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Evaluating transport in the WRF model along the California coast

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Abstract

This paper presents a step in the development of a top-down method to complement the bottom-up inventories of halocarbon emissions in California using high frequency observations, forward simulations and inverse methods. The Scripps Institution

- of Oceanography high-frequency atmospheric halocarbon measurement sites are located along the California coast and therefore the evaluation of transport in the chosen Weather Research Forecast (WRF) model at these sites is crucial for inverse modeling. The performance of the transport model has been investigated by comparing the wind direction and speed at four locations along the coast using aircraft weather reports. Dif-
- ferent planetary boundary layer (PBL) schemes, nesting options and two meteorological datasets have been tested. Finally, simulated concentration of an inert tracer has been briefly investigated. All the PBL schemes present similar results that generally agree with observations, except in summer when the model sea breeze is too strong. At the coarse 12 km resolution, using ERA-interim (ECMWF Re-Analysis) as initial and
- ¹⁵ boundary conditions leads to improvements compared to using the North American Model (NAM) dataset. Adding higher resolution nests also improves the match with the observations. However, no further improvement is observed from increasing the nest resolution from 4 km to 0.8 km. Once optimized, the model is able to reproduce tracer measurements during typical winter California large-scale events (Santa Ana).
- Furthermore, with the WRF/CHEM chemistry module and the European Database for Global Atmospheric Research (EDGAR) version 4.1 emissions for HFC-134a, we find that using a simple emission scaling factor is not sufficient to infer emissions, which highlights the need for more complex inversions.

1 Introduction

²⁵ In the past decades, the implementation of measures within the United States and other countries to monitor the emissions of greenhouse gases (GHGs) has shown



rapid progress. This progress is due to the scientific consensus that GHG emissions are causing climate change (IPCC, 2007) and has lead to the formation of several regional initiatives for reducing emissions, including California's pioneering Global Warming Solutions Act of 2006 (AB-32) administered by the California Air Resources Board

- ⁵ (CARB). Improving the accuracy in GHG emissions quantification has become a critical need in testing the success of environmental policies to achieve the targeted overall reductions (Nisbet and Weiss, 2010). Emissions are typically estimated through "bottom-up" methods, using economic reporting, emission factors and a conversion algorithm. "Top-down" methods are independent validation techniques that use modeling
- of atmospheric transport combined with measurements of the tracer of interest and an inversion algorithm to infer emissions. The two methods are subject to different kinds of uncertainties. In the top-down approach, the uncertainties come from the transport model and the precision and sensitivity of the observations to the emissions in the region of interest.
- The Scripps Institution of Oceanography (SIO) has been conducting high-frequency atmospheric measurements of halocarbons, including hydrofluorocarbons (HFC), at two coastal sites in California for many years: La Jolla (32.86° N, 117.25° W) in the south and Trinidad Head (41.05° N, 124.15° W) in the north. These measurements are carried out under the auspices of the NASA-sponsored Advanced Global Atmospheric
- Gases Experiment (AGAGE) (Prinn et al., 2000). Among numerous others gases, HFC-134a is measured at both stations. HFC-134a is a refrigerant used widely in automobile air conditioners as a replacement for CFC-12, a stratospheric ozone depleting substance banned by the Montreal Protocol. HFC-134a is a potent GHG with a global warming potential (GWP) of 1300 (over 100 yr) and a lifetime of 14 yr. It is regulated by the Kyoto Protocol and by other GHG legislation, including California's AB-32.

The AGAGE measurements can be used in a top-down approach to deduce emissions in combination with a Bayesian inversion algorithm and simulated mixing ratios. It is crucial to model the winds and other meteorological parameters as accurately as possible to minimize atmospheric transport errors. Modeling these parameters within



the lowest few hundred meters above the Earth's surface is still challenging, especially when complex topography is involved. At coastal sites, such as the two SIO stations, the sea breeze phenomenon adds complexity to the atmospheric motions. In the case of California, both the topography and the air-sea interactions lead to complex air flow.

- Fortunately, important meteorological parameters (wind direction, wind speed and temperature) are regularly measured and available to evaluate model simulations at coastal locations, for example through the Aircraft Communications Addressing and Reporting System (ACARS), which allows aircraft to transmit weather report during take-off and landing.
- ¹⁰ This paper presents the first step toward the development of a method to provide a top-down estimate of halocarbon emission inventories in California using high frequency observations, forward simulations and inverse methods. Specifically, we investigate the transport characteristics in the Weather Research Forecast (WRF) model as part of a broader goal of estimating California HFC emissions accurately. We first describe the WRF configuration, options, and schemes tested. Then, we briefly detail the data used for comparison. Finally, we investigate the results of the simulations
- and evaluate the model performance, as well as the impact of the modifications on the modeling of the effectively inert tracer HFC-134a.

