

Evaluating Hourly Sulphur Dioxide and Ground Ozone Simulated with the Air Quality Model in Lima, Peru

Odón R. Sánchez-Ccoyllo, Elizabeth Ayma-Choque, Alan Llacza

II. METHODOLOGY AND DATA

Abstract—Sulphur dioxide (SO₂) and surface-ozone (O₃) concentrations are associated with diseases. The objective of this research is to evaluate the effectiveness of the air-quality Weather Research and Forecasting model coupled to Chemistry (WRF-Chem) model with a horizontal resolution of 5 km x 5 km. For this purpose, the measurements of the hourly SO₂ and O₃ concentrations available in three air quality monitoring stations in Lima, Peru were used for the purpose of validating the simulations of the SO₂ and O₃ concentrations obtained with the WRF-Chem model in February 2018. For the quantitative evaluation of the simulations of these gases, statistical techniques were implemented, such as the average of the simulations; the average of the measurements; the Mean Bias (MeB); the Mean Error (MeE); and the Root Mean Square Error (RMSE). The results of these statistical metrics indicated that the simulated SO₂ and O₃ values over-predicted the SO₂ and O₃ measurements. For the SO₂ concentration, the MeB values varied from 0.58 to 26.35 µg/m³; the MeE values varied from 8.75 to 26.5 µg/m³; the RMSE values varied from 13.3 to 31.79 µg/m³; while for O₃ concentrations the statistical values of the MeB varied from 37.52 to 56.29 µg/m³; the MeE values varied from 37.54 to 56.70 µg/m³; the RMSE values varied from 43.05 to 69.56 µg/m³.

Keywords—Ground-ozone, Lima, Sulphur dioxide, WRF-Chem.

I. INTRODUCTION

EXPOSURE to high levels of air pollutants can cause a variety of adverse health outcomes. In research in Greece, [1] demonstrated that people who have been exposed to high SO₂ concentrations have a “carotid atherosclerotic burden”. In research in South Korea, [2] found that an increase in ground-level ozone (O₃) exposure is associated with “dry-eye disease”. Primary air pollutions, such as SO₂ in urban areas in a megacity such as Lima with 11 million inhabitants, is emitted mainly from vehicular, industrial emissions, and cooking anthropogenic activities [3]. For this reason, it is important to carry out simulations of these atmospheric pollutants in Lima, Peru, as estimates of these gases were made in other cities of the world [4]-[6]. The aim of this research is to evaluate the hourly sulphur dioxide concentrations and hourly ground-ozone simulated with photochemical-dynamic WRF-Chem model in February 2018 in Lima.

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The hourly concentrations of sulphur dioxide (SO₂) and hourly ground-ozone concentrations (O₃) were simulated using the 4.0 Air Quality WRF-Chem model version [7]. This is a chemistry model coupled with a meteorological model named WRF (Weather Research Forecasting). The WRF-Chem model is simulated air pollution concentrations and meteorological variables. For the initial and boundary conditions of the WRF-Chem model, we utilized the NCP-FNL “Operational Model Global Tropospheric Analyses” [8] with 0.25° x 25° horizontal resolution. The simulations of SO₂ and O₃ with the WRF-Chem model were performed with a horizontal resolution of 5 km x 5 km, which is the same resolution set up by the authors of [9]. To evaluate the WRF-Chem outputs results of hourly SO₂ and hourly O₃ we chose three air quality monitoring stations due to availability of SO₂ and O₃ measurements concentrations in Lima. On the other hand, the hourly SO₂ and O₃ concentrations measurements were obtained from the Servicio Nacional de Meteorología e Hidrología del Perú (SENAMHI). The locations of the three measurements stations are shown in Fig. 1. These are the San Borja (SB), the Carabayllo (CR), and the Puente Piedra (PP) measurement stations. The evaluations of the WRF-Chem model performance were calculated using the statistical analysis: MeB, MeE, and RMSE defined in (1)-(3) [10]:

$$MeB = \frac{1}{N} \sum_{i=1}^N (P_{rei} - O_{bsi}) \quad (1)$$

$$MeE = \frac{1}{N} \sum_{i=1}^N |P_{rei} - O_{bsi}| \quad (2)$$

$$RMSE = \sqrt{\frac{1}{N} \sum_{i=1}^N (P_{rei} - O_{bsi})^2} \quad (3)$$

where the sub-index I means the pair between predicted (with the symbol P_{rei}) and observed (with the symbol O_{bsi}) for each air quality station and for each hourly variation in time.

