

Is there a common pattern of future gas-phase air pollution in Europe under diverse climate change scenarios?

Pedro Jiménez-Guerrero · Juan J. Gómez-Navarro ·
Rocío Baró · Raquel Lorente · Nuno Ratola ·
Juan P. Montávez

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Abstract Climate change alone influences future levels of tropospheric ozone and their precursors through modifications of gas-phase chemistry, transport, removal, and natural emissions. The goal of this study is to determine at what extent the modes of variability of gas-phase pollutants respond to different climate change scenarios over Europe. The methodology includes the use of the regional modeling system MM5 (regional climate model version)-CHIMERE for a target domain covering Europe. Two full-transient simulations covering from 1991–2050 under the SRES A2 and B2 scenarios driven by ECHO-G global circulation model have been compared. The results indicate that the spatial patterns of variability for tropospheric ozone are similar for both scenarios, but the magnitude of the change signal significantly differs for A2 and B2. The 1991–2050 simulations share common characteristics for their chemical behavior. As observed from the NO₂ and α -pinene modes of variability, our simulations suggest that the enhanced ozone chemical activity is driven by a number of parameters, such as the warming-induced increase in biogenic emissions and, to a lesser extent, by the variation in nitrogen dioxide levels. For gas-phase pollutants, the general increasing trend for ozone found under A2 and B2 forcing is due to a multiplicity of climate factors, such as increased temperature, decreased wet removal associated with an overall decrease of precipitation in southern Europe, increased

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P. Jiménez-Guerrero (✉) · J. J. Gómez-Navarro · R. Baró · R. Lorente ·
N. Ratola · J. P. Montávez
Regional Campus of International Excellence “Campus Mare Nostrum”,
University of Murcia, Campus de Espinardo, 30100 Murcia, Spain
e-mail: pedro.jimenezguerrero@um.es

J. J. Gómez-Navarro
Climate and Environmental Physics and Oeschger Centre for Climate Change Research,
University of Bern, Bern, Switzerland

photolysis of primary and secondary pollutants as a consequence of lower cloudiness and increased biogenic emissions fueled by higher temperatures.

1 Introduction

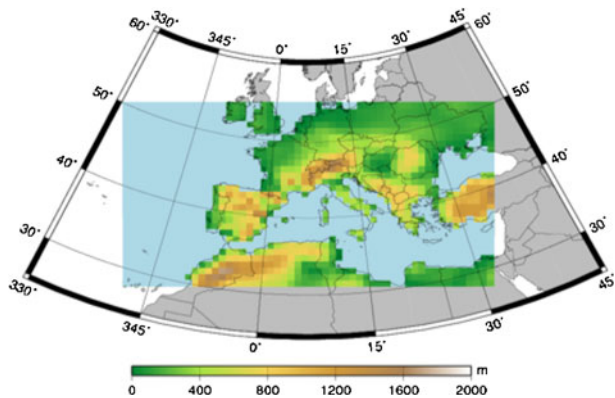
The impact of climate change on air pollution, especially on gas-phase pollutants and ozone, has been previously described in a number of studies (e.g. Forkel and Knoche 2006; Szopa et al. 2006; Giorgi and Meleux 2007; Meleux et al. 2007; Kruger et al. 2008; Katragkou et al. 2010; Anderson and Engardt 2010; Katragkou et al. 2011, among many others). Variations in climate affect gas-phase pollutants by changing the dispersion (wind speed, mixing layer height, convective fronts), deposition by precipitation, dry deposition, photochemistry, natural emissions and background concentrations (Zlatev and Moseholm 2008; Jacob and Winner 2009). Hence, the effects of climate change on air quality should be studied in the broader context of chemistry-climate interactions (Giorgi and Meleux 2007; Gustafson and Leung 2007). Most of the aforementioned works use the future-minus-present method to assess the future impacts on air quality, selecting present and future time-slices of simulations. However, we should bear in mind that this approach is sensitive to the chosen control and future periods due to the inherent internal variability of the climate models, especially at regional scales (Raisanen et al. 2004; Gómez-Navarro et al. 2011). In this sense, the Empirical Orthogonal Functions (EOFs) methodology (Zorita et al. 2005; Monahan et al. 2009) is able to reduce the uncertainty associated to the internal variability when applied to full transient simulations due to the longer time series obtained. However, this methodology is not widely used in air quality-climate change studies due to the computational cost involved.