2 Description of the WRF model and its inputs for this study

20 2.1 WRF basic configuration

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The regional meteorological model used in this study is the WRF Model with Advanced Research WRF (ARW) dynamic core version 3.3.1 (Skamarock and Klemp, 2008). WRF is a limited-area, non-hydrostatic, terrain-following eta-coordinate mesoscale modeling system. In this study, the Lambert conformal conic projection is used as the model horizontal coordinates. In the vertical, there are twenty eight levels. The coarse



domain of our study is a 12 km resolution grid covering California (center coordinates

are 38° N, 120° W) and a portion of surrounding states, Mexico, and the Eastern Pacific Ocean as shown in Fig. 1. The grid is composed of 129 cells covering about 20 degrees in longitude (1500 km) and of 159 cells covering about 15 degrees in latitude (1900 km). The chosen temporal resolution of the output is two hours to match the temporal resolution of the HFC measurements at La Jolla and Trinidad Head.

One useful capability of WRF is its flexibility in choosing different dynamical and physical schemes. In our study, several physics parameterizations have been changed from the default parameterizations to better represent physical and dynamical processes along the California coast. Diffusion is of the second order following the 2-

- D Smagorinsky scheme (Smagorinsky, 1963). The short and long wave radiation schemes are the new Rapid Radiative Transfer Model for Global climate models (RRTMG) schemes with a radiation time-step of 12 min (Mlawer et al., 1997). We have chosen the NOAH land surface model (Chen and Dudhia, 2001). Considering the size of our grid, we use the Grell-3-D cumulus scheme (Grell and Dévényi, 2002).
- Finally, we use the WSM 3-class microphysics scheme (Hong et al., 2004). These schemes remain constant throughout the testing of different planetary boundary layer (PBL) schemes, nesting grids and initial and boundary conditions.

2.2 Planetary boundary layer schemes

The planetary boundary layer is the part of the atmosphere closest to the ground and is strongly affected by diurnal heat, moisture and momentum transfer to and from the surface. Therefore, the PBL height undergoes a distinct diurnal cycle. At night, with decreasing temperature, the top of the PBL is lower than during the day. The PBL develops in the morning and usually reaches its maximum extent in mid-afternoon. Modeling the diurnal cycle of the PBL requires accurate simulations of sub-daily fluxes of heat, moisture and momentum. WRF offers the choice between ten different plan-

etary boundary layer schemes. Turbulent fluxes of heat, momentum and constituents such as moisture are not resolved at the time steps and grid size used and therefore are parameterized through these schemes. There are different parameterizations



depending on whether the fluxes are estimated only from local variables and/or their gradients (local closure, Holt and Raman, 1988; Hu et al., 2010) or if non local fluxes are added (non-local closure). These non-local terms can then be either parameter-ized (Noh et al., 2003) or treated explicitly (Pleim, 2007a,b; Pleim and Chang, 1992).
⁵ Moreover, the local parameterization can be first or one-and-a-half (Total Kinetic Energy, TKE) order which will have an impact mainly on the turbulent structure (Holt and Raman, 1988). Here, a one-month simulation over January and August 2009 was run for eight of these schemes. These parameterizations are detailed in Hong et al. (2006) (YSU), Mellor and Yamada (1982) (MYJ), Sukoriansky et al. (2005) (QNSE), Nakanishi and Niino (2006) (MYNN2), Pleim and Chang (1992) (ACM2), Bougeault and Lacarrère (1989) (BouLac), Park and Bretherton (2009) (UW) and Angevine et al. (2010) (TEMF). Among the eight PBL schemes that will be evaluated in this study, the MYJ, Boulac, QNSE, MYNN2, UW and TEMF schemes are one-and-a-half order schemes, while the YSU and ACM2 schemes are first order schemes. Moreover, the YSU and ACM2 are

¹⁵ non-local closure models while the rest is local closure models. Several studies have looked at the performances of one or several of these PBL schemes. To our knowledge, there is no study comparing all of the above schemes in a single paper. The main conclusions of these previous studies are that no scheme performs better than the others under all circumstances (Hu et al., 2010; Gibbs et al., 2011; Shin and Hong, 20 2011). Usually, each scheme will have strengths and weaknesses.

2.3 Nesting option

Nesting consists of defining another domain within the main domain, with a higher spatial resolution around regions of interest. Typically, nesting increases the resolution in a limited area around the measurement sites, which can provide a better simulation of the winds near the measurement sites. The WRF model has one- and two-way nesting capabilities and can accommodate multiple embedded nests. We use one-way nesting in this study in order to isolate differences in the different resolution nests. The one-way nesting is performed as follows. First, the parent (outer) domain is integrated for one



time step. Next, its values are interpolated and communicated to the nest boundaries. The nest (inner) domain is then integrated for the small-grid time interval to reach the parent domain's time level (Skamarock and Klemp, 2008). In our case, we have run the model with two levels of embedded nests around San Diego/Los Angeles area

and a single nest around the San Francisco Bay area, as shown in Fig. 1. The coarse domain (d01) is the 12 km resolution grid. The medium domains (d02 and d03) have a 4 km resolution with a 100 × 100 grid size. The finer domain (d04) has a 0.8 km resolution with a 101 × 101 grid size.

