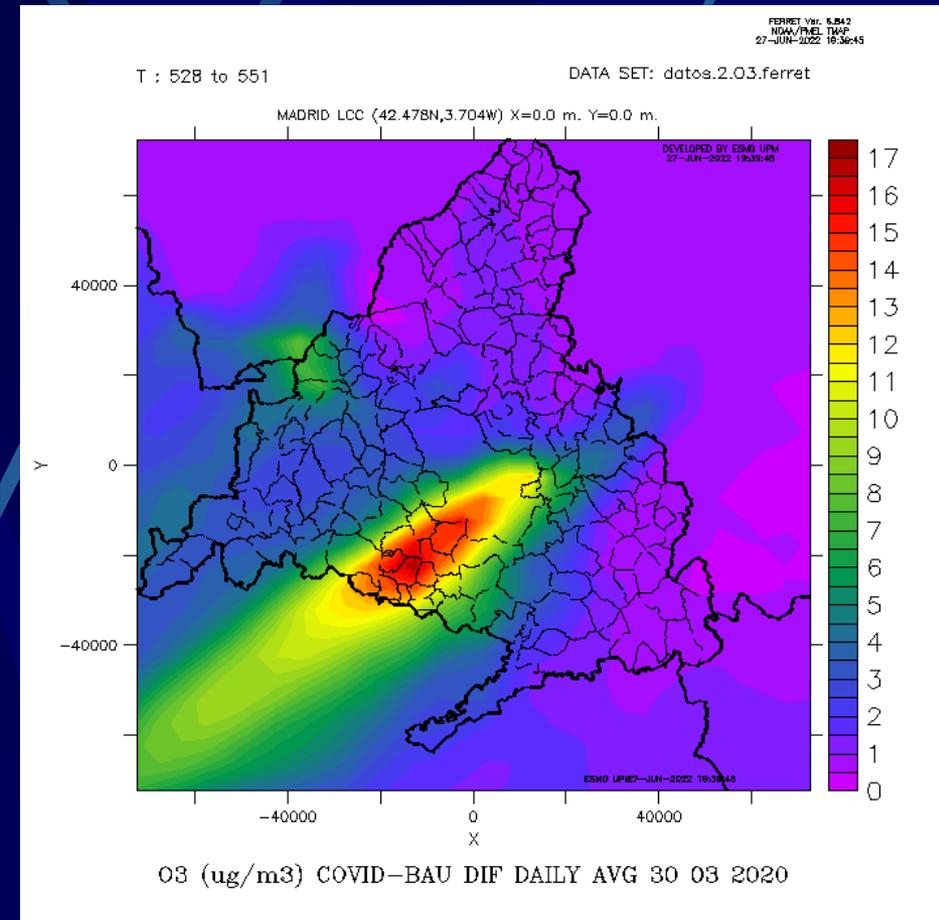


# O3 Madrid COVID-BAU 30/03/2020

## Banned all non-essential activity (Monday)



WRF/Chem



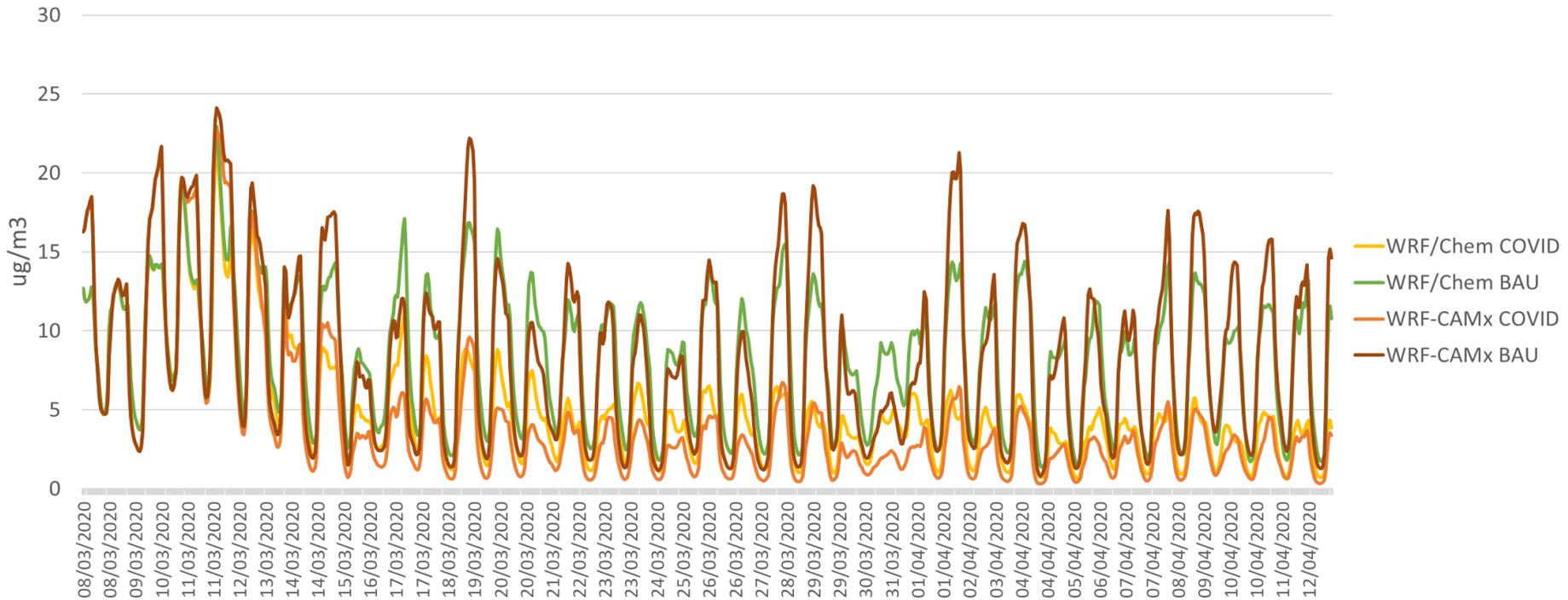
WRF-CAMx



