Copernicus Atmosphere Monitoring Service - Regional Air Quality Production System v1.0

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Abstract

The Copernicus Atmosphere Monitoring Service (CAMS) delivers a wide range of free and open products in relation to atmospheric composition at global and regional scales. The CAMS Regional Service produces daily forecasts, analyses, and reanalyses of air quality in Europe. This Service relies on a distributed modelling production by eleven teams in ten European countries: CHIMERE (France), DEHM (Denmark), EMEP (Norway), EURAD-IM (Germany), GEM-AQ (Poland), LOTOS-EUROS (The Netherlands), MATCH (Sweden), MINNI (Italy), MOCAGE (France), MONARCH (Spain), and SILAM (Finland). The project management and coordination of the service is devoted to a Centralised Regional Production Unit. Each model produces every day 24h analyses for the previous day and 97h forecasts for 19 chemical species over a spatial domain at 0.1x0.1 degree resolution (approximately 10km x 10km) with 420 points in latitude and 700 in longitude and 10 vertical levels. Six pollen species are also delivered for the surface forecasts. The eleven individual models are then combined into an ENSEMBLE median. In total, more than 82 billion data points are made available for public use on a daily basis.

The design of the system follows clear technical requirements in terms of consistency in the model setup and forcing fields (meteorology, surface anthropogenic emission fluxes, and chemical boundary conditions). But it also benefits from a diversity in the description of atmospheric processes through the design of the eleven European Chemistry Transport Model (CTM) involved.

The present article aims to provide a comprehensive technical documentation, both for the setup as well as for the diversity of CTMs involved in the Service. We also include an overview of the main output products, their public dissemination and the related evaluation and quality control strategy.

1 Introduction

The Copernicus Atmosphere Monitoring Service (CAMS, atmosphere.copernicus.eu/) is the core global and regional atmospheric environmental service operated by the European Centre for Medium-Range Weather Forecast (ECMWF) within the European Union Copernicus Earth Observation Programme. It provides a wide range of free, open, and quality assured products in relation to global and regional air quality, inventory-based emissions, observation-based surface fluxes of greenhouse gases and from biomass burning, solar energy, ozone and UV radiation, and climate forcings (Peuch et al., 2022).

We focus here on the regional production service (https://atmosphere.copernicus.eu/european-air-quality-forecast-plots/) which provides daily 4-day forecasts of the main air quality species and analyses of the day before, as well as posterior re-analyses using the latest observation datasets available for assimilation. It constitutes today the reference air quality forecasting system at European scale by building upon a distributed production of eleven chemistry transport models operated in ten European countries, with a Centralised Regional Production Unit to ensure a consistent implementation. Such a comprehensive air quality forecasting system operated at continental scale has no equivalent in the world.

Air quality monitoring and forecasting constitute an essential activity to improve the knowledge of atmospheric composition and air pollution patterns and identify short and long-term mitigation strategies. In the European legislation, the Directive (Ec, 2008) on ambient air quality and cleaner air for Europe of the European Parliament and of the European Council, defines limit and target values for regulatory ambient air concentrations and improvement of ambient air quality to avoid, prevent or reduce harmful effects on human health and the environment. To this end, it sets out the methodological requirements for the assessment of ambient air quality in Member States which are based on the implementation of adequate monitoring systems, typically relying on reference and standardised instruments operated at air quality monitoring stations whose data are reported to the Air Quality e-reporting database maintained by the European Environment Agency (which subsequently makes the data publicly available). A revision of the Ambient Air Quality Directive was adopted by the European Council in October 2024, the revision includes amongst other features, a stronger emphasis on the use of air quality models as well as an explicit reference to the Copernicus Atmosphere Monitoring Service as a trusted source of information products and supplementary tools to support reporting activities in relation to forecasting and management of air pollution episodes.

Modelling comes as a complementary information on ambient air quality. Fitness for forecasting purposes of air quality modelling has been widely documented (Zhang et al., 2012a, b), but air quality models are also essential to produce exposure maps through data assimilation or data fusion. In such processes, the prior modelled estimates of surface air concentrations of the main air pollutants are combined with in situ or remote sensing observations to produce improved mapping of air pollution, typically for use in health impact assessment or epidemiological studies (Shaddick et al., 2020). Air quality modelling and reanalyses are also typically used to anticipate ex-ante and assess ex-post the effectiveness of policy mitigation strategies. The

projections and hindcasts performed in the framework of the Convention on Long Range Transboundary Air Pollution (CLRTAP) of the United Nations Economic Commission for Europe Geneva Air Convention and its Gothenburg Protocol constitute a good example of atmospheric modelling activities in support of policy decisions at European scale (Maas and Grennfelt 2016).

Whereas several European countries or selected metropolitan areas operate their own air quality modelling system, there is also a need to produce air quality forecasts and analyses over the whole European continent: to provide background data for those local systems (chemical boundary conditions), for the areas not covered by any national system, or just as complementary information. The Copernicus Atmosphere Monitoring Service has played that role since 2015. It builds upon the earlier research and development phases initiated since 2005 through European collaborative research and innovation projects: GEMS (Hollingsworth, 2008) and MACC, MACC-II, and MACC-III (Marécal et al., 2015; Peuch et al., 2014).

The unique setup of the system allows it to reach an unprecedented level of quality and robustness by relying on a set of stringent common requirements combined with a large variety of Chemistry-Transport Models (CTMs). Since 2022, an ensemble of eleven CTMs have been used: CHIMERE (INERIS, France), DEHM (Aarhus Univ., Denmark), EMEP (Met Norway), EURAD-IM (Forschungszentrum Juelich, Germany), GEM-AQ (IEP-NRI, Poland), LOTOS-EUROS (TNO and KNMI, The Netherlands), MATCH (SMHI, Sweden), MINNI (ENEA, Italy), MOCAGE (Météo-France, France), MONARCH (BSC, Spain), and SILAM (FMI, Finland). Using an ensemble of CTMs allows at the same time to minimize the risk of failure in the daily operational production, and to increase the skill of the forecast (Galmarini et al., 2013). But consistency in the implementation is key to ensure the continuous improvement of the system, hence the crucial role of the CAMS Regional Central Production Unit led by Météo-France and INERIS.

Each model delivers every day 24h analyses and 97h forecast for 19 chemical species over a spatial domain at 0.1x0.1 degree resolution (approximately 10km x 10km) with 420 points in latitude and 700 in longitude and 10 vertical levels. Additionally, surface forecasts of six pollen species are delivered. With the 11 individual models and one ENSEMBLE median, it is a total of almost 82 billion data point made available for public use every day.

The results of the CAMS Regional Service are made publicly available as quick looks on the website atmosphere.copernicus.eu/european-air-quality-forecast-plots and the numerical outputs are disseminated on the Copernicus Atmosphere Data Store (ADS): ads.atmosphere.copernicus.eu. The typical use of the forecasts is as background information used by national and local air quality agencies, in addition to their knowledge about specific local air pollution sources. This can be done either qualitatively by the consultation of available online viewers, or by using the numerical data to feed downstream chemistry-transport, gaussian, or machine-learning models. The use of reanalyses is rather for policy applications

(for regulatory reporting obligations or to assess the impact policy interventions through trends analyses) or exposure assessment in health impact studies.