The magnitude and extent of potential impacts of climate change on air quality in Europe urged major government agencies to undertake several important actions in this regard. The impact studies to be performed under this umbrella inevitably require downscaled scenarios of air quality under climate change scenarios, with as high spatial resolution as possible. The wide spread in the results of recent studies trying to analyze the influence of climate change on regional air pollution pointed out by Racherla and Adams (2008) and Wu et al. (2008), among others, indicate their inherent difficulty.

Awise et al. (2009) highlighted the need for further works (especially in other regions apart from the United States) in order to assess the potential impact of global changes on regional air quality. In this sense, air quality projections at a regional scale are affected by several sources of uncertainty, being the election of the emission scenario one of the most important contributors to the spread of the results. Therefore, a problem arising is to check whether the projected air quality is dependent, and to what extent, on the SRES scenario selected. In this sense, Gómez-Navarro et al. (2010) found that the spatial structure of the warming patterns depends neither on the emission scenario nor on the global circulation model used to drive the regional simulations. It is, rather, an inherent feature of the target domains covered by the regional model.

As such, the aim of this work is to check whether the projected changes in gas-phase air pollution over Europe depends on the scenario driving the regional simulation. For this purpose, two full-transient regional climate change-air quality projections for the first half of the XXI century (1991–2050) has been carried out, including A2 and B2 SRES scenarios.

Fig. 1 Topography (m) of the domain included in the study as incorporated in the MM5-RCM model



2 Models and methods

The regional modeling system consists on MM5 regional climate model and CHIMERE chemistry transport model (coupled off-line) according to the work of Jiménez-Guerrero et al. (2011, 2012). The spatial model configuration comprises a domain of MM5-RCM simulations covering most of Europe with a resolution of 25 km (Fig. 1). Twenty-four sigma levels are considered in the vertical, with the top at 100 hPa. The fields are interpolated to CHIMERE working grids (resolution of about 0.25° for the European domain, in that order).

The climate and air quality simulations cover two full-transient simulations, from 1991 to 2050, driven by ECHO-G General Circulation Model under the SRES A2 and B2 scenarios. In order to isolate the possible effects of climate change on the ground concentrations of gas-phase air pollution, unchanged anthropogenic emissions (derived from EMEP database) are assumed. Natural emissions depend on climate conditions, and are the only ones to vary between reference and future climate simulations. Therefore, the effects of climate change on air pollutants are estimated excluding possible changes on vegetation, land use, anthropogenic pollutant emission changes or any feedbacks from the chemical compounds to the climatological fields, yet allowing changes in natural biogenic emissions (Meleux et al. 2007).

For a more detailed description on the physicochemical parameterizations and the performance of the model to reproduce present-day air quality climatologies, the reader is referred to the [Supplementary Material](#).

2.1 Empirical Orthogonal Functions (EOFs)

In order to investigate the concentration signal along the first half of the XXI century, we apply a principal component analysis that decomposes the air pollution and climatological fields into Empirical Orthogonal Functions (EOFs) characterizing space patterns of variability and their associated Principal Components (PCs), representing their temporal evolution. This methodology allows the increase of the signal-to-noise ratio with respect to the original series, reducing the high dimensionality of complex phenomena and summarizing its main properties in a much smaller number of prominent variability modes (Hannachi et al. 2007). The EOFs analysis is

conducted on the geophysical fields. Here, annual series of modeled air pollution for O_3 maximum concentrations, mean NO_2 , α -pinene (as a surrogate representing the BVOCs concentration) and climatological values (corresponding to the first layer of the model, approx. 15 m, for the period 1991–2050) are used. Following Fiore et al. (2003) we construct a covariance matrix of elements r_{ij} representing the correlation of anomalies between grid square i and grid square j over the first half of the XXI century. The EOFs are the eigenvectors of the correlation matrix and represent linear independent modes of variability. The sum of all eigenvalues equals the total variance in the original data.

The first EOF (EOF1) is selected from the eigenvectors as that accounting for the largest percentage of variance explained of the original dataset. When much of the original variance can be represented only with the EOF1, this methodology is a useful data reduction technique applied to air quality data and modeling results. The projection of the pollutants concentration or climatological fields onto the EOFs defined the principal components; these time series describe the temporal variation in the contribution of the associated EOF to the total variance. In our case, for the analysis we will focus on EOF1 and the associated PC1, since EOF1 captures the global trend and EOFs beyond the first individually account for less than 5 % of the total variance.