# WRF/Chem & WRF-CAMx Madrid BAU & COVID

## NO2 08/03-12/04 2020 Spatial average

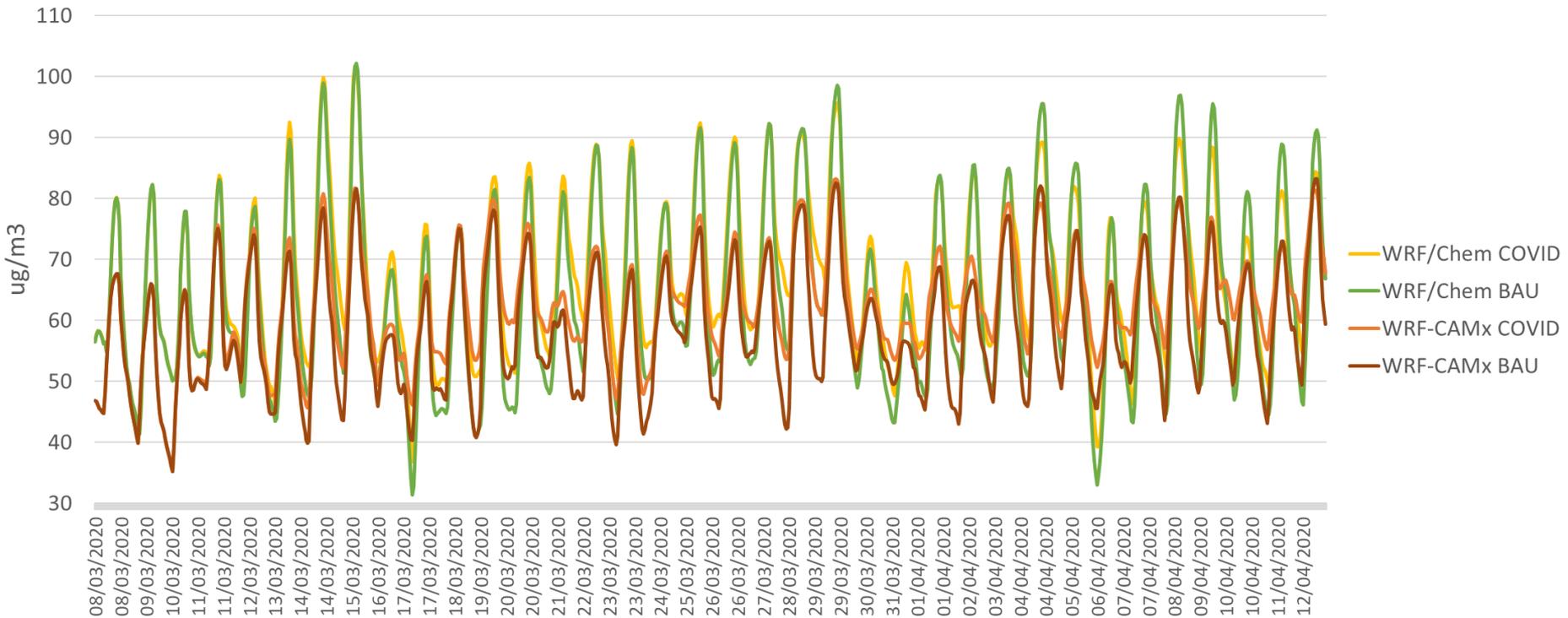
NO2 Spatial average WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