The aim of the present article is to provide a transparent and detailed documentation to serve as a reference for the user of CAMS Regional Air quality Products. It constitutes an update of the previous similar article devoted to the MACC regional forecast system (Marécal et al., 2015), whereas the system was still in research mode at the time and not fully operational. A focus on regional activities within the overall CAMS portfolio was also described in (Peuch et al., 2022). The CAMS Regional production system has evolved continuously over the past. In the present article, we provide a detailed description of the system as it stands in 2024. But since the near real time production of forecast and analysis remains available for public use with a 3-year retention time, and reanalysis data remain available since the beginning of the production, we also provide some information about the major evolutions in the recent past.

The main characteristics of the centralised production system are introduced in Section 2. This section covers the overall production workflow, but also the common features and requirements which apply to the distributed production of individual modelling teams such as the common external forcing data. Since the use of an ensemble of eleven different chemistry transport models is an important specificity of the service, we devote a large part of the paper in Section 3 to summarize the formulation of each model and how they adapt specifically to the requirement of the CAMS Regional Production System. The post-processing as well as some elements regarding the evaluation and quality control or the main uses of the production are presented in Section 4. In the conclusion (Section 5) we refer to the short and long-term development priorities to ensure the performance and sustainability of the system over the long term.

2 Centralised Regional Production Unit

2.1 Organisation of the production system

The CAMS regional production relies on a quite unique ensemble of 11 individual models whose daily operation is distributed amongst 11 modelling centres in ten European countries. The coordination is handled by the Central Regional Production Unit (CRPU) which is led by Météo-France, with the support of INERIS for model development matters and reanalysis production (Figure 1).

The CRPU defines the design of the regional production system under the auspices of ECMWF. This includes setting the guidance and requirements for the implementation of individual models as well as continuous evolution in order to maintain the system within the state of the art. The CRPU is also in charge of contractual matters and relations with the providers of input data as well as the delivery of model results to the Atmosphere Data Store for public use (Section 4.3).

In earlier MACC phases and the first CAMS regional project, only 7 models were contributing to the distributed operational production: CHIMERE, EMEP, EURAD-IM, LOTOS-EUROS, MATCH, MOCAGE, and SILAM. As of October 2019, DEHM and GEM-AQ joined the operational system. As of June 2022, MINNI and MONARCH joined the production.

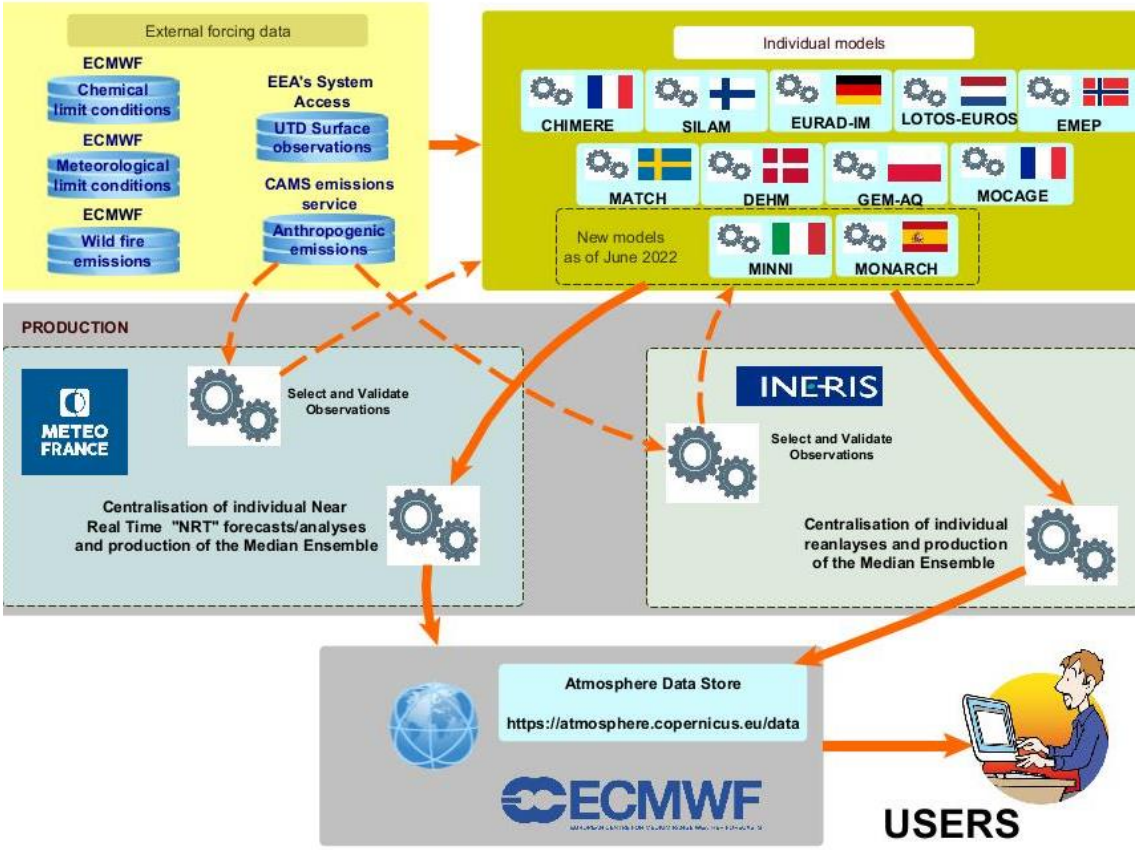

Figure 1: Schematic of the CAMS Regional Production workflow. Top-left the external forcings (anthropogenic emissions, meteorology, boundary conditions) and in-situ observations for assimilation and evaluation. Top right: eleven regional chemistry-transport model operated in ten European countries. Middle: Meteo-France (for the near real time) and INERIS (for the reanalysis) centralise the individual productions. Bottom: the results are disseminated to the Atmosphere Data Store.

2.2 Modelling products

The CAMS regional system includes both daily 4-days forecasts and several analysis products. All of them are provided from both eleven individual CTMs results and an ENSEMBLE product which is constituted by the median of individual models at each grid point (See also Section 4 on post-processing).

Hourly near-real time forecasts (NRT/FC) are released every day with a 4 days horizon (from 0 to 96hrs forecasts). They rely on chemistry-transport outputs, some of which are initialised on the basis of the previous analysis (see details in Section 3). The ENSEMBLE NRT/FC fields are made available publicly each day at 08:00 UTC for forecast horizon 0 to 48hrs (day 1

and day 2), and at 10:00 UTC for forecast horizon 49 to 96hrs (day 3 and days 4). All the forecasts are initiated at 00 UTC, the differentiated timing for the 48hr or 96hr lead time is only to account for longer production times.