2.4 Initial and lateral boundary conditions

- ¹⁰ Meteorological datasets provide initial conditions and lateral boundary conditions for limited-area models. The WRF preprocessing system interpolates the data onto the model grid at all vertical levels for the initialization. It also calculates the values at the coarse domain lateral boundaries for each specified timestep.
- We compare two different meteorological datasets. The first meteorological dataset is an analysis (forecast) product and comes from the National Centers for Environmental Prediction (NCEP) North American Model (NAM) with a 12 km and 6 h resolution (http://nomads.ncdc.noaa.gov/data/namanl/). To better represent the coastal wind patterns, we use the sea surface temperature (SST) dataset RTG_SST_HR data (Real-Time Global SST) from NCEP at a 0.083 degree resolution (≈9 km) and 24 h
- frequency (ftp://polar.ncep.noaa.gov/pub/history/sst/ophi/). The second meteorological dataset comes from the European Center for Medium Range Weather Forecasts (ECMWF) and is the ECMWF Re-Analysis (ERA-interim) (with observation assimilation) with a ≈80 km and 6 h resolution combined with the Global Ocean Data Assimilation Experiment (GODAE) high-resolution (≈9 km) SST data set from the US Navy
- ²⁵ updated every 6 h (http://www.usgodae.org/ftp/outgoing/fnmoc/models/ghrsst/). In the case of NAM, the provided data are forecasts, while for ERA-interim, the provided data are reanalyzes, that is to say, forecasts corrected using observations a posteriori. ERA-interim should then provide data with better accuracy but lower resolution.



2.5 Different sets of simulations

We have carried out four different sets of simulations (see Table 1). In the first set, we have run WRF without nesting with the eight different PBL schemes for the January and August 2009 one-month periods using the NAM initial and lateral boundary conditions.

- In the second set, we have compared the two initial and lateral boundary condition datasets (NAM versus ERA-Interim) using simulations covering the whole year 2009 with the MYNN2 PBL scheme. In the third set, we have tested the nesting option in the simulations with the MYNN2 PBL scheme and ERA-interim. As the nested run is computationally intensive, the simulations were conducted for only four months: January,
- ¹⁰ April, July and October 2009. Two nesting configurations have been tested. The first uses 4 km resolution nests around San Francisco, San Diego and Los Angeles, and one 0.8 km resolution nest around San Diego. This version has been run for January and July. Then, we have run the simulations without the 0.8 km resolution nest for April and October. Finally, looking for improvement in the transport of an inert tracer, we have
- added a chemistry module and changed some options. These different combinations of simulations are summarized in Table 1.

3 Observations

3.1 ACARS vertical profile data

To evaluate the vertical transport characteristics of the model simulations, we use the ACARS data provided by aircraft during take-off and landing available on the NOAA website (details at http://madis.noaa.gov/madis_acars.html). As the focus is on coastal sites, we have mainly selected coastal stations. However, we also chose one inland station (Sacramento) to assess the model further inland. The stations are airports at San Diego (SAN), Los Angeles (LAX), San Francisco (SFO) and Sacramento (SMF).

²⁵ The location of each station is given in Table 2 and Fig. 1. The available data are



temperature, wind speed and direction measured for 200 vertical levels from the ground to 13 km. In this work, we limit our study to the lowest 4 km. We have selected data with pressure greater than 990 hPa to represent the surface level. These surface data were then aggregated in two hour bins to compute daily cycles. For the vertical analysis, data were aggregated by 50 hPa layers from 600 to 1050 hPa before being averaged on a monthly basis to create a vertical profile.

3.2 SIO HFC-134a measurements

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We focus here on the HFC-134a measurements from La Jolla (code: SIO, 32.86° N, 117.25° W, 14 m a.s.l.). There, a cryogenic preconcentration gas chromatograph-mass
spectrometer (GC-MS) system called "Medusa" measures 38 anthropogenic and natural trace gases down to the sub-parts-per-trillion concentration range every two hours, including HFC-134a (Miller et al., 2008). This station is located north west of Downtown San Diego and receives air masses from the San Diego area, as well as from the Los Angeles area and other coastal regions further north. Mixing ratios elevated above background are regularly observed. The background is calculated using the filtered clean air data from Trinidad Head on a monthly basis (http://agage.eas.gatech. edu/data_archive/agage/gc-ms-medusa/monthly/). We have selected HFC-134a for

the good temporal coverage by the observations during the chosen periods and the availability of emission inventories from the European Database for Global Atmospheric Research (EDGAR) and CARB. HFC-134a is also an important GHG because it has

²⁰ Research (EDGAR) and CARB. HFC-134a is also an important GHG because it f a high GWP and a high growth rate (around 9 % yr⁻¹).