# WRF/Chem & WRF-CAMx Madrid BAU & COVID

## O3 08/03-12/04 2020 Spatial average

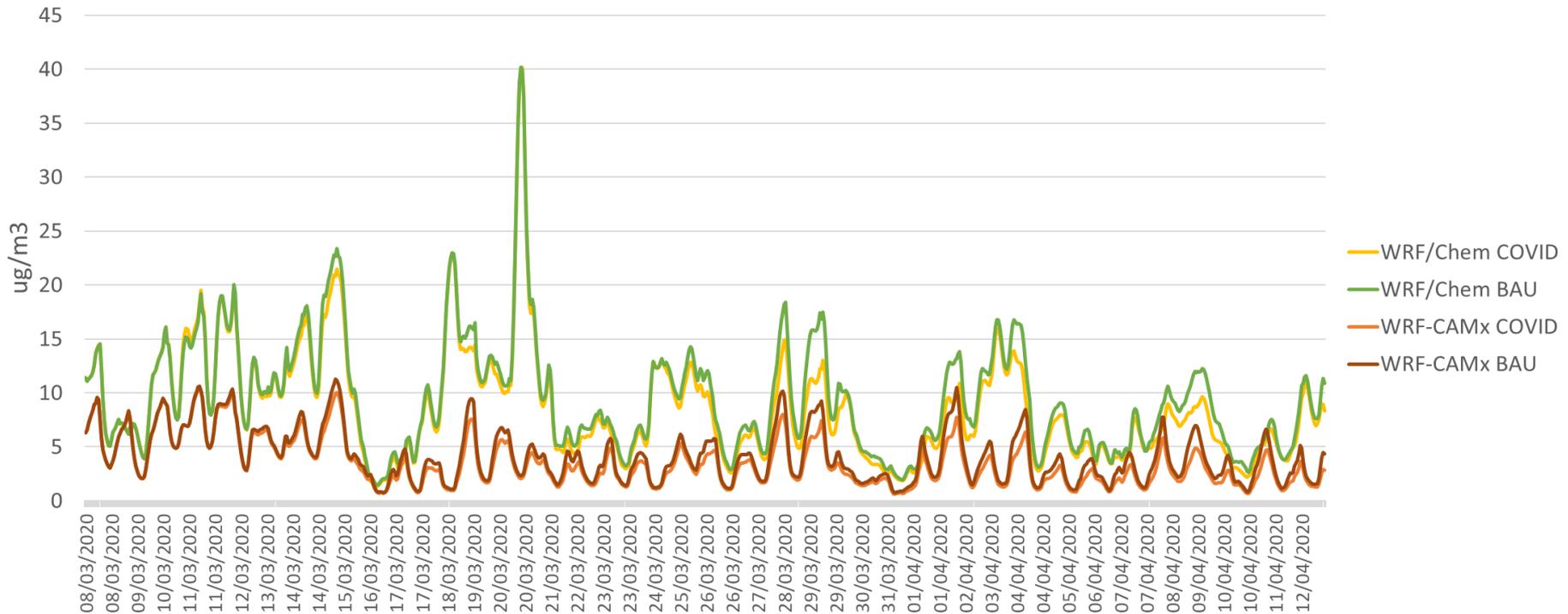
O3 Spatial average WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