The list of output species has been expanding gradually over the years. The choice of selected species accounts for user requests, especially with regards to downstream modelling needs (in the case where the CAMS regional system is used as forcing boundary conditions for smaller scale nested models), understanding air pollution episodes, and availability of observation data for evaluation and quality control (which is essentially focusing on PM_{10}, $PM_{2.5}$, NO_2, O_3 and pollens at present, but research grade measurement of the EMEP Monitoring Programme or the ACTRIS European Research Infrastructure are consider to strengthen the quality control procedures).

As of April 2025, the list of species in the NRT/FC includes the following gases: ozone (O_3), nitrogen oxide (NO), nitrogen dioxide (NO_2), carbon monoxide (CO), sulphur dioxide (SO_2), glyoxal (CHOCHO), formaldehyde (HCHO), ammonia (NH_3), total Non-Methane Volatile Organic Compounds (NMVOC, defined as the sum of the mass of the carbon atoms of all the VOC species of the chemical scheme of the model, excluding the methane and PANs species, and expressed in unit $\mu g/m^3$ of carbon atoms), and total Peroxy-Acetyl Nitrates (PANs). Particulate matter (PM) are included as : $PM_{2.5}$ (smaller than 2.5µm), PM_{10} (smaller than 10µm). The following tracers in the $PM_{2.5}$ fraction are also provided: sulphate (SO_4^{2-}), nitrate (NO_3^-), ammonium (NH_4^+), total secondary inorganic aerosols (SIA), total elemental carbon (EC), EC fraction related to residential emissions, total organic matter. In the PM_{10} fraction, the tracers include desert dust, sea salt and wildfires. In addition, six pollen species are included: birch, olive, grass, alder, mugwort and ragweed.

Hourly near-real time analysis (NRT/AN) are released each day by 12:00 UTC for the previous day. Here, each individual model is corrected to minimise error with observed air pollutant concentrations over Europe. For the latest reanalysis available on the ADS as of January 2024 (covering the year 2021), the list of species is: for O_3, NO, NO_2, CO, NH_3, NMVOC, PM_{10}, $PM_{2.5}$, PM_{10} wildfires, PM_{10} dust, EC total, EC residential, PAN, SIA, SO_2. For earlier years, not all of these species are available, and in the future the list will continue expanding to catch up with the full species set in the daily forecast production. Note that observations are available for assimilation only for NO_2, O_3, PM_{10}, and $PM_{2.5}$. Individual components contributing to the total PM_{10} or $PM_{2.5}$ mass are scaled according to the assimilation of total PM_{10} or $PM_{2.5}$ measurements, and pollen species are not assimilated.

The daily analyses products are supplemented by an interim reanalysis (IRA) and a validated reanalysis (VRA). Both rely on the same modelling tools as the NRT production, including assimilation strategy. But the observations taken into account differ. Acknowledging that for the NRT/AN production some observations can be missing or not validated, daily analyses are reproduced with a 20 days delay in the IRA. This time gap is considered sufficient to fix most failures in NRT data flows and maximise the number of available measurement data. The interim reanalysis is subsequently consolidated and delivered in the

first months of Y+1. Since all observations are only definitively validated by European member states by the end of the following year (Y+1), the full year Y is reprocessed in Y+2 to produce the VRA of the corresponding year. As for NRT, the production of IRA/VRA is also distributed across individual modelling teams which operate their own modelling system. The CRPU (INERIS in the case of reanalyses) defines the common requirements in terms of model setup, input data (meteorology, emissions, and assimilated observations) and centralised the verification and production of the ENSEMBLE product.

2.3 Air quality observations

The gathering, filtering and selection of observations is centralised by the CRPU and subsequently disseminated to individual modelling teams which apply different assimilation algorithms even though the exact same stations are assimilated by each model (see details in Section 3). All observation data are obtained from the Air Quality e-reporting database[1] maintained by the European Environment Agency where near real time "up-to-date" (UTD) and validated observations are reported, in particular for countries of the European Union which are expected to do so with respect to the European Directives.

An important step lies in the filtering and selection of data. For the NRT production (both FC and AN), the stations are clustered using an objective classification which consists in building classes of stations which exhibit similar patterns of temporal variability to differentiate background and proximity stations (Joly and Peuch, 2012). Originally (when the model had a resolution of approximately 20x20km2), only the stations corresponding broadly to suburban and rural typologies were included. But since November 2020, all stations falling in classes 1-7 of the Joly & Peuch classification are included, which means broadly that urban background sites are taken into account while traffic and industrial sites are excluded. This way, even if the spatial resolution of the CAMS Regional Production is 10x10km, we ensure the relevance of the modelling setup to capture urban background air quality.

The design and use of this objective classification is particularly useful in NRT applications, which includes more outlying data than the reanalyses. Such NRT applications are also less used for regulatory applications for which reanalyses are preferred. This is why, the station classification in IRA and VRA follows the standard typology declared by the member states in their reporting (even if it is admitted that it is not exempt from misclassification). In VRA and IRA, stations labelled are traffic and industrial are strictly excluded and only background (urban, suburban, and rural) stations are included.

Approximately 2-third of the stations' data are distributed by the CRPU for assimilation (both for NRT/AN and IRA&VRA), while the rest of the data are kept for evaluation (see Section 4.2).

[1] https://www.eea.europa.eu/data-and-maps/data/aqereporting-9, last accessed 30/10/2024

This splitting is first performed using the station list used for VRA and IRA, therefore using only the sites for which member states declared the typology as "background" that are available for the previous years (year-1 for IRA (Y-1) and year-2 for VRA (Y-2)). Stations with less than 1 months of data are removed. The first prerequisite is to treat collocated stations together for the pollutant pairs NO_2/O_3 and $PM_{10}/PM_{2.5}$. This prevents, for example, having the same station for NO_2 assimilation and O_3 evaluation. The second prerequisite is to use a random selection process to ensure a good spatial coverage of stations in the two listings. However, the construction of the assimilation and validation station sets is not entirely random: evaluation stations are always selected near assimilation stations, while spatially isolated stations (typically in remote areas of Europe) are used for assimilation. This classification is revised on an annual basis for each new production cycle of IRA and VRA to take into account the evolution of the network.

The splitting obtained for the VRA and IRA production is subsequently translated for the NRT production. All the stations from classes 1 to 7 belonging to the set of evaluation of VRA/IRA are tagged for NRT evaluation and all the stations that do not belong to the evaluation of VRA/IRA are tagged for NRT assimilation (AN).

At present there is no centralisation of the dissemination of any satellite observation of atmospheric composition even if many individual modelling teams already assimilate satellite data, and this is expected to further develop in the coming years (See details in the presentation of individual models in Section 3).