We further analyze the spatial correlations of EOF1 between air pollutants in the two scenarios, A2 and B2, which is an index of the similarity between the spatial patterns of variation, and also the temporal correlation of PC1s, depicting the temporal evolution associated to the spatial pattern of change. We also applied a Mann-Kendall test to the PC1 of these variables in order to obtain the statistical significance of the obtained trends. This non-parametric test is widely used in climate studies and is capable to detect the trends or inhomogeneities in the series of data.

3 Results

3.1 Spatio-temporal patterns of variability

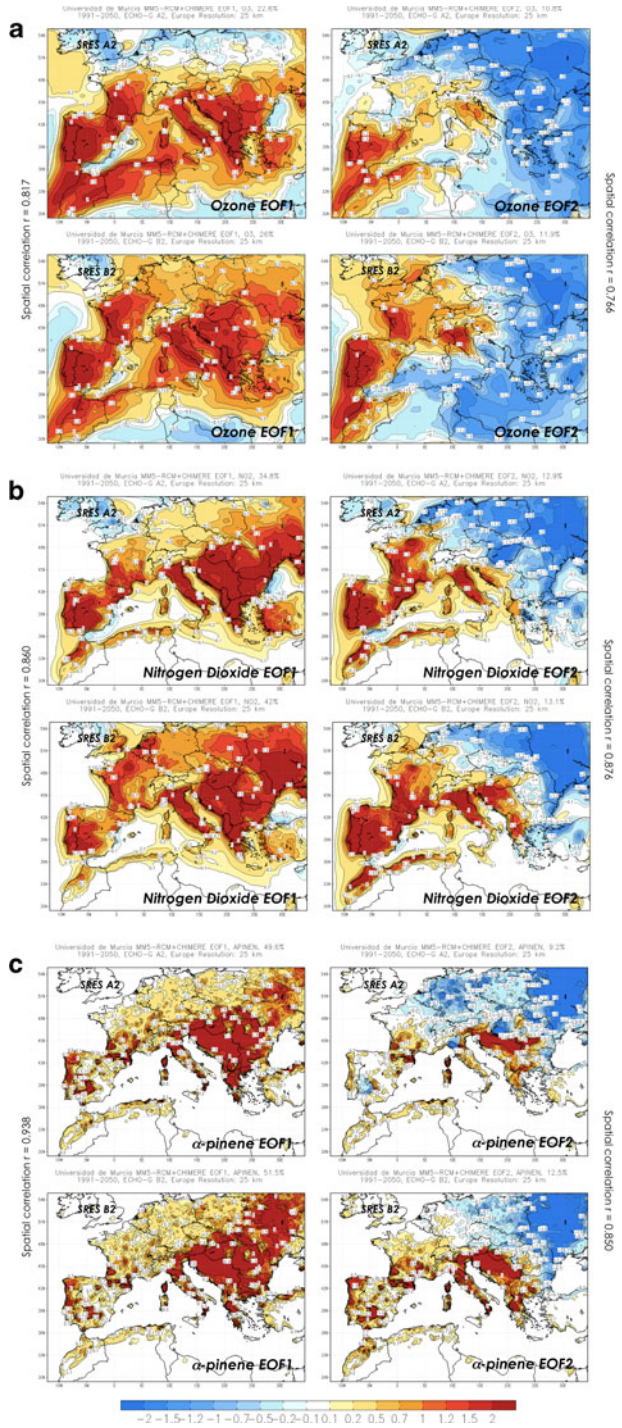
The EOFs and PCs are extracted from our modeling results for the 1991–2050 period both for the concentrations of gas-phase pollutants and for those climatological variables (in both scenarios) whose change would have a significant impact on pollution levels (Wu et al. 2008).

In order to check whether the air quality patterns are dependent on the SRES scenario selected, the spatial correlations between EOF1 in the A2 and B2 experiments for O_3 , NO_2 and α -pinene have been calculated. The analysis of the PCs beyond the first present no significant trend ($p > 0.1$), according to the Mann-Kendall test performed, and hence it is EOF1 which conditions the variation pattern and the rest of the section will focus on EOF1, as advised by Jiménez-Guerrero et al. (2011).