III. RESULTS AND DISCUSSION

SO₂ and O₃ concentrations were extracted from the WRF-Chem model outputs located in the volume cell (with horizontal resolution of 5 km x 5 km and vertical resolution of the first layer) of air quality stations or areas nearby the stations. Table

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I presents the statistical evaluations of the WRF-Chem model compared with the SO₂ and ground-O₃ measurements in the SB, CR and PP stations.



Fig. 1 Location of the three air quality measurement stations in Lima: the San Borja (SB), the Carabayllo (CR), and the Puente Piedra (PP) measurement stations

TABLE I
 THE SO₂ AND GROUND-O₃ HOURLY EVALUATIONS PREDICTED WITH THE WRF-CHEM MODEL IN LIMA

Contaminants	SO ₂	SO ₂	SO ₂	O ₃	O ₃	O ₃
Air Quality Station	SB	CR	PP	SB	CR	PP
Observed	18.4	4.3	13.3	11.7	19.7	14.5
Predicted	19.6	31.4	30.5	48.6	60.1	57.3
MeB (µg/m ³)	0.58	26.35	17.18	37.52	56.29	43.36
MeE (µg/m ³)	8.75	26.50	23.81	37.54	56.70	44.57
RMSE (µg/m ³)	13.30	31.79	29.05	43.05	69.56	63.95

SB = San Borja station, CR = Carabayllo station, PP = Puente Piedra station.

A. Sulphur Dioxide

At the SB station, the SO₂ observed concentration mean was 18.4 µg/m³, while the SO₂ predicted mean was 18.4 µg/m³. The SO₂ MeB was 0.58 µg/m³ which indicated a slight over-prediction of the simulated SO₂ concentration with respect to the measured SO concentration; the MeE was 8.75 µg/m³; and the RMSE was 13.30 µg/m³. At the CR station, the SO₂ observed concentration mean was 4.3 µg/m³, while the SO₂ predicted mean was 31.4 µg/m³. The SO₂ MeE was 26.35 µg/m³ which indicated large over-prediction of the simulated SO₂ concentration regarding the measured SO₂ concentration; the MeE was 26.50 µg/m³; and the RMSE was 31.79 µg/m³. At the PP station, the SO₂ observed concentration mean was 13.3 µg/m³, while the SO₂ predicted mean was 30.5 µg/m³. The SO₂ RMSE was 17.18 µg/m³ which indicated the model error in simulating the SO₂ concentration; the MeE was 23.81 µg/m³; and the RMSE was 29.05 µg/m³. The result of this research regarding SO₂ concentration coincides with the results of research in Lebanon conducted by [10] which found that the SO₂ MeB = 17.8 µg/m³; and the RMSE = 31.3 µg/m³, just by comparing simulated and measured hourly concentrations. Fig. 2 shows that the SO₂ concentration in Metropolitan Lima has the highest values (around 30 µg/m³) compared to the northern areas (27 µg/m³ of SO₂), the western areas (21 µg/m³ of SO₂), and the southern areas of Metropolitan Lima (21 µg/m³ of SO₂).

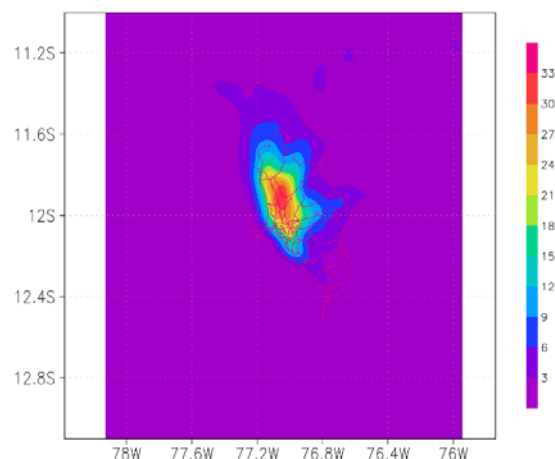


Fig. 2 Spatial variations of SO₂ concentration simulations (in µg/m³) over the Metropolitan Lima with the WRF-Chem model