2.4 Modelling domain

The modelling domain covers Europe within 25°W to 45°E longitude and 30°N to 72°N latitude at a 0.1°x0.1° resolution. Whereas in earlier phases of the project some individual models were operating at slightly lower resolution (about 0.2°), today all models operate on a native resolution of about 0.1°. Covering the whole region is a strong requirement, and all models deliver data over the entire domain, which means that some of them perform the forecast on a slightly larger domain in order to include a buffer area or cope with differing geographic projection (see details in Section 3). The spatial extent has evolved marginally in recent years, it was only reaching up to 70°N until June 2019.

The strategy for the vertical discretisation is left open for individual contributing models, but there is a common requirement in the delivery of model results on common vertical levels. As of January 2024, the complete list of vertical levels is: surface, 50m, 100m, 250m, 500m, 750m, 1000m, 2000m, 3000m, and 5000m above ground. This has evolved substantially in recent years, only surface concentrations were provided in the earlier phases of CAMS, and different lists of vertical levels have been archived in the past for near real time forecast, analyses, and reanalysis products.

2.5 Meteorology and chemical boundary conditions

The meteorological fields used to force the individual operational CTMs are from the European Centre for Medium-Range Weather Forecasts (ECMWF) operational meteorological forecasts at high resolution based on the IFS model (Integrated Forecasting System). The spatial resolution of the IFS forecast has increased in time, it is about 9km as of 2024. The exact list of meteorological parameters used to drive the individual CTMs differs depending on the models (see details in Section 3). Most of them use the forecast starting at 12:00 UTC on D–1 but there might also be some deviations to account for operational constraints.

The chemical boundary conditions are also obtained from ECMWF but using the configuration including chemistry of the IFS: IFS-COMPO referred to as CAMS-Global in this article (Flemming et al., 2015; Rémy et al., 2019) operating at approximately 40km spatial resolution. CAMS-Global runs forecasts twice daily from 00 and 12 UTC and the data are available every hour (for surface fields) and every 3 hours (for above surface model- and pressure-level fields). The model results are made available for further use as boundary conditions of regional models through different dissemination routes including the MARS archive server of ECMWF, a dedicated ftp access for the regional CAMS operational models, and the atmosphere data store (ADS) of Copernicus.

The list of species used as boundary conditions for the regional CAMS models is given in Table 2. Further details are available through the CAMS User Support website[2] and (Morcrette et al., 2009). All aerosol species are provided as dry PM, except for sea salt, whose mass and size is provided at a relative humidity of 80%. The mass of the corresponding dry sea salt is 1/4.3 smaller and the radius is half of the sea salt at relative humidity of 80%.

2.6 Surface emissions

2.6.1 Anthropogenic emissions

Using identical anthropogenic emissions in all the eleven individual models is essential for the consistency of the CAMS Regional products. The so-called TNO-MACC-III (Kuenen et al., 2014) emission inventory was used for several years in the past. Since June 2019, it has been replaced by the CAMS-REG emissions inventory, which is regularly updated (Kuenen et al., 2022). The CAMS-REG inventory is based on official national totals of air pollutant emissions reported in compliance with the European Directive on National Emission Reduction Commitments (2016/2284/EU) and the Gothenburg Protocol of the LRTAP Convention. Additional processing is applied to ensure consistency in the dataset by making corrections and performing some gap-filling where information is missing. A consistent spatial distribution for gridded emission datasets is

[2] https://confluence.ecmwf.int/display/CKB/CAMS%3A+Global+atmospheric+composition+forecast+data+documentation (last accessed 30/10/2024)

applied at 0.05° × 0.1° resolution. Since June 2021, the CAMS Regional production has used an improved version of the CAMS-REG inventory which substituted national estimates of wood burning emission in order to cope with a well-established inconsistency in the reporting of condensable emissions (Denier Van Der Gon et al., 2015).

The use of officially reported emissions induces a subsequent delay in the successive updates of the emission datasets. The Emissions for year Y, are reported in March Y+2. Then they undergo verification, gap filling and spatialisation before being considered for implementation in the CAMS Regional production. The emissions being used for the day-to-day forecasts are thus generally based on national emissions reported about 3 years earlier. In order to cope with this limitation, the CAMS-REG emission inventory developed a methodology to extrapolate the officially reported emissions to the most recent historical year. The methodology basically consists in two steps. First, early available relevant activity data for different sectors are used to extrapolate the trend in the activity, which are used to adjust future emissions. Second, for the historical years for which emission data are available from CAMS-REG the trend in these is compared to the trend in the activities. If a significant trend is found (here defined as >3% per year) the trend in the implied emission factor is determined by taking the ratio of the trend in emissions and in activities, which is then projected into the future. The methodology has been validated for historical years and overall works well, but such a method has also limitations, for instance it is not possible to predict sudden events such as closure of power plants or industrial facilities, or implementation of emission reduction techniques in large facilities. This way, the emission implemented in late 2024 in the regional production could be based on an estimate for the year 2023 (CAMS-REG v7.1).

The common requirement to use CAMS-REG emissions in all CTMs is strictly enforced for the forecast. For the analysis, in one of the models (Table 1) analysed concentrations are pulled away from the state that is physically related to the emissions and therefore will not be strictly relatable anymore to specified required emissions. But none of the models use inverse modelled emissions based on observation in the forecast.

Only the spatialised annual fluxes of NO_x, SO_x, NMVOCs, NH_3, CO, PM_{10} and $PM_{2.5}$ emissions are prescribed for all models. The subsequent disaggregation required in CTMs in terms of (i) hourly/daily/weekly/monthly profiles, (ii) vertical injection height, and (iii) mapping towards model chemical species is left open for individual modelling teams. Default information is nevertheless provided regarding the temporal disaggregation (Guevara et al., 2021) as well as the speciation of total VOC or total PM on individual VOC species or aerosol species, respectively. NMVOC emissions in CAMS-REG are provided with year-, sector- and country-dependent speciation profiles to breakdown total NMVOC to the 25 Global Emission InitiAtive (GEIA) species, originally defined under the REanalysis of the TROpospheric chemical composition (RETRO) project (Schultz et al., 2007). Each CAMS individual modelling team performs a remapping of the 25 GEIA NMVOC species to the species of their corresponding gas phase chemical mechanism. Concerning PM, the default profiles provided in CAMS-REG allow splitting coarse and fine PM emissions to primary organic carbon, elemental carbon, sulphates, sodium and others.

2.6.2 Biogenic, natural and wildfire emissions

Biogenic emissions are left to the choice of individual operational models, most of which include their own online calculation of emissions from vegetation and other natural sources. They include soil emissions for (i) mineral dust resuspension, (ii) soil NOx or even (iii) sea salt within the European domain, but the agriculture related NH3 emissions are issued from the anthropogenic emission inventory.