3.3 Prior emissions

The HFC-134a emissions that are used in the simulations are the 2005 constant-in-time emissions from the EDGAR inventory version 4.1 (Olivier et al., 1996), available at http:

//edgar.jrc.ec.europa.eu/. For this study, we used the HFC-134a emission map at 0.1 ×
 0.1 degree resolution and scaled it with the 2005–2009 trend reported for California



by CARB. This emission map was then interpolated onto the different domain grids (12, 4 and 0.8 km resolution). According to the CARB inventory, in California, the trend in HFC-134a emissions was positive until 2005, reaching 8.553 million tonnes of CO₂ equivalent. Since then (up to 2009), the trend has been negative. The emissions in 2009 are estimated at 8.036 million tonnes of CO₂ equivalent, similar to the emissions from 2003 (see CARB inventory at http://www.arb.ca.gov/cc/inventory/data/data.htm).

4 Results

4.1 Simulations with eight PBL schemes

Accurate simulation of the time evolution of the PBL height is crucial to properly simulate the vertical mixing and ventilation of trace gases emitted at the surface. In Fig. 2, the average diurnal cycles of the simulated PBL heights are plotted at SAN in January and August 2009. For this figure, and all the others presenting a diurnal cycle, local time (UTC-8 or -7) is used. From March to November, daylight savings time is applied, leading to seven hours difference from UTC, while the rest of the year, the difference is eight hours. On the left, the heights have been calculated using the Richardson bulk number method, while on the right the height comes directly from WRF. For both figures, the schemes simulate a higher PBL height during the day than during the night. However, the PBL height calculated by the individual PBL schemes can differ from the DBL height and bulk height and height and height and height for D2N10 (ONCE).

PBL height calculated by the bulk Richardson number, especially for P3N12 (QNSE)
 and P8N12 (TEMF). If we consider only the WRF diagnostics, that are not all calculated with the same method, it seems that the schemes produce very different PBL cycles and therefore, we would expect a strong influence of these schemes onto the winds and temperature. However, using the Richardson bulk number method for all schemes shows that the PBL schemes are much more similar to each other, especially during
 the night.



There are not many PBL height measurements available over California. We focus therefore on the effect of the PBL schemes on easily measurable quantities such as temperature, wind speed and wind direction. In Fig. 3, the surface temperature, wind direction and wind speed are plotted for the San Diego airport in January and Au-⁵ gust 2009. For the wind direction, the panels are divided into two parts, the light blue part highlights wind coming the west while the tan part highlights winds from east. All the schemes present similar variation during the day for all parameters. No scheme matches the observations better than the others in a consistent way. Moreover, temperature and wind speed are in good agreement with the observations for all of the schemes. In January, the simulated wind direction agrees well with the observations.

- In August, the land breeze is present in the observations, but not in the simulations. The simulated winds come only from the west, south-west. Errors in the nighttime wind in August suggest that these time periods may not be suitable to use in the emissions inversion. Moreover, the August afternoon wind speed is slightly overestimated. At the
- other coastal stations (not shown), as for SAN, the wind and temperature are similarly rather insensitive to the PBL scheme used. At the inland station (not shown), Sacramento airport, the modeled cycles of temperature, the wind speed and direction differ more from one another than at the coastal sites when different PBL schemes are used. In conclusion, for all sites in January, WRF is capable of reproducing the surface pa-
- ²⁰ rameters properly without any large difference between the PBL schemes. In August, the wind direction difference during night is more challenging.

In addition to daily cycles at surface level, it is important to evaluate the verticallyresolved wind and temperature in WRF. We have plotted in Fig. 4 the monthly median vertical profile of temperature and wind speed for SAN, SFO and SMF. Data from LAX

are very similar to SAN and are therefore not shown. As previously, there are no large differences between the schemes. Moreover, in terms of temperature, they perform remarkably well at all the sites. In the case of the wind speed, while the surface wind speed is generally in good agreement, the vertical profiles present more discrepancies, especially in August. In January, the disagreement comes mostly from the low altitude



levels with modeled winds generally being too high. In particular at SMF, WRF seems to constantly simulate a wind inversion near the surface. In August, on the contrary, the modeled winds are slower than observed, especially at the high altitude levels. Finally, we observe a 2 m s⁻¹ underestimation of the whole mean vertical profile in August at ⁵ SFO.

Overall, the wind and temperature from every PBL scheme do not show large differences between each other, which shows that wind and temperature profiles are rather insensitive to which PBL scheme is used. Moreover, compared to surface observations and vertical profiles, the schemes allow the observations to be closely reproduced in ¹⁰ most of the cases. Discrepancies in the surface level wind direction in August at San Diego and in January at San Francisco, as well as an underestimation of the vertical profile of the wind speed (2 m s⁻¹) and an overestimation of the vertical profile of the temperature (5 °C) in August at San Francisco, still show up. In the next sections, we focus on one PBL scheme and test different options for meteorological boundary condi-¹⁵ tions and nesting. The chosen scheme is the MYNN2 (P4), which has been described

as performing well for coastal regions (J. Dudhia, WRF tutorial).