The EOF1 accounts for around 23 % (25 %) of the total variance for O_3 levels, 35 % (42 %) for NO_2 and 50 % (51 %) for α -pinene under the A2(B2) scenario. Figure 2 represents the spatial correlation found between A2 and B2 scenarios for EOF1 and EOF2, just to indicate that, despite it is EOF1 which supports the trend, there is also a strong correlation for the second empirical orthogonal function.

For O_3 , the high spatial correlations found between A2 and B2 scenarios ($r = 0.817$ for EOF1 and $r = 0.766$ for EOF2) suggest that the spatial patterns of future

Fig. 2 a EOF1 (left) and EOF2 (right) for O₃ under the SRES A2 (top) and B2 (bottom) scenarios. The correlation coefficients for both EOFs are depicted in the figure. b Id. for NO₂. c Id. for α-pinene



variation of O₃ pollution over Europe (Fig. 2) hardly change with a different scenario. As observed from NO₂ and α -pinene patterns (Fig. 2, bottom) under the A2 and B2 scenario, the modes of variability for those pollutants and scenarios are even more correlated than those for O₃ ($r = 0.869$ and $r = 0.876$ for EOF1 and EOF2, in the case of NO₂, and $r = 0.938$ and $r = 0.850$ for the biogenic species).

One important result is that the modes of variability of O₃ are highly correlated with those of NO₂ and α -pinene. If establishing the spatial correlation between O₃ and their precursors, O₃-correlation coefficients are $r = 0.640(0.691)$ with NO₂ and $r = 0.803(0.746)$ with α -pinene in the A2(B2) scenario. In this sense, Jiménez-Guerrero et al. (2011) identified the warming-induced increase in biogenic emissions as the main cause of variation of future O₃ concentrations, especially in southwestern Europe.

The increasing trends, as derived from the PC1, are significant ($p < 0.01$) for the first principal component of O₃, NO₂ and α -pinene in both scenarios. There is a positive trend in the O₃ series found under A2 and B2 forcing (which only differ in the slope of the trend, and thus, in the intensity of the signal). This involves an increase of future O₃ concentrations in all Europe (except in the northernmost areas of Europe under the A2 scenario, where the concentrations, as shown by EOF1, will remain invariant or even slightly decrease) (Fig. 2). Albeit results for A2 and B2 are analogous, B2 trends are slightly lower than those for A2 scenario (Fig. 3).

The co-increase in the trend for O₃ precursors in both scenarios is noticeable, as the O₃ formation is dependent on the NO_x/VOC ratio (Jiménez and Baldasano 2004). Moreover, Meleux et al. (2007) indicate that a higher future biogenic reactivity sustains the O₃ production cycle and increases the O₃ yield per NO_x molecule.

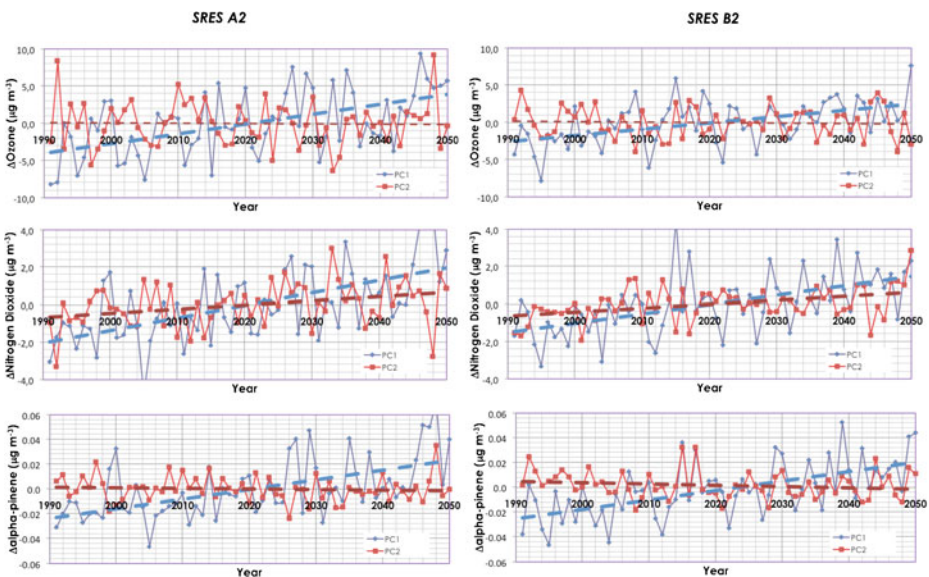


Fig. 3 First (PC1) and second (PC2) principal component for O₃, NO₂ and α -pinene