The only coordination regarding ecosystem emissions concerns wildfires where all models are expected to use the Global Fire Assimilation System (GFAS) product (Kaiser et al., 2012) provided by CAMS. GFAS is based on fire radiative power retrievals from data of the Moderate Resolution Imaging Spectroradiometer (MODIS) instruments aboard the Terra and Aqua satellites. GFAS provides hourly emission data with a 8-hr delay compared to real time. Each individual modelling team retrieves GFAS emission when initiating their forecast. As the individual forecasts are initiated between 12:00 D-1 and 03:00 D+0 depending on the regional systems, the only full day where GFAS wildfire emissions are available is D-2, and some systems also include part of D-1 emissions. Each system therefore reconstructs a 24hr cycle of emission based either on D-2 only or also including part of D-1 emissions. This cycle is used by all models for their analysis of D-1. For the forecast, persistence of this daily cycle of emission is only maintained for D+0 and D+1 considering that the vast majority of wildfires in Europe are not persisting for longer time periods.

2.6.3 Pollen emission and dispersion

The following pollen species are included in the CAMS Regional production: birch, grass, olive, ragweed, alder, and mugwort. Their implementation in the individual operational CAMS models differ in terms of advection and deposition strategies, but as for the anthropogenic air pollutants, the emission terms are coordinated following the original documentation of (Sofiev et al., 2013) and subsequent updates for additional species. The pollen species differ in terms of their geographic distribution (source masks), total amount of available pollen grains, start and end date of the season (heatsum thresholds), and the shape of the season (source strength as function of time). The alder pollen emission model is similar to that of birch and olive, while the mugwort source is a variation of the grass source. However, mugwort is implemented as five different sub-species, each with its own spatially gridded start and end dates of the flowering season. Ragweed pollen follows the method described in (Prank et al., 2013).

Once emitted, pollen species are advected in the model in the same way as other chemically inert species and are subject to gravitational settling and wet scavenging over time.

3 Individual Model Description

3.1 CHIMERE

3.1.1 Model Overview

CHIMERE is a multi-scale CTM developed jointly by INERIS and CNRS (Menut et al., 2021). Its development was initiated in the early 2000s (Bessagnet et al., 2004; Vautard et al., 2005) and it has since then pioneered operational national air quality forecasting in France (Rouïl et al., 2009). It is also extensively used for long-term simulations for emission control scenarios (Colette et al., 2013; Meleux et al., 2007; Colette et al., 2015). It runs over a range of spatial scale from the hemispheric to the urban scale, with resolutions from 100km to 1km (Colette et al., 2014; Bessagnet et al., 2017). The exact model version used since June 2021 in the CAMS Regional Production is CHIMERE v2020r1.

3.1.2 Model geometry

For the CAMS regional forecasts, CHIMERE uses a regular latitude-longitude grid with a 0.1°x0.1° resolution which covers 25˚W to 45˚E and 30˚N to 72˚N and 9 vertical levels, extending from the surface up to 500 hPa, a lowermost layer about 20m deep and about 7 layers below 2 km. No vertical downscaling is applied and concentrations in the lowermost model layer are considered representative of the surface.

3.1.3 Forcing Meteorology

The forcing meteorology is retrieved from the IFS model vertical layers covering the CHIMERE vertical extent on a 0.1°x0.1° horizontal grid resolution with a temporal resolution of 3 hours. The forecast released at 00:00UTC of the previous days is used. The three-dimensional meteorological parameters included to force the CHIMERE forecast are horizontal wind components, temperature, specific humidity, orography, rain water/snow mixing ratios, cloud liquid and ice water contents. The 2D variables included are: surface temperature, surface pressure, large scale and convective precipitations, boundary layer height, sensible and latent heat fluxes at surface, surface solar radiation downwards, soil parameters (water and temperature) for 4 layers (0-7 cm, 7-28 cm, 28-100 cm, 100-255 cm), sea ice cover, and snow depth.

3.1.4 Chemical initial and boundary conditions

Lateral and top boundary conditions are taken from chemical species available in CAMS-Global forecast model of the previous day at 3hr temporal resolution. The full list of species used from CAMS-Global is given in Table 2. The forecasts are initialised by the CHIMERE forecasts of the previous day.

3.1.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Temporal disaggregation is based on TNO time profiles provided with CAMS-REG. Chemical disaggregation for VOCs is based on (Passant, 2002). PM components are speciated using the splits provided with the CAMS-REG database.

Biogenic VOC emissions are computed online with the MEGAN 2.10 algorithm (Guenther et al., 2012) implemented in CHIMERE and using high spatiotemporal data LAI (30 arcsec every 8 days) generated from MODIS (Yuan et al., 2011). Biogenic emission factors are estimated based on the 30 arcsec USGS (US Geophysical Survey) land-use database and the emission factors provided for each functional type by (Guenther et al., 2012).

The hourly GFAS wildfire emission for D-2 (i.e. the last full day available when launching the forecast system) are used for the analysis (D-1) and the first two days of the forecast (D+0 and D+1). Fire emissions are set to zero for the remainder of the forecast horizon.

Dust production within the European domain is included (Alfaro and Gomes, 2001). It is based on a scheme for saltation and a vertical flux estimate using cohesion kinetic energies scheme (Marticorena and Bergametti, 1995).

3.1.6 Solver, advection and mixing

The numerical time solver is based on a splitting operator which solves separately transport (including deposition and emissions), chemistry and aerosol formation.

Advection is based on the Piecewise Parabolic Method 3d order scheme (Colella and Woodward, 1984). Vertical turbulent mixing takes place only in the boundary layer. The formulation uses K-diffusion parameterisation (Troen and Mahrt, 1986), without counter-gradient term.

3.1.7 Deposition

Dry deposition of gaseous and particle species is parameterised as a downward flux out of the lowest model layer where the deposition velocity is described through a resistance analogy (Wesely, 1989). Wet deposition of particles and gases are computed by using a polydisperse distribution of rain droplets based on (Willis and Tattelman, 1989) and by computing the efficiency of the collision. Below-cloud scavenging of gases is assumed irreversible and is therefore only accounted for the most soluble compounds (HNO_3, H_2O_2, HCl, SO_2 and NH_3). In-cloud scavenging is accounted for all gases by computing the gaseous and aqueous phases partitioning based on Henry's law constants and the pH of the clouds. Scavenging by snow is also accounted for and is based on (Chang, 1984) for gases and on (Wang et al., 2014) for particles.

3.1.8 Chemistry and aerosols

In order to optimise computing time, the reduced MELCHIOR2 mechanism with 44 species and about 120 reactions is derived from the full mechanism MELCHIOR (Derognat et al., 2003). The sectional aerosol module accounts for 7 species and 10 bins from 10nm to 40µm (primary particle material, nitrate, sulphate, ammonium, biogenic secondary organic aerosol SOA, anthropogenic SOA and water). Photolytic rates are attenuated using liquid water and relative humidity. The aerosol module is described in great details in (Couvidat et al., 2018) and accounts for condensation, nucleation, and condensation/evaporation. Aerosol thermodynamic equilibrium is achieved using the ISORROPIA model version 2.1. The secondary organic aerosol formation mechanism used in the operational forecasting version of CHIMERE is described in (Bessagnet et al., 2008).