B. Ground-Ozone

Regarding ground-O₃, the statistical analysis results showed that the model overpredicted at the SB, CR, and PP stations. The MeB, MeE, and RMSE over SB were 37.52 µg/m³, 37.54 µg/m³ and 43.05 µg/m³, respectively. Those over CR were MeB = 56.29 µg/m³, MeE = 56.70 µg/m³ and RMSE = 69.56 µg/m³, respectively. Those over PP were 43.36 µg/m³, 44.57 µg/m³ and 63.95 µg/m³, for MeB, MeE and RMSE respectively. On the other hand, over Beirut in the Easter Mediterranean, [11] showed RMSE = 38.6 µg/m³ and MeB = 25.7 µg/m³ for hourly ground-O₃ comparison. Fig. 3 shows that the highest ozone concentration (160 µg/m³) is located NNW (11.2 S, 70 W) of Metropolitan Lima.

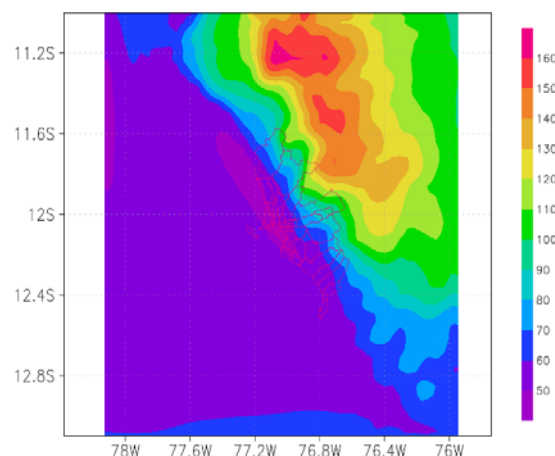


Fig. 3 Spatial variations of ground-ozone concentration simulations (in µg/m³) over Metropolitan Lima with the WRF-Chem model

Figs. 4-6 show the diurnal cycle of ground-ozone simulated using the WRF-Chem model on February 19, 2018 in the San Borja, Carabayllo, and Puente Piedra air quality stations in Lima, respectively, where the highest ozone value was noted around 13:00 local time in Lima (18 UTZ). Fig. 7 shows the vertical variations of ozone concentrations simulated with the WRF-Chem model with Lambert projections over the ozone peak (presented in Fig. 3) where the highest values of ozone

located in the middle of the troposphere can be observed. Fig. 8 shows that the highest value of ozone vertical variation (140 $\mu\text{g}/\text{m}^3$) is located at level 10 of the WRF-Chem model.

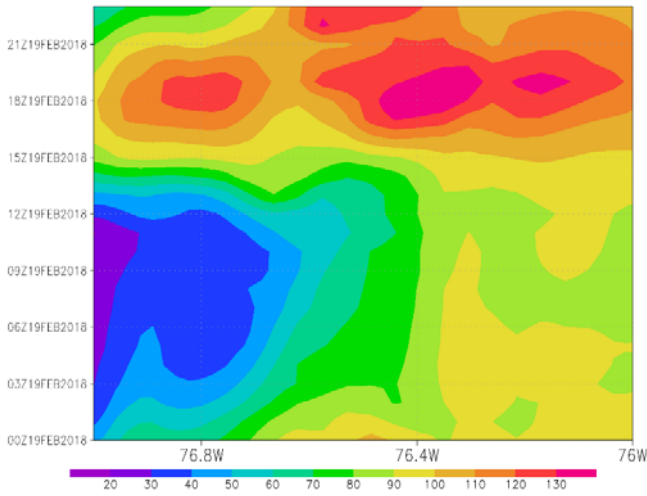


Fig. 4 Diurnal variations of ground-ozone concentration simulations (in $\mu\text{g}/\text{m}^3$) over San Borja with the WRF-Chem model