3.2 Correlation with climatological parameters

The shapes of the spatial patterns for air pollutants seem to be related with several patterns of future change for climatological parameters. Here we focus on temperature, precipitation, mixing height and cloudiness (cloud cover) as the most important climatological variables conditioning the gas-phase concentrations of pollutants. Table 1 represents the spatial correlation between these variables and O_3 and its precursors in the A2 and B2 scenarios, while Fig. 4 shows the respective EOF1. In this case, only the EOF1 for the A2 scenario has been included, since the spatial patterns for A2 and B2 scenario present a similar structure (spatial correlation of 0.989 for temperature, 0.917 for total precipitation, 0.904 for mixing height and 0.820 for cloudiness). As stated for gas-phase pollutants, the EOF1 alone explains most of the variability for these climatological variables (around 90 % for temperature and precipitation and around 40 % for mixing height and cloudiness) and thus our analysis focuses just on this first empirical orthogonal function.

The EOF1 for temperature can be associated to the spatial structure of the future warming pattern, more intensified towards southern Europe (Gómez-Navarro et al. 2010). However, this spatial pattern is not strongly correlated to O_3 on either the A2 ($r = 0.425$) and the B2 scenario ($r = 0.557$). So, future O_3 patterns do not seem to be directly related to those of temperature (although O_3 increases are influenced by the temperature variations). The only patterns of variability that seem to be related, and hence present a similar shape, are those for temperature and α -pinene ($r = 0.702$ and $r = 0.658$ for the A2 and B2 scenarios, in that order), since the spatial correlation with NO_2 is notably lower ($r = 0.217(0.475)$ for the A2(B2) scenario).

Moreover, the variations (general decreases in southern Europe) in precipitation for the future scenario can strongly influence the levels of NO_2 (the variation patterns of this pollutant and precipitation are somehow related, with $r = -0.563(-0.568)$ for A2(B2) scenarios), since the wet deposition of nitric acid (HNO_3) is the main sink for NO_x . In the existence of sunlight, NO_2 reacts mainly with hydroxyl radical to produce HNO_3 , while nighttime chemistry involves the formation of N_2O_5 , the anhydride of HNO_3 , whose dry and wet deposition can be an important nighttime loss process for nitrogen oxides (Atkinson 2000; Jacob 2000).

The changes in ventilation and, specifically, in the mixing height have strong effects on the concentrations of gas-phase pollutants. The mixing height (MH) modes of variability over land show an important north-south behavior, with a decreasing trend over land in southern Europe and increases over higher latitudes (Fig. 4). However, modifications in the MH are generally less than 20 %. As expected, a strong correlation of air pollutants with stagnant conditions is found, as previously reported by Leung and Gustafson (2005). The modes of variability for MH show

Table 1 Spatial correlation coefficients between the modes of variability of climatological variables and gas-phase pollutants in the A2(B2) scenarios over land

| Variable | O_3 | NO_2 | α -pinene |
|---------------|-----------------|----------------|------------------|
| Temperature | 0.425 (0.557) | 0.217 (0.475) | 0.702 (0.658) |
| Precipitation | -0.364 (-0.299) | -0.563(-0.568) | -0.167 (-0.212) |
| Mixing height | -0.686 (-0.685) | -0.602(-0.588) | -0.658 (-0.686) |
| Cloudiness | 0.708 (0.653) | 0.442(0.417) | 0.210 (0.251) |