# WRF/Chem & WRF-CAMx Madrid BAU & COVID

## PM10 08/03-12/04 2020 Spatial average

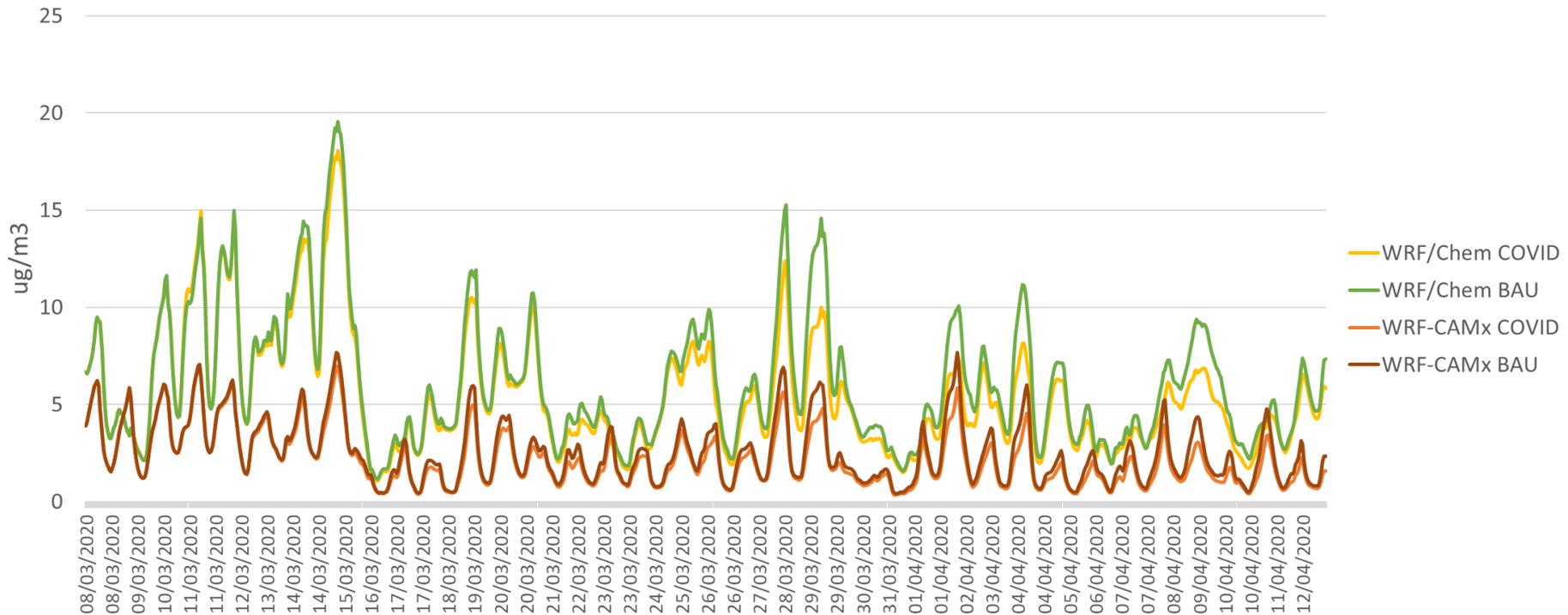
PM10 Spatial average WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



# WRF/Chem & WRF-CAMx Madrid BAU & COVID

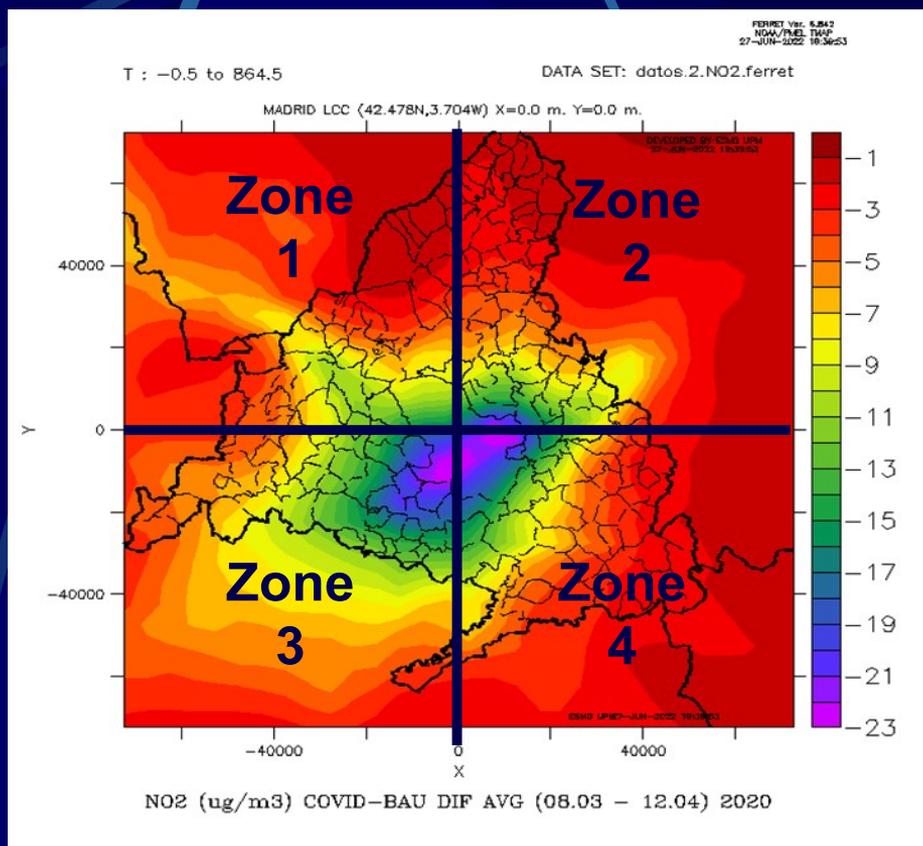
## PM2.5 08/03-12/04 2020 Spatial average