3.1.9 Assimilation system

The CHIMERE assimilation for operational purposes relies on a kriging based approach to assimilate hourly concentration values for correcting the raw model results. For the analysis period, linear regression between a selected set of observations (excluding mountain and proximity sites) and the raw CHIMERE model is performed (in moving neighbourhood). The experimental variogram of the regression residuals is then computed and a variogram model is fitted; the model adequacy is checked by cross validation. Ultimately, observations are kriged with the CHIMERE model as external drift (in moving neighbourhood). This method is applied for O_3 and NO_2. For PM_{10} and $PM_{2.5}$, an ordinary co-kriging of the observations (main variable) and CHIMERE (secondary variable) is applied to ensure consistency between both pollutants. Only in-situ surface observations are used.

Further evolution of the CHIMERE assimilation system using an ensemble Kalman Filter approach is under development, in particular to pave the way for assimilation of satellite data. It is has however not yet demonstrated to provide better skill score than the geostatistical method.

3.2 DEHM

3.2.1 Model Overview

The Danish Eulerian Hemispheric Model (DEHM) is a 3-dimensional, offline, large-scale, Eulerian, atmospheric chemistry transport model developed to study long-range transport of air pollution in the Northern Hemisphere. DEHM was originally developed in the early 1990's in order to study the atmospheric transport of sulphur-dioxide and sulphate into the Arctic (Christensen, 1997; Heidam et al., 2004). The model has been modified, extended and updated continuously since then and now includes a flexible setup with the possibility for nested domains with higher resolutions over targeted areas (Brandt et al., 2012; Geels et al., 2021). Apart from standard air pollution components and pollen, the DEHM model also includes mercury (Christensen et al., 2004), CO_2 (Lansø et al., 2019) and POPs (Hansen et al., 2008).

3.2.2 Model geometry

The horizontal domain is defined on a regular latitude-longitude grid of 0.1° resolution with grid centre points covering longitude 24.95˚W to 44.95˚E and latitude 30.05˚N to 71.95˚N. The vertical discretization is defined on 29 terrain-following sigma levels up to about 100hPa. The 12 lowest layers are within the lowest 1 km of the atmosphere and the thickness of the lowest layer is about 20m. The model includes an option for downscaling to the surface, but this is not applied in the operational setup.

3.2.3 Forcing Meteorology

The forcing meteorology is retrieved from the IFS model vertical layers covering the DEHM vertical extent on a 0.2°x0.2° horizontal grid resolution with a temporal resolution of 3 hours. The forecast released at 12:00 UTC of the previous days is used. The meteorological parameters included to force the DEHM forecast are: 3D fields of the horizontal wind components (U,V), temperature, specific humidity, cloud liquid water contents, cloud ice water contents, rain water contents, snow water contents and fraction of cloud cover. The 2D fields are land-sea mask, surface pressure, geopotential height, skin temperature, Ustar, large scale and convective rain, snow depth, sensible heat flux, latent heat flux, net solar radiation, boundary layer height, 2 m temperature, 2 m dew point temperature, 10 m wind (U,V), albedo, sea ice area fraction and surface roughness.

3.2.4 Chemical initial and boundary conditions

Lateral and top boundary conditions are taken from chemical species available in CAMS-Global forecast model of the previous day at 3 hr temporal resolution. The full list of species used from CAMS-Global is given in Table 2. The DEHM forecasts are initialised by the DEHM forecasts of the previous day.

3.2.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Originally the temporal disaggregation was based on the GENEMIS tables, using a GNFR to SNAP matrix. From 2021 the new CAMS-TEMPO (Guevara et al., 2021) profiles for annual, monthly, weekly and daily distribution of emissions have been included in the operational version of DEHM. PM components are speciated using the splits provided with the CAMS-REG emissions. The speciation of VOCs from the emission input of total non-methane VOCs is based on the global speciated NMVOC emission database EDGAR 4.3.2 (Huang et al., 2017).

Natural emissions of the Biogenic Volatile Organic Compounds (BVOCs) isoprene and monoterpenes are estimated in the DEHM model based on the MEGAN model (Zare et al., 2012). The production of sea salt aerosols at the ocean surface is based on two parameterisation schemes describing the bubble-mediated sea spray production of smaller and larger aerosols. In each time step, the production is calculated for 10 size bins and thereafter summed up to give an aggregated production of fine (with dry diameters <1.3 um) and coarse (with dry diameters ranging 1.3-6µm) aerosols (Soares et al., 2016). NOx emissions from soil are based on data from the Global Emissions Inventory Activity (Yienger and Levy, 1995) and from lightning they are from (Price et al., 1997).

The hourly GFAS wildfire emissions are retrieved as soon as they are available (i.e. with a 8-hr delay from real time) in order to obtain a recent 24hr cycle spanning over D-2 and D-1. This cycle is used for the analysis (D-1) and the first two days of the forecast (D+0 and D+1). Fire emissions are set to zero for the remainder of the forecast horizon. Hourly injection heights are calculated based on the hourly data of 'Mean altitude of maximum injection' and 'Altitude of plume top'.

3.2.6 Solver, advection and mixing

The horizontal advection is solved numerically using the higher order Accurate Space Derivatives scheme, documented to be very accurate (Dabdub and Seinfeld, 1994), especially when implemented in combination with a Forester filter (Forester, 1977). The vertical advection as well as the dispersion sub-models is solved using a finite elements scheme (Pepper et al., 1979)for the spatial discretization. For the temporal integration of the dispersion, the q-method (Lambert, 1991) is applied and the temporal integration of the 3-dimensional advection is carried out using a Taylor series expansion to third order. Time integration of the advection is controlled by the Courant-Friedrich-Lewy (CFL) stability criterion. A wind adjustment is included in order to ensure mass conservation.

The vertical diffusion is configured by Kz profiles (Hertel et al., 1995), based on Monin-Obukhov similarity theory for the surface layer. This Kz profile is extended to the whole boundary layer by using a simple extrapolation, which ensures that Kz

is decreasing in the upper part of the boundary layer. The planetary boundary layer (PBL) height is obtained directly from the IFS meteorology.

3.2.7 Deposition

Gaseous and aerosol dry-deposition velocities are calculated based on the resistance method for 16 different land-use types and are configured similar to the EMEP model (Emberson et al., 2000b; Simpson et al., 2003), except for the dry deposition of species on water surfaces, where the deposition depends on the solubility of the chemical species and the wind speed (Hertel et al., 1995).

Wet deposition includes in-cloud and below-cloud scavenging and is calculated as the product of scavenging coefficients and the concentration of gases and particles in air (Simpson et al., 2003). The in-cloud scavenging coefficients are dependent on Henry's law constants and the rate at which precipitation is formed.