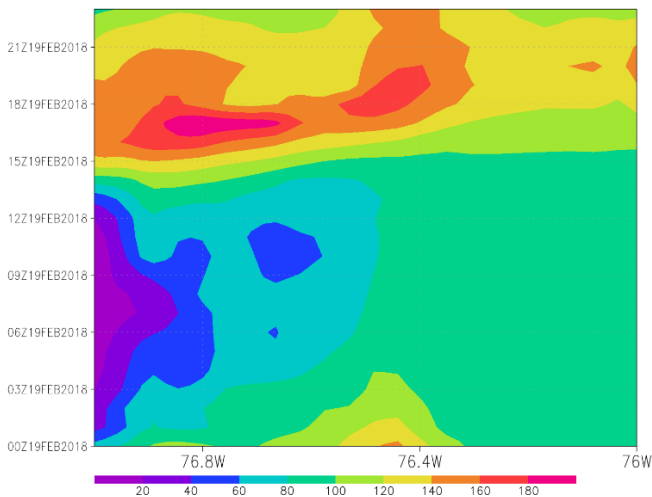


Fig. 5 Diurnal variations of ground-ozone concentration simulations (in $\mu\text{g}/\text{m}^3$) over Carabayllo with the WRF-Chem model

C. Temperature and Relative Humidity Simulations with the WRF-Chem Model

Fig. 9 shows that the center of Metropolitan Lima and the coastal area have high temperature values (296 Kelvin) compared to southern Lima, northern Lima, and eastern Lima. Whereas Fig. 10 shows the spatial surface relative humidity (2 m above the surface) simulated with the WRF-Chem model in February 2018 where the relative humidity – HR in the central Lima area is drier (70-75% RH) compared to the Pacific Ocean (95% RH) and the northern Lima area (58% RH).

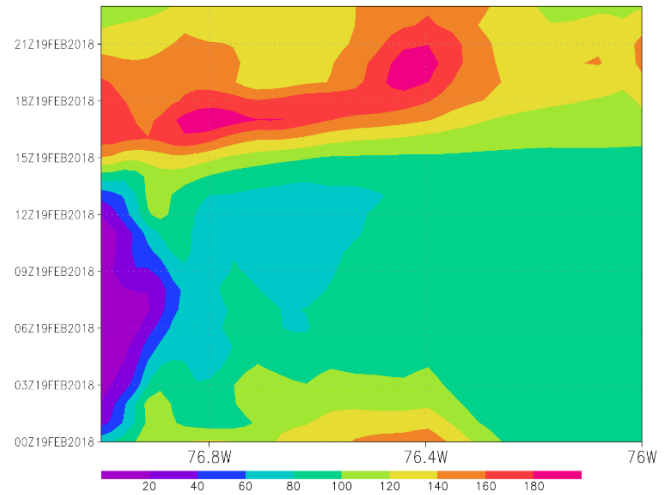


Fig. 6 Diurnal variations of ground-ozone concentration simulations (in $\mu\text{g}/\text{m}^3$) over Puente Piedra with the WRF-Chem model

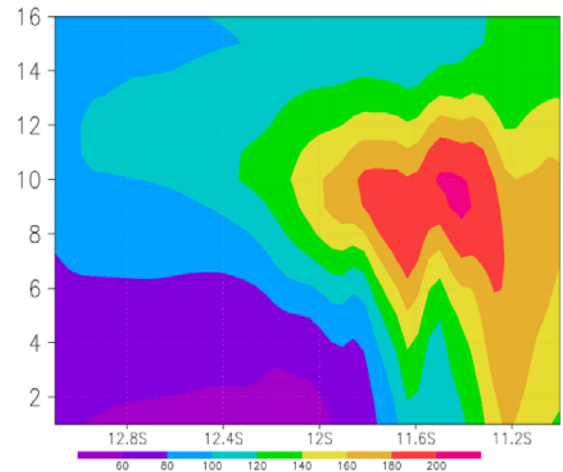


Fig. 7 Vertical variation of ozone was performed considering the fixed length (70°W) located in the highest ozone surface value zone of $160\ \mu\text{g}/\text{m}^3$