PM 2.5 Spatial average WRF/Chem & WRF-CAMx simulations (BAU,COVID) Madrid (Spain)



# CAMx OSAT & PSAT

- Source apportionment (SAT) to estimates the contributions from 4 source areas, 12 emissions categories and boundary conditions for O3 (OSAT) and PM (PMSAT)
- The methodology also estimates the fractions of ozone formed en route under VOC- or NOX-limited conditions



SECTOR	GNFR SECTOR NAME
S1	Public Power
S2	Industry
S3	Other Stationary Combustions
S4	Fugitives
S5	Solvents
S6	Road Transport
S7	Shipping
S8	Aviation
S9	OffRoad
S10	Waste
S11	AgriLivestock
S12	AgriOther



When the rate of OH production is less than the rate of production of NO<sub>x</sub>, ozone production is **VOC-limited**. Here, ozone is most effectively reduced by lowering VOCs. Between the NO<sub>x</sub>- and VOC-limited extremes there is a transitional region where ozone is nearly equally sensitive to each species.

When the rate of OH production is greater than the rate of production of NO<sub>x</sub>, indicating that NO<sub>x</sub> is in short supply, the rate of ozone production is **NO<sub>x</sub>-limited**. In this situation, ozone concentrations are most effectively reduced by lowering current and future NO<sub>x</sub> emissions, rather than lowering emissions of VOCs.

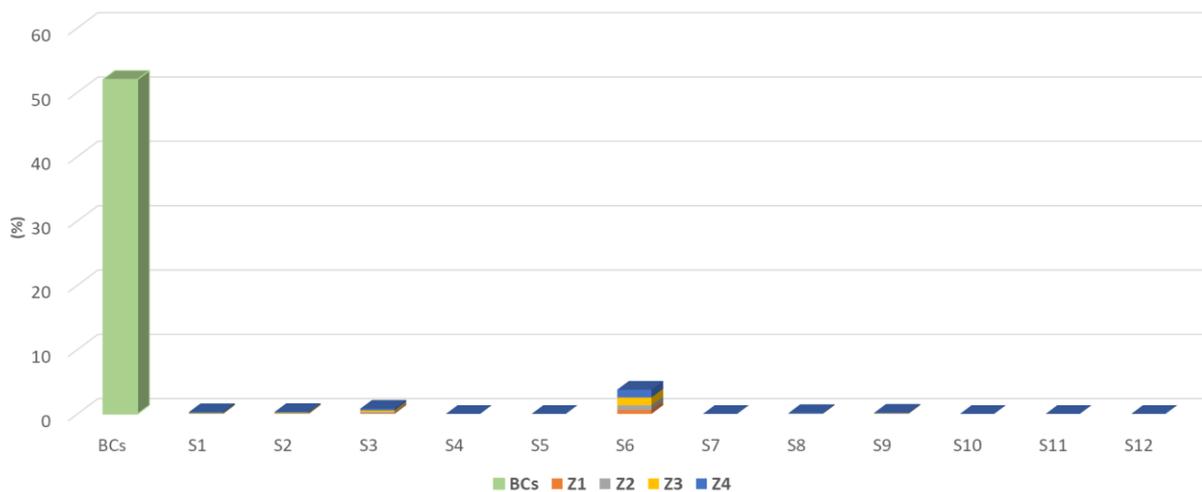
**Solvents** in products such as coatings, inks, and consumer products can emit substances into the air known as Volatile Organic Compounds (VOCs).