3.2.8 Chemistry and aerosols

The basic chemical scheme in DEHM now includes 74 different species and 158 reactions. It is based on the original scheme by (Strand and Hov, 1994). The original Strand and Hov scheme has been modified in order to improve the description of, amongst other things, the transformations of nitrogen containing compounds. The chemical scheme has been extended with a detailed description of the ammonia chemistry through the inclusion of ammonia (NH_3) and related species: ammonium-nitrate (NH_4NO_3), ammonium bisulphate (NH_4HSO_4), ammonium sulphate ($(NH_4)_2SO_4$) and particulate nitrate (NO_3) formed from nitric acid (HNO_3) using an aerosol equilibrium approach with reaction rates dependent on the equilibrium (Frohn, 2004). Furthermore, reactions concerning the wet-phase production of particulate sulphate have been included. The photolysis rates are calculated by using a 2-stream version of the Phodis model (Kylling et al., 1995). The original rates for inorganic and organic chemistry have been updated with rates from the chemical scheme applied in the EMEP model (Simpson et al., 2003). SOA formation is included via a VBS-based approach (Bergström et al., 2012b; Zare et al., 2014). In total, DEHM includes nine classes of particulate matter ($PM_{2.5}$, PM_{10}, TSP, seasalt< 2.5 mm, sea-salt >2.5 mm, smoke from wood stoves, fresh black carbon, aged black carbon, and organic carbon).

3.2.9 Assimilation system

Since the system upgrade in November 2020, the assimilation in DEHM has been based on an updated version of the comprehensive 3D-var data assimilation scheme previously described in (Silver et al., 2016). The NMC method (Kahnert, 2008; Parrish and Derber, 1992) is used to estimate the background error covariance matrix. Two 1-year runs of DEHM using analysed and forecasted ECMWF weather data are performed and their differences are used to estimate the background errors

in spectral space for O_3, NO_2, SO_2, CO, $PM_{2.5}$, and PM_{10}. For the analysis and reanalysis runs, surface in-situ observations of the six species are assimilated at an hourly basis in DEHM.

3.3 EMEP

3.3.1 Model Overview

The EMEP MSC-W (European Monitoring and Evaluation Programme Meteorological Synthesizing Centre-West) model is a chemical transport model developed at the Norwegian Meteorological Institute under the EMEP programme of the United Nations Geneva Convention on Long-range Transboundary Air Pollution. The EMEP MSC-W model system allows several options with regard to the chemical schemes used and the possibility of including aerosol dynamics. (Simpson et al., 2012) described an early version of the EMEP MSC-W model in detail, while updates to the model since 2012 have been documented and evaluated in the annual status reports of EMEP (see (Emep, 2023) and references therein). The forecast version of the EMEP MSC-W model (EMEP-CWF) has been in operation since June 2006. The scheduled model updates in CAMS ensure that the model version stays as close as possible to the official EMEP Open Source version[3]. Nevertheless, the EMEP-CWF results and performances in CAMS might differ from those presented in the annual EMEP Status Reports, because of different input data (emissions and meteorological driver) and model configurations (Forecast in EMEP-CWF versus Hindcast in EMEP Status Reports).

3.3.2 Model geometry

The EMEP-CWF covers the European domain [30°N-76°N] x [30°W-45°E] on a geographic projection with a horizontal resolution of 0.1° x 0.1° (longitude-latitude). Vertically the model uses 20 levels defined as hybrid coordinates. The 10 lowest model levels are within the PBL, and the top of the model domain is at 100 hPa. The lowermost layer has a thickness of approximately 50 meters. Vertical downscaling is used to derive surface concentrations at 3 meters altitude, as described in (Simpson et al., 2012).

3.3.3 Forcing Meteorology

The forcing meteorology is retrieved from the IFS model vertical layers covering the EMEP vertical extent on a 0.1°x0.1° horizontal grid resolution with a temporal resolution of 3 hours. The forecast released at 12:00UTC of the previous days is used. The meteorological parameters included to force the EMEP forecast are: 3D fields of the horizontal wind components (U,V), potential temperature, specific humidity, and cloud fraction. The 2D fields are land-sea mask, surface pressure, friction velocity (u*), large scale and convective precipitation, soil water, snow depth, fraction of snow cover, fraction of ice cover, sensible heat flux, latent heat flux, sea surface temperature, 2m temperature and 2m relative humidity. The IFS forecasts do not include 3D precipitation, which is needed by the EMEP-CWF model. Therefore, a 3D precipitation estimate is derived from large-scale precipitation and convective precipitation (surface variables).

[3] https://github.com/metno/emep-ctm (last accessed 30/10/2024)

3.3.4 Chemical initial and boundary conditions

Boundary conditions are taken from chemical species available in the CAMS-Global forecast model of the previous day at 3hr temporal resolution (Table 2). In cases where CAMS-Global chemical boundary conditions are not available, default boundary conditions are specified for O_3, CO, NO, NO_2, CH_4, HNO_3, PAN, SO_2, isoprene, C_2H_6, some VOCs, Sea salt, Saharan dust and SO_4, as annual mean concentrations along with a set of parameters for each species describing seasonal, latitudinal and vertical distributions. It should be noted however that unavailability of CAMS-Global is very exceptional (less than once a year), and in general due to data transfer issues. The EMEP forecasts are initialised by the EMEP 3D VAR analysis of the previous day.

3.3.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Temporal disaggregation is based on CAMS-REG-TEMPO v4.1. Chemical disaggregation for PM species follows the tables that come with CAMS-REG while VOC emissions are speciated for each source-sector based on a lumped-species approach as described in (Simpson et al., 2012; Bergström et al., 2022) .

The hourly GFAS wildfire emission for D-2 (i.e. the last full day available when launching the forecast system) are used for the analysis (D-1) and the first two days of the forecast (D+0 and D+1). Fire emissions are set to zero for the remainder of the forecast horizon.

The mineral dust source in the EMEP model is based on (Alfaro and Gomes, 2001; Fécan et al., 1998; Gomes et al., 2003; Marticorena and Bergametti, 1995; Marticorena et al., 1997).

Natural emissions of Biogenic Volatile Organic Compounds (BVOCs) are based on Table 3 of (Simpson et al., 2012).

3.3.6 Solver, advection and mixing

The numerical solution of the advection terms of the continuity equation is based on the scheme of (Bott, 1989). The fourth order scheme is utilized in the horizontal directions. In the vertical direction, a second order version applicable to variable grid distances is employed.

The turbulent diffusion coefficients (Kz) are first calculated for the whole 3D model domain on the basis of local Richardson numbers. The planetary boundary layer (PBL) height is then calculated using methods described in (Simpson et al., 2012). For stable conditions, Kz values are retained. For unstable situations, new Kz values are calculated for layers below the mixing height using the O'Brien interpolation.

3.3.7 Deposition

Parameterisation of dry deposition is based on a resistance formulation. The deposition module makes use of a stomatal conductance algorithm which was originally developed for ozone fluxes, but which is now applied to all gaseous pollutants when stomatal control is important (Emberson et al., 2000a; Simpson et al., 2003; Tuovinen et al., 2004). Non-stomatal deposition for NH_3 is parameterised as a function of temperature, humidity, and the molar ratio SO_2/NH_3.