4.2 Simulations with two different meteorological datasets

Here, we have tested two different meteorological datasets for initial and lateral boundary conditions. The first, NAM, provides data at the same resolution as our coarse
domain (12 km) while the second, ERA-interim, is of lower resolution but greater accuracy. We have simulated the whole year 2009 with both meteorological datasets. For the observed surface mean diurnal cycle, no significant differences were observed between the one month averaged diurnal cycle and the three month averaged diurnal cycle (with the same central month), other than an improved mean diurnal cycle with a better time coverage. However, the simulations show more intra-seasonal variability and thus comparing the three month average coarse runs with the one month nested runs lead to misinterpretation. We, therefore, compare the runs averaged over one month (January, April, July and October) to the three-month averaged observations.



The average diurnal cycles of wind direction, wind speed and temperature are presented in Fig. 5, for January, April, July and October 2009 at SAN and SFO where the simulation using NAM (P4N12b) is plotted in blue crosses and the ERA-interim simulation (P4E12) is plotted in red dots. Both generally follow the observed pattern at all sites and for all months. However, P4E12 performs better than P4N12b in several 5 ways especially for the wind direction. At San Francisco, the wind speeds are overestimated by both datasets for all months, though P4E12 is closer to the observations. The same phenomenon is found at Los Angeles in July (not shown). Moreover, at SAN, in July, the wind direction is modeled better by P4E12 even though the sea breeze is still too strong compared to the observations, while for the temperature cycles, P4N12b performs better than P4E12.

In Fig. 6, the monthly average vertical profiles of wind speed and temperature are plotted for SAN, SFO and SMF, in a similar way to Fig. 4. The same color code as above is used. For the wind speed, we observe good agreement in the high levels for both

P4E12 and P4N12b at all sites, except in July, when the wind speed is either strongly 15 overestimated (at SAN) or strongly underestimated (at SFO and SMF) by P4N12b. P4E12 clearly performs better in the high levels than P4N12b. At the lower levels, the simulated wind speeds show an inversion at all sites and in all months for both simulations, which is not what is observed. However, P4E12 usually simulates a smaller

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inversion than P4N12b. For the temperature profiles, there are no large differences be-20 tween observations and simulations. We observe only a slight overestimation of about 1°C for the low levels in July and October at all sites and in January at Sacramento for P4E12, while P4N12b underestimates the temperature in July at all sites in the higher levels, and at SAN and LAX at the lower levels, but overestimates the lower level temperatures at SFO and SMF. 25

In conclusion, using ERA-interim as initial and lateral boundary conditions improves the simulation in comparison to using NAM. We show that in our case, using reanalyzed initial and lateral boundary conditions tends to improve the simulations more than using initial and lateral boundary conditions with a higher spatial resolution. Moreover,



the difference between the two is larger than the differences between the various PBL schemes. It seems that, here, initial and lateral boundary conditions have a larger influence on the simulated wind and temperature than the choice of the PBL scheme.

4.3 Simulations with the nesting options

In Fig. 5, the diurnal cycles of surface wind speed, direction and temperature are also plotted for simulations using nests of 4 km resolution (green diamonds) and 0.8 km resolution, (gold triangles, only for January and July at SAN).

At SAN, two nests are embedded, one at a 4 km resolution (P4E04), as at the other stations and a second, at 0.8 km resolution (P4E08). First, comparison of the 4 km and

- 0.8 km nests at SAN shows that no significant difference comes from using this highest resolution nest. The Pearson's correlation coefficients between the observations and the nested runs are the same (0.9 for the wind direction, 0.4 for the wind speed and 0.9 for the temperature), as are the mean differences between observed and simulated temperature and wind. The mean differences for the wind direction are, however, larger
- ¹⁵ in P4E08. It seems then that at SAN using a 0.8 km resolution nest does not provide better results than the 4 km resolution nest, while using much more computational time (about 4 times the cost).

We now focus on the comparison between the 12 km and 4 km resolution simulations (P4E12 and P4E04) in Figs. 5 and 6. If we compare the nested winds to the

- observations, the results are usually better than for the coarse winds, especially for wind direction and temperature. Generally, the land-sea breeze is better represented by the nested simulation. However, in July at San Diego, or in April at SFO, the nested wind direction is nearly identical to the coarse wind direction, showing no improvement. In terms of wind speed at SAN, there is also little difference. However, at Los Ange-
- les, the nested wind speeds in the afternoon are closer to the observations than the coarse wind speeds (not shown). At SFO, we observe the opposite phenomenon, with the nested wind speed being overestimated compared to the coarse wind speed. Finally, at Sacramento, the wind speed is generally overestimated (by $\approx 2 \,\mathrm{m\,s}^{-1}$) for all



simulations, except in July, when the nested wind speed is closer to the observations than the coarse wind speed. In term of temperatures, there are no large differences between the coarse and nested temperatures, except at San Francisco in July where the nested temperatures are overestimated by 2 °C. At all coastal sites, there is a slight overestimation of the temperature, which is most pronounced in January at SAN and SFO.