**VOC emissions from solvent-based products are regulated to protect air quality.**

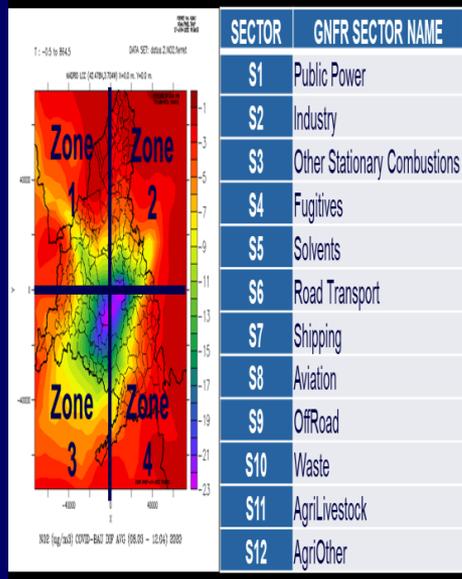


# CAMx OSAT BAU

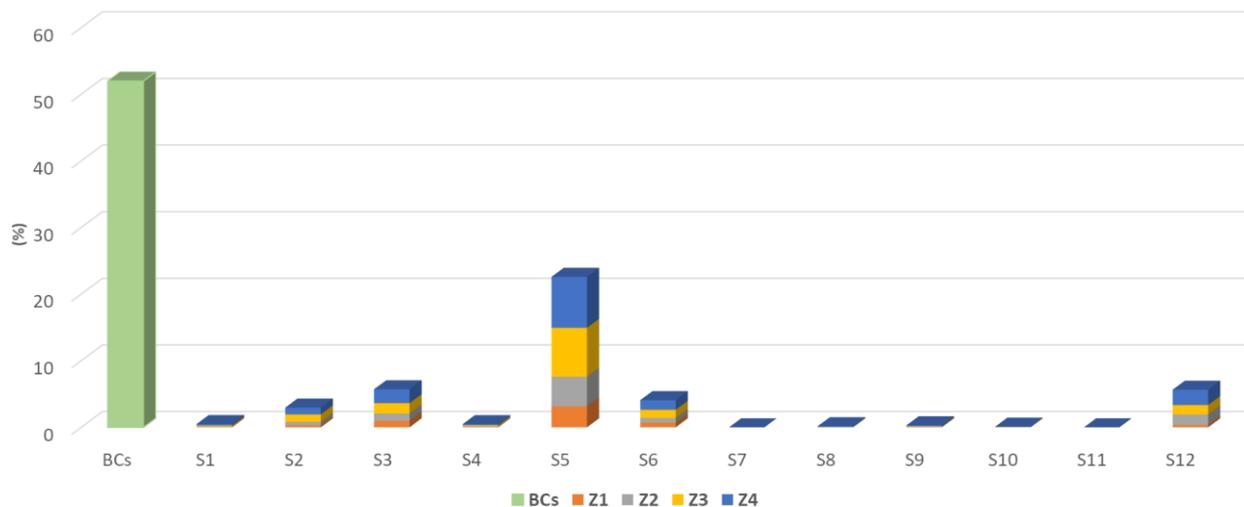
36-Day and spatial average O3: 58,7 ug/m3 WRF-CAMx BAU Madrid, Spain 08/03/2020- 12/04/2020  
Contribution (NOx limited) of BCs, 4 zones and 12 emission sectors



- 50% of the O3 comes from BCs
- O3 formation is dominated by VOC limited conditions
- Solvent use is the main emission source (zone 3 and 4 south of the Madrid Community)

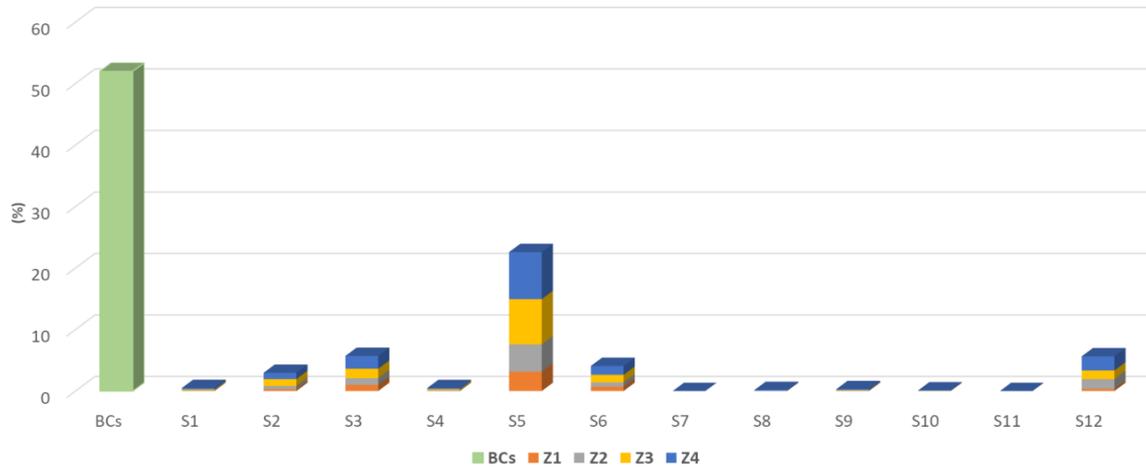


36-Day and spatial average O3: 58,7 ug/m3 WRF-CAMx BAU Madrid, Spain 08/03/2020- 12/04/2020  
Contribution (VOC limited) of BCs, 4 zones and 12 emission sectors