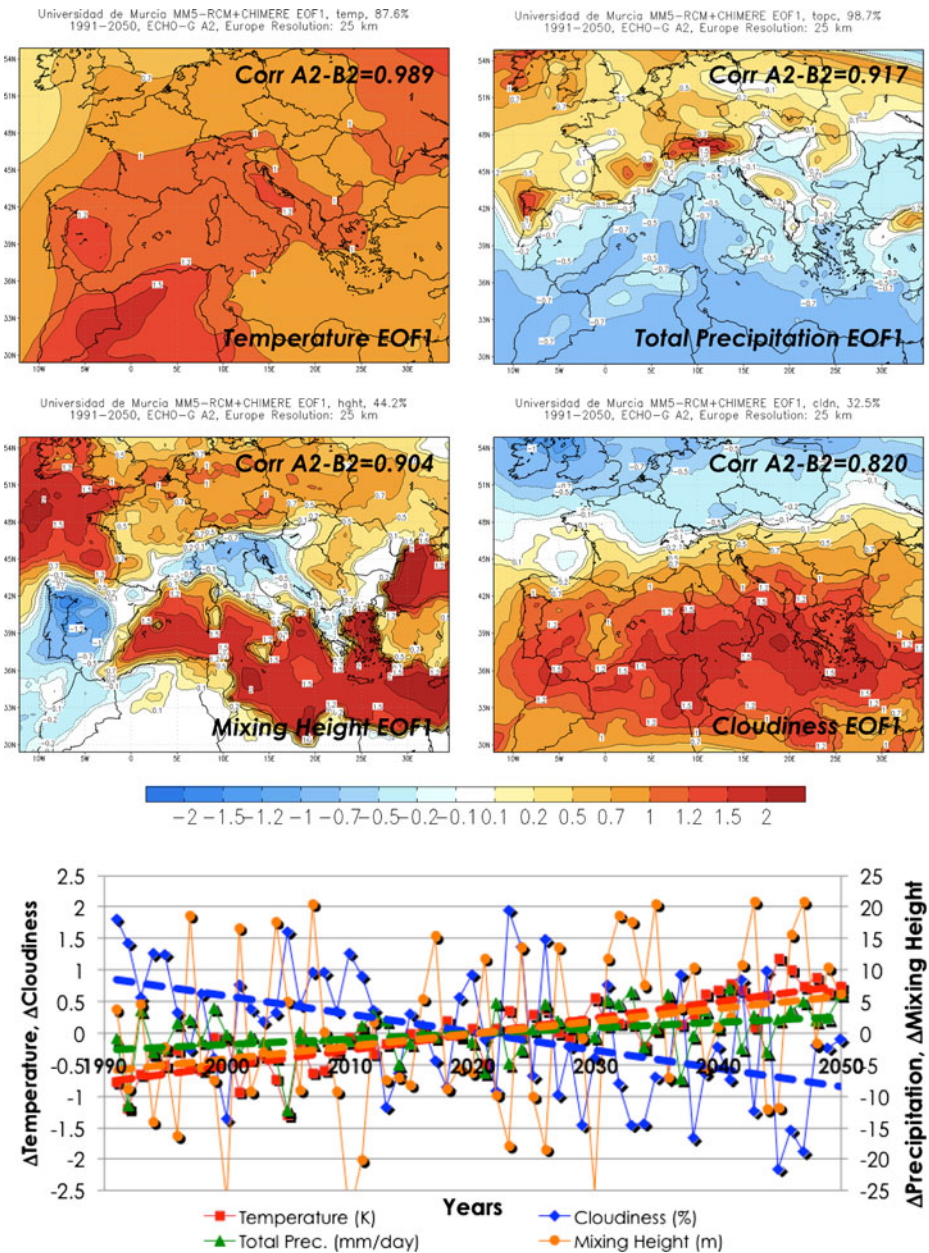


Fig. 4 (Top) EOF1 for temperature, total precipitation, mixing height and cloudiness. The number in the figure represents the spatial correlation between the EOF1 of A2 and B2 scenario. (Bottom) PC1 of the corresponding climatological variables

a strong anticorrelation with those of O_3 ($r = -0.686$ for A2 and $r = -0.685$ for B2 scenarios), NO_2 ($r = -0.602$ and $r = -0.588$ for A2 and B2 scenarios, in that order) and α -pinene, with $r = -0.658(-0.686)$ for the A2(B2) scenario. Note that

the decreases in the MH over land (hampering dispersion processes) are generally associated with a pattern indicating decreasing precipitation and important increases of temperatures (e.g. Iberian Peninsula), therefore representing an adding effect. Thus, the future O₃ increase may be caused by the future combination of less dispersive conditions and lower removal efficiency simulated analogously in both scenarios, leading to increased concentrations of pollutants in the boundary layer, and particularly by an enhancement of NO₂ availability over most of Europe.