In Fig. 6, the vertical profiles, as for the surface observations, present no significant difference between the 4 km and the 0.8 km resolution simulation. The 4 km nested temperatures correspond closely to the coarser modeled temperatures. In general, as for the surface temperature, there is a slight overestimation of the profile temperatures especially in July for all simulations. For the wind speed profiles, at San Diego in January and October, the lower levels are better modeled by the nested simulation than by the coarse simulation. At SMF, the nested simulation helps reduce the modeled wind speed inversion but underestimates the wind speed at mid-level in July. The same phe-

nomenon is observed at San Francisco. For the other time periods and sites, there is little difference between the 4 km and the 12 km simulations.

In general, the nested simulation brings a better agreement than the coarse simulation, especially at San Diego. However, adding nests can also increase the model bias, for example in the mid-level winds at San Francisco or Sacramento.

20 4.4 Effect on the modeling of an inert tracer

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As our ultimate goal is to invert emissions of HFC-134a using WRF simulations and atmospheric HFC-134a measurements, we also examine the modeled HFC-134a concentrations compared to observed HFC-134a concentrations. We focus here on the nesting and boundary condition options shown in the previous two sections. We also add a simulation that includes the chemistry package WRF/CHEM (Grell et al., 2005) to compute tracer transport (P4E12c) while the other simulations use the WRF tracer option to compute tracer transport. The errors in tracer concentration in WRF, as opposed to WRF/CHEM, result from inaccurate treatment of tracer transport. The tracer option



in WRF does not explicitly solve the full advection-diffusion equation for tracer transport (see WRF description report: http://www.mmm.ucar.edu/wrf/users/docs/arw_v3.pdf) but rather simply transports particles by integrating the wind fields computed during each time step. This tracer option is not linked to any physics sub-routines, which means that tracers released at the surface are not appropriately affected by PBL pro-

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- cesses. Within the chemistry module included in WRF/CHEM, vertical mixing of tracers is done separately from the physics package but uses coefficients provided by the physics package. This requires that the PBL scheme is a local closure scheme, such as the MYNN2 scheme that we are using. In addition, some specific physical and dynam-
- ¹⁰ ics options are recommended to be used with the WRF/CHEM module (WRF/CHEM user's manual http://ruc.noaa.gov/wrf/WG11/Users_guide.pdf, which we have implemented. In particular, the cumulus radiation feedback option was activated to avoid surface and skin temperatures that are too high. Advection for the moist, chemical, scalar and tracer variables was changed from positive-definite to monotonic. This cor-¹⁵ rects the tendency of WRF to overshoot and produce unrealistically low local values
- (Peckam et al., 2011). To avoid negative values for variables such as precipitation, the option "mp_zero_out" was activated. As it also applies to the tracer, we chose a threshold value of 1e⁻¹⁶.

The simulated surface temperature and wind shows only slight differences between WRF and WRF/CHEM (not shown) which are likely related to the physical and dynamics options we adjusted for WRF/CHEM. As for the surface data, no substantial differences exist between the simulations with or without chemistry options for the monthly averaged vertical profiles of the wind speed and temperature (not shown). We are therefore confident that our conclusions concerning the validation of the transport in the model are still valid with the WRF/CHEM setup.

In the model, the tracer is initialized with zero values. To compare with the observations, we are plotting the residuals or excess of the observations with the background removed. The residuals are in ppt, that is to say, dry air mole fraction $\times 10^{-12}$. All the simulations follow the same general pattern with lower values in the afternoon and



higher values at night and in the morning (Fig. 7). This pattern corresponds to the diurnal cycle of the PBL height (Fig. 2) as well as the afternoon sea breeze, which tends to bring clean well-mixed air masses to the measurement station at SIO. A large difference between the P4E12c simulation using WRF/CHEM and the other simulations is

- apparent: P4E12c simulates much lower residuals that correspond more closely to the observed residuals (Fig. 7). P4E12c residuals seem to be approximately two times too high in the time series. For the diurnal cycle, however, the median values are closer to the observed values but the quartile position shows that the distribution is skewed with some high outliers, which is consistent with the differences seen in the time se-
- ries. This shows that we cannot just use a scaling factor to estimate the emissions. The observed residuals are the results of a spatial distribution of emissions, which needs to be corrected. The high simulated values result mainly from the San Diego County basin while the low values are simulated in the afternoon, when the air masses are well-mixed and are coming from further away in California (not shown). Qualitatively, it seems that the estimated San Diego County emissions are too large while some of the
- neighboring basins could be underestimated. To estimate the emissions, we need to use a more complex inversion, as well as the second station at Trinidad Head.