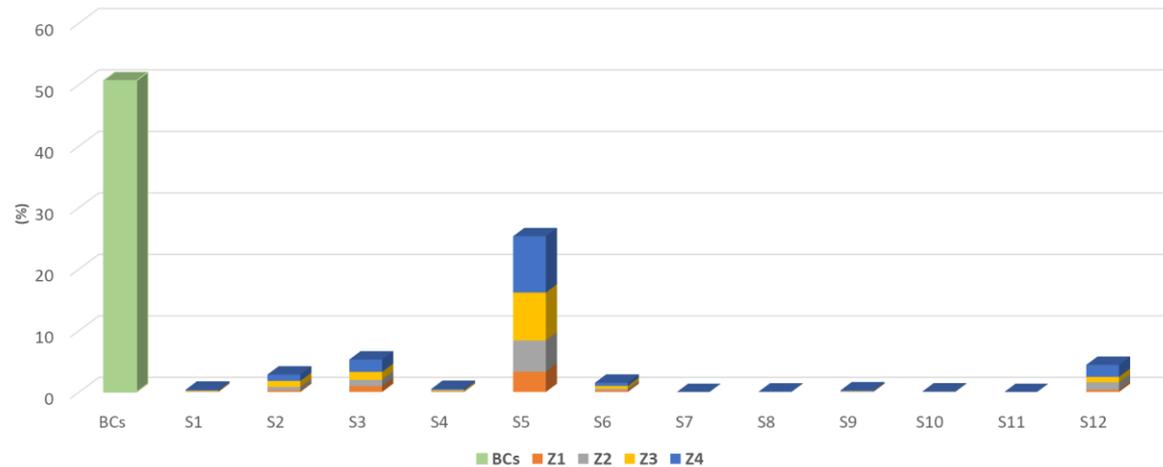
# CAMx OSAT BAU vs COVID

36-Day and spatial average O3: 58,7 ug/m3 WRF-CAMx BAU Madrid, Spain 08/03/2020- 12/04/2020  
Contribution (VOC limited) of BCs, 4 zones and 12 emission sectors

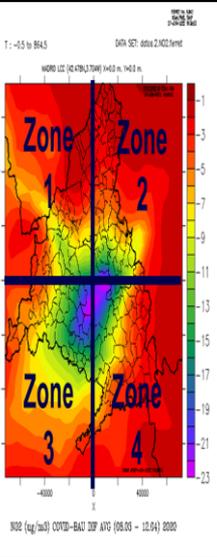


- Lockdown increased O3 concentrations (58->62 ug/m3)
- Lockdown (COVID simulation) reduce the contribution of road transport but increase the contribution of solvents under VOC limited conditions

36-Day and spatial average O3: 62,76 ug/m3 WRF-CAMx COVID Madrid, Spain 08/03/2020- 12/04/2020  
Contribution (VOC limited) of BCs, 4 zones and 12 emission sectors

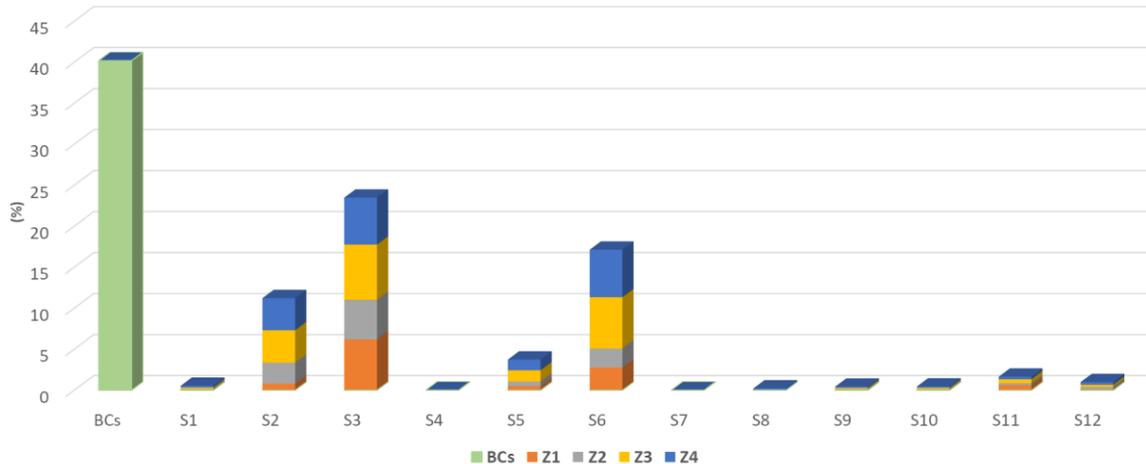


SECTOR	GNFR SECTOR NAME
S1	Public Power
S2	Industry
S3	Other Stationary Combustions
S4	Fugitives
S5	Solvents
S6	Road Transport
S7	Shipping
S8	Aviation
S9	OffRoad
S10	Waste
S11	AgriLivestock
S12	AgriOther