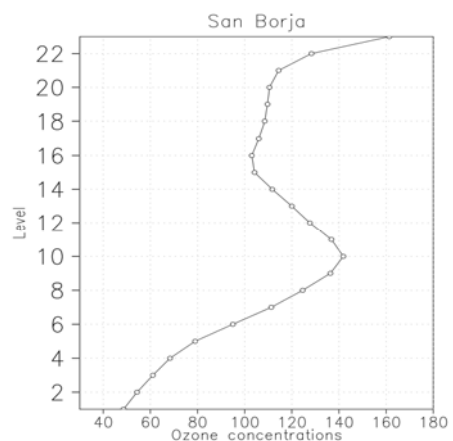


Fig. 8 Vertical variations of ozone concentration simulations (in $\mu\text{g}/\text{m}^3$) over San Borja with the WRF-Chem model

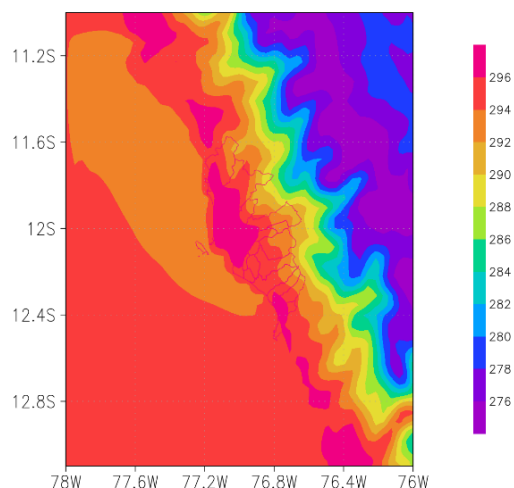


Fig. 9 Spatial variations of surface temperature simulations (K) over Metropolitan Lima with WRF-Chem model

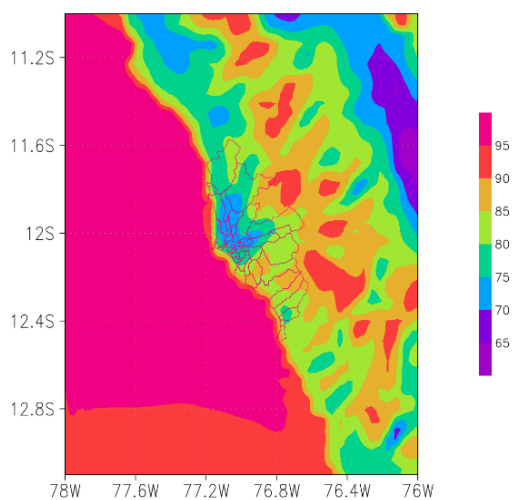


Fig. 10 Spatial variations of surface relative humidity (%) simulations over Metropolitan Lima with the WRF-Chem model

IV. CONCLUSION

This research shows the evaluation of sulphur dioxide (SO_2) and ground-ozone (O_3) simulations using the WRF-Chem model. For this reason, SO_2 and O_3 predicted were compared with the SO_2 and O_3 measurements using the statistical metric of MeB, MeE, and RMSE in Lima, Peru. The results of these statistical techniques noticed SO_2 were $0.58 \leq \text{MeB} \leq 26.35 \mu\text{g}/\text{m}^3$, $8.75 \leq \text{MeE} \leq 26.5 \mu\text{g}/\text{m}^3$, $13.3 \leq \text{RMSE} \leq 31.79 \mu\text{g}/\text{m}^3$, while for O_3 were $37.52 \leq \text{MeB} \leq 56.29 \mu\text{g}/\text{m}^3$, $37.54 \leq \text{MeE} \leq 56.70 \mu\text{g}/\text{m}^3$, $43.05 \leq \text{RMSE} \leq 69.56 \mu\text{g}/\text{m}^3$. The results of this research are consistent with the results of a research conducted in Lebanon by [11] published in an indexed journal. The future of this research project might be to carry out research to understand and reduce the overestimations in the estimates of the emission of SO_2 from the result of the simulations with the WRF-Chem model, in comparison with the measurements of SO_2 .

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