4.5 Simulation of a Santa Ana event in December 2009

Santa Ana events are a large-scale weather pattern encountered in Southern California, generally between October and March. They are characterized by a positive pressure gradient from the Great Basin to the coast, which leads to strong winds that transport dry and warm air masses offshore (Raphael, 2003; Hughes and Hall, 2010; Hughes et al., 2011). After such an event, these air masses can also return onshore. In the case of San Diego, this recirculation brings air from the Los Angeles area as well

²⁵ as from the San Francisco Bay area. The air masses therefore contain information at a regional scale that can help us constrain large parts of California.

The Climate Research Division at SIO calculates a Santa Ana index using the pressure gradient between the Ely/Yelland field station in Nevada (38.3° N, 114.9° W) and



the San Diego airport. Data are available publicly for periods beginning in December 2009 (http://meteora.ucsd.edu/weather/other/old_SAIndex/). For this month, a strong Santa Ana event was observed from 19 December to 20 December. In Fig. 8, we plot the simulated (P4E12) surface wind direction and speed, as well as the sea level pressure, on 19 December at 12 p.m. (local time) during the Santa Ana event, and 20 December at 8 p.m. (local time) at the end of the event. As expected, on 19 December, we observe a strong pressure gradient from the northeast to the coast. The simulated pressures in the model grid cell containing Ely and San Diego airport are 1016 and 1022 hPa while the measurements indicate 1014 and 1031 hPa, respectively. This situation leads to strong offshore winds up to 18 ms⁻¹ on the coast near Los Angeles and San Diego. On 20 December, in the evening, the situation has changed. The pres-

and San Diego. On 20 December, in the evening, the situation has changed. The pressure gradient is weaker. The pressures at San Diego and Ely were measured at 1018 and 1022 hPa, while the model computes 1018 and 1018 hPa, respectively. The wind speeds are two to five times slower, and the air masses circle around the ocean and ¹⁵ come back onshore along San Diego coast. This shows that our configuration of WRF is able to reproduce the large-scale meteorological conditions of a Santa Ana event.

In Fig. 9, we examine whether Santa Ana events have strong local signatures in the simulated and observed wind direction, wind speed, temperature at SAN and LAX, and HFC-134a residuals at SIO from 17 December to 23 December 2009. The Santa Ana events are highlighted by the grey shaded areas. At LAX, both the simulated and

- ²⁰ Ana events are highlighted by the grey shaded areas. At LAX, both the simulated and observed wind directions are mainly from the east. The wind speeds are relatively elevated, around 3 m s^{-1} for the simulation and 5 m s^{-1} but higher wind speeds are simulated and observed on 22 December. The simulated and observed temperatures are clearly more elevated during Santa Ana events. After 20 December, the simulated
- and observed temperatures drop quickly. At SAN, the same phenomena are observed for the wind speed and the temperatures. However, the situation is not so clear for the wind direction with a large variability of the observations. Santa Ana events are more visible at LAX than at SAN. However, certain patterns such as the higher temperatures and relatively high wind speed are also observed and simulated at SAN.



In terms of HFC-134a residuals at SIO (La Jolla), observed and simulated residuals are of the same order of magnitude even if large residuals tend to be too large in the simulation. In Fig. 9, the afternoon residual values (between 12 p.m. and 6 p.m.) are highlighted in cyan and black for the simulation and observation, respectively while the

- ⁵ whole data sets are in powder blue and grey. During the successive Santa Ana events, the mixing ratios tend to decrease, especially in the afternoon. This could be explained by the fact that during these days the station receives air masses from the mountains and deserts east of San Diego, where emissions are relatively low. On 21 December, the wind direction in the simulation is from the north, bringing air masses from Los
- ¹⁰ Angeles and the other coastal regions, and the simulated residual peaks at 480 ppt. In the observations, the wind direction oscillates between southeast and northeast and therefore the resulting mixing ratio is lower, but still higher than the day before. Finally, on 22 December, the wind blows strongly from the west, bringing clean air masses, and both simulated and observed residuals are near the background values. From this
- single event, it is difficult to determine the real potential of using this phenomenon into the inversion but it shows promising results.

5 Conclusions

We have evaluated the transport in the WRF model by comparing wind direction, wind speed and temperature at four airports in California, with the goals of assessing bi ases in modeled winds and temperatures and seeing how changing the PBL schemes, the initial and lateral boundary condition datasets, and the model resolution could reduce these biases. We have tested available planetary boundary layer schemes, two initial and lateral boundary condition datasets, and nesting options. No major differences in the temperature and winds arise from using different PBL schemes. Better
 agreement with observations is generally obtained using ERA-interim reanalysis and GODAE SST instead of NAM and RTG_SST as initial and lateral boundary forcings. We also show that increasing the resolution helps to improve the match between observed



and simulated wind and temperature, especially in topographically challenging areas such as the California coast. But no further improvement was found at San Diego for 0.8 km resolution, as compared to 4 km resolution.