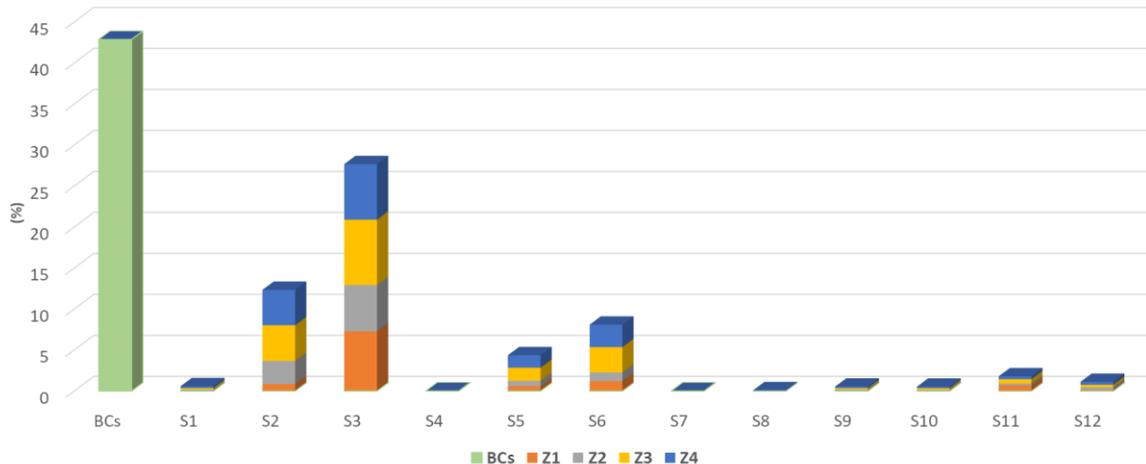


# CAMx PSAT BAU vs COVID

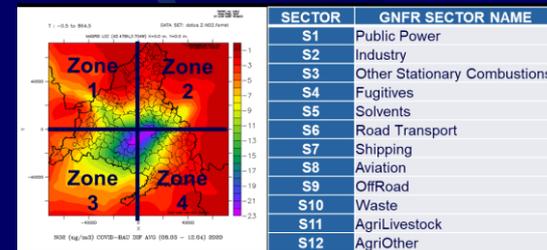
36-Day and spatial average PM10: 20,65 ug/m3 WRF-CAMx BAU Madrid, Spain 08/03/2020- 12/04/2020  
Contribution of BCs, 4 zones and 12 emission sectors



36-Day and spatial average PM10: 17,65 ug/m3 WRF-CAMx COVID Madrid, Spain 08/03/2020- 12/04/2020  
Contribution of BCs, 4 zones and 12 emission sectors



- 40% of the PM10 comes from BCs
- Lockdown decreased PM10 concentrations (21->18 ug/m3)
- Lockdown (COVID simulation) reduce the contribution of road transport (15%->7%) and small increments of S2 and S3 sources.



# CONCLUSIONS (I)

- The impact of COVID lockdown on Madrid Community (Spain) air quality is estimated by running two simulations, one simulation considers the emission reductions during the lockdown (COVID simulation) and a second simulation, "business as usual" (BAU simulation) with an emissions scenario without restrictions with two air quality models: WRF/Chem and WRF-CAMx
- **Simulated results for the lockdown period**, using the adjusted emission inventory **agree better** with surface observations **than the pre-lockdown period**, where the BAU emission inventory is applied.
- In general, the performance results show that the simulations capture the magnitude and temporal evolution of the four key air pollutants reasonably well, with the statistical indicators within the expected ranges.
- **WRF/Chem underestimates O3 concentrations** (-14%) and WRF-CAMx gets better results (+3%) with a small overestimation. **WRF/Chem overestimates PM concentrations** and **WRF-CAMx underestimates** them. **WRF/Chem gets better correlation coefficients** than WRF-CAMx.



# CONCLUSIONS (II)

- The spatial distribution of the impacts of the lockdown are similar in WRF/Chem and WRF-CAMx. **WRF-CAMx produces higher impacts than WRF/Chem.**
- BAU-COVID results reflect an important reductions in NO<sub>x</sub> concentrations and important **ozone increases**. **These increases are higher in WRF/Chem than in WRF-CAMx.**
- **Boundary conditions** are the **main source** of the air pollution concentration (40-50%).
- **The O<sub>3</sub> formation is dominated by VOC limited situation.** This produces increases of O<sub>3</sub> during the lockdown period (NO<sub>x</sub> reduction). **The O<sub>3</sub> is more effectively reduced by reducing VOC's.**

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