Finally, the spatial pattern for cloudiness (cloud fraction) shows a strong north-south dipole. In our case, the maximum decrease occurs over southern Europe, as reported by Giorgi et al. (2004), while the strongest increases are observed over the northern areas, such as the British Isles or northern Germany. In this sense, our results agree with those by Katragkou et al. (2011), who identify a prominent decrease of cloudiness mostly over western Europe at the end of the XXI century associated with an anticyclonic anomaly which favors more stagnant conditions (and weakening of the westerly winds for southern Europe). This change in cloudiness is known to affect strongly the incoming solar radiation, and consequently the spatial patterns of O₃ by modifying its photochemical cycle. The spatial pattern of tropospheric O₃ is correlated ($r > 0.65$ in both scenarios) to the mode of variability for cloudiness (but the PC1s are therefore anti-correlated) and show no important similarity in the spatial pattern for the rest of precursors ($r < 0.45$).

4 Conclusions

This work intended to highlight how future climate change can influence the modes of variability of gas-phase pollutants over Europe for the first half of the XXI century. For that, a regional climate modeling system (coupling MM5-RCM and CHIMERE chemistry transport model) has been applied to two full-transient simulations (1991–2050) driven by SRES A2 and B2 scenarios in order to obtain regional patterns of change for both climatological parameters and air pollutants. Results show the plausible influence of climate change alone on the levels of gas-phase pollutants.

Our simulations suggest that the modes of variability for tropospheric O₃ and their main precursors hardly change under different SRES scenarios, but the PC1 trends are higher for the A2 scenario with respect to the B2-driven simulation. Thus, the effect of changing scenarios has to be sought in the intensity of the changing signal, rather than in the spatial structure of the variation patterns, since the correlation between the spatial patterns of variability in A2 and B2 simulation is $r > 0.75$ for all gas-phase pollutants included in this study. In both cases, full-transient simulations indicate an enhanced O₃ chemical activity under future scenarios.

The causes for tropospheric O₃ variations have to be sought in a multiplicity of climate factors, such as increased temperature, different distribution of precipitation patterns across Europe, increased photolysis of primary and secondary pollutants due to lower cloudiness, etc. Nonetheless, according to the results of this work future O₃ is conditioned by the dependence of biogenic emissions on the climatological patterns of variability. In this sense, O₃ over Europe is mainly driven by the warming-induced increase in biogenic emitting activity (vegetation is kept invariable in the simulations, but MEGAN estimations of these emissions strongly depends on shortwave radiation and temperature, which are substantially modified in climatic simulations). Moreover, one of the most important drivers for O₃ increase is the

decrease of cloudiness (related to stronger solar radiation) mostly over southern Europe at the first half of the XXI century. However, given the large uncertainty isoprene sensitivity to climate change (Guenther et al. 2006; Forkel and Knoche 2006; Horowitz et al. 2007) and the large uncertainties associated to the cloudiness projections, these results should be carefully considered.

As stated by Gómez-Navarro et al. (2010) the climatic response under different SRES scenarios is quite similar regarding the spatial structure of the leading variability modes for both temperature and precipitation. Hence, the leading mode of variability of gas-phase pollutants is expected to show a similar spatial structure in both scenarios, independently on which period the comparison focuses on (which is one of the strengths of the methodology presented on this work). The largest climatic differences among scenarios are however in the temporal component of this variability, being the larger trend under the A2 scenario the most apparent one.

However, the shape of these modes depends on the climatic modes, which at some extent also depend on the climatic model driving the simulations. Thus, some differences can be expected if the same results are obtained with different climate models. Moreover, it should be highlighted that the aforementioned results depend on the fact that the configuration of the modeling system (physical parameterizations, chemical mechanism, chemistry-driving conditions and domain) are equal in all simulations. Further simulations should be performed modifying these factors. Such sensitivity studies would be helpful in assessing the uncertainties linked to the dynamic downscaling process itself. Hence, future works should be devoted to investigate the differences in air pollution meteorology between diverse parameterizations in the chemistry transport models (physics, anthropogenic and natural emissions, chemistry, deposition), the impact of long-range transport in future air quality projections and the improvement from ensemble-based results of regional air quality-climate simulations.

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