We have also looked at the effects of these different approaches on simulations of the inert tracer HFC-134a. We show that tracer transport calculated using the WRF/CHEM model is improved, compared to tracer transport computed with the tracer option in the WRF model. Comparing time series and diurnal cycles, it appears that inversion is needed to be able to the correct emission pattern as the spatial distribution clearly has a large influence on the observations. Finally, we have shown that our model reproduces events like Santa Anas, which is an important pathway for the transport of emissions from large part of California, and especially the Los Angeles area, to our

emissions from large part of California, and especially the Los Angeles area, to observation site in La Jolla.

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Table 1. Simulations. For each simulation, the first letter and number refer to the PBL scheme, the second letter refers to the initial and lateral boundary condition datasets (N for NAM and E for ERA-interim). The last 2 numbers are for the grid resolution (12 for 12 km, 04 for 4 km and 08 for 0.8 km). The small letters b and c indicate respectively a longer simulation and a simulation with chemistry added in comparison to the code without the letter. For each simulation, the PBL scheme, the initial and lateral boundary condition datasets with their spatial resolution, the period of the simulation as well as additional comments are detailed.

Name	PBL scheme	Meteorological data	Grid res (km)	Period	Other
P1N12	YSU	NAM + RTG SST	12	Jan & Aug 09	1st order, non-local closure
P2N12	MYJ	NAM + RTG SST	12	Jan & Aug 09	1.5st order, local closure
P3N12	QNSE	NAM + RTG SST	12	Jan & Aug 09	1.5st order,local closure
P4N12	MYNN2	NAM + RTG SST	12	Jan & Aug 09	1.5st order, local closure
P5N12	ACM2	NAM + RTG SST	12	Jan & Aug 09	1st order, non-local closure
P6N12	BouLac	NAM + RTG SST	12	Jan & Aug 09	1.5st order, local closure
P7N12	UW	NAM + RTG SST	12	Jan & Aug 09	1.5st order, local closure
P8N12	TEMF	NAM + RTG SST	12	Jan & Aug 09	1.5st order, local closure
P4N12b	MYNN2	NAM + RTG SST	12	2009	NAM 12 km, SST 9 km
P4E12	MYNN2	ERA-interim + GODAE SST	12	2009	ERA-interim 80 km, SST 9 km
P4E04	MYNN2	ERA-interim + GODAE SST	4	Jan, Apr, Jul & Oct 09	-
P4E08	MYNN2	ERA-interim + GODAE SST	0.8	Jan & Jul 09	-
P4E12c	MYNN2	ERA-interim + GODAE SST	12	Dec 09	CHEM



Table 2	. Airport	locations.
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Name	Code	Latitude (° N)	Longitude (° E)	Altitude (ma.s.l.)
San Diego	SAN	32.73	-117.19	5
Los Angeles	LAX	33.94	-118.41	38
San Francisco	SFO	37.62	-122.38	4
Sacramento	SMF	38.70	-121.60	8





Fig. 1. WRF domain with the coarse (12 km) domain (d01) and three higher resolution nests (d02 and d03 at 4 km resolution and d04 at 0.8 km resolution). Airports (SAN: San Diego, LAX: Los Angeles, SFO: San Francisco, SMF: Sacramento) are plotted as black dots. The measurement sites of La Jolla (SIO) and Trinidad Head (THD) are indicated by a red dot.











Fig. 3. Diurnal cycle of the surface wind direction, wind speed and temperature for the eight PBL schemes and the observations at San Diego airport in January and August 2009 (local time). For the wind direction, the blue area represents wind from the west while the tan area is for winds from the east. The grey envelope represents the upper and lower quartiles of the observations.





Fig. 4. Vertical profiles of the monthly mean wind speed and temperature averaged over January and August 2009 for the eight PBL schemes and the observations at three of the airports (SAN, SFO and SMF). The profiles go from ground to around 4 km. The grey envelope represents the upper and lower quartiles of the observations.





Fig. 5. Diurnal cycle of the surface wind direction, wind speed and temperature at SAN and SFO for January, April, July and October 2009 (local time) in simulations varying the boundary conditions and nesting options. For the wind speed, the blue area represents wind from the west while the tan area is for winds from the east. The grey envelope represents the upper and lower quartiles of the observations.





Fig. 6. Vertical profile of the monthly mean wind speed and temperature at SAN, SFO and SMF for January, April, July and October 2009 in simulations varying the boundary conditions and nesting options. The grey envelope represents the upper and lower quartiles of the observations. The profiles go from ground to around 4 km.





Fig. 7. HFC-134a simulated and observed residuals (mixing ratios minus background) during four days in January 2009 and diurnal cycle for the whole month at SIO. The grey envelope represents the upper and lower quartiles of the observations around the median. The pink envelope represents the upper and lower quartiles of the simulations without chemistry. The upper and lower quartiles for P4E12c are indicated by vertical bars.





Fig. 8. Surface wind and sea-level pressure maps above California for 19 and 20 December 2009 at noon (local time) for the P4E12c simulation. For the wind, the direction is indicated though arrows while the speed is plotted in a color scale.