Both gaseous and particulate nitrogen species are scavenged in the EMEP model according to their wet scavenging ratios and collection efficiencies listed in Table S20 of (Simpson et al., 2012). In-cloud and sub-cloud scavenging ratios are considered for gases and in-cloud scavenging ratios and sub-cloud scavenging efficiencies for particles.

3.3.8 Chemistry and aerosols

The EmChem19 chemical scheme couples the sulphur and nitrogen chemistry to the photochemistry and organic aerosol formation using about 200 reactions between ca. 130 species (Bergström et al., 2022; Simpson et al., 2020b; Andersson-Sköld and Simpson, 1999). The standard model version distinguishes 2 size fractions for aerosols, fine aerosol ($PM_{2.5}$) and coarse aerosol ($PM_{2.5\text{-}10}$). The aerosol components presently accounted for are SO_4, NO_3, NH_4, anthropogenic primary PM, organic aerosols, and sea salt. Also aerosol water is calculated. Dry deposition parameterisation for aerosols follows standard resistance-formulations, accounting for diffusion, impaction, interception, and sedimentation. Wet scavenging is treated with simple scavenging ratios, taking into account in-cloud and sub-cloud processes. For secondary organic aerosol (SOA) a volatility-basis set approach (Simpson et al., 2012) is used, which is a somewhat simplified version of the mechanisms discussed in detail by(Bergström et al., 2012a). The EmChem19a scheme also has explicit toluene and benzene with different SOA yields to the o-xylene surrogate that was used previously.

3.3.9 Assimilation system

The EMEP data assimilation system (EMEP-DAS) is based on the 3D-Var implementation for the MATCH model (Kahnert, 2008). The background error covariance matrix is estimated following the NMC method (Parrish and Derber, 1992). Recent changes involved increased computational efficiency, tuning of model and observation representation uncertainties, and improved impact of the assimilation in the vertical.

The EMEP-DAS delivers analyses of D-1 (driven by the operational IFS forecast of 00UTC of yesterday) assimilating O_3, NO_2, CO, $PM_{2.5}$, and PM_{10} surface observations.

3.4 EURAD-IM

3.4.1 Model Overview

The EURAD-IM (European Air pollution Dispersion - Inverse Model) system consists of 5 major parts: the meteorological driver WRF (Weather Research and Forecasting[4]), the pre-processors EEP and PREP for preparation of anthropogenic emission data and observations, the EURAD-IM Emission Model EEM, and the chemistry transport model EURAD (Hass et al., 1995; Memmesheimer et al., 2004). EURAD-IM is a Eulerian meso-scale chemistry transport model involving advection, diffusion, chemical transformation, wet and dry deposition and sedimentation of tropospheric trace gases and aerosols. It includes 3d-var and 4d-var chemical data assimilation (Elbern et al., 2007) and is able to run in nesting mode.

3.4.2 Model geometry

To cover the CAMS domain from 25°E to 45°W and 30°N to 72°N, two lambert conformal projections subdomains with respectively 45 km (199x166 grid boxes) and 9 km horizontal resolution (581x481 grid boxes) are used. The model domain with the finer resolution covering the entire European part of the CAMS domain is nested within the halo domain with the coarser resolution.

Variables are horizontally staggered using an Arakawa C grid. Vertically, the atmosphere is divided by 23 terrain-following sigma coordinate layers between the surface and the 100 hPa pressure level. About 15 layers are within the first 2 km of the atmosphere The thickness of the lowest layer is about 35 m. No vertical downscaling is used to derive surface concentrations from the first model level.

3.4.3 Forcing Meteorology

The meteorological forcing is obtained from 3-hourly IFS forecasts, but unlike the other models, the Weather Research and Forecast (WRF) model is used to compute meteorological fields on the grid needed to drive the EURAD-IM CTM. This intermediate processing is essentially for historical reasons as in the past the IFS temporal and spatial resolution required interpolation for use in the CTM. A direct use the IFS data to dynamically drive EURAD-IM has been developed and is currently in the testing to enter the operational production in the near future.

3.4.4 Chemical initial and boundary conditions

[4] https://www.mmm.ucar.edu/models/wrf, last accessed 30/10/2024

The CAMS-Global 00:00 UTC forecast for the previous day is extracted from the MARS archive at ECMWF using 36 model levels with a temporal resolution of 3 hours. The full list of species used from the CAMS-Global model is given in Table 2. Sea salt concentrations from CAMS-Global are divided by the constant 4.3 for the conversion from wet to dry mass.

3.4.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. The VOC and PM split, the vertical distribution of area sources, and the emission strength per hour are calculated within the EURAD-IM CTM with the distribution profiles provided with the CAMS-REG-AP_v6.1/2019 inventory (Kuenen et al., 2022). The VOC and PM split depends on source category and country, the vertical distribution only depends on the source category. The CAMS-TEMPO v4.1 (Guevara et al., 2021) profiles are used for the annual, monthly, weekly and daily distribution of emissions.

Biogenic emissions and NO_x emissions from soil are calculated within the EURAD-IM CTM with MEGAN (Guenther et al., 2012). Fire emissions are taken into account using hourly data from GFASv1.2 product (Kaiser et al., 2012). Zero fire emissions are assumed for D+2 and D+3 forecasts.

3.4.6 Solver, advection and mixing

The positive definite advection scheme of (Bott, 1989), implemented in a one-dimensional realisation, is used to solve the advective transport. An operator splitting technique is employed (Mcrae et al., 1982) to handle the varying numerical specificities of processes to be solved.

An Eddy diffusion approach is used to parameterize the vertical sub-grid-scale turbulent transport. The calculation of vertical Eddy diffusion coefficients is based on the specific turbulent structure in the individual regimes of the planetary boundary layer (PBL) according to the PBL height and the Monin-Obukhov length (Holtslag and Nieuwstadt, 1986). A semi-implicit (Crank-Nicholson) scheme is used to solve the diffusion equation.

The sub-grid cloud scheme in EURAD-IM was derived from the cloud model in the EPA Models-3 Community Multiscale Air Quality (CMAQ) modelling system (Roselle and Binkowski, 1999). Convective cloud effects on both gas phase species and aerosols are considered.

3.4.7 Deposition

The gas phase dry deposition modelling follows the method proposed by (Zhang et al., 2003). Dry deposition of aerosol species is treated size dependent, using the resistance model of (Petroff and Zhang, 2010) with consideration of the canopy. Dry deposition is applied as lower boundary condition of the diffusion equation.

Wet deposition of gases and aerosols is derived from the cloud model in the CMAQ modelling system (Roselle and Binkowski, 1999). The wet deposition of pollen is treated according to (Baklanov and Sørensen, 2001).

Size dependent sedimentation velocities are calculated for aerosol and pollen species. The sedimentation process is parameterized with the vertical advective transport equation and solved using the fourth order positive definite advection scheme of (Bott, 1989).

3.4.8 Chemistry and aerosols

In the EURAD-IM CTM, the gas phase chemistry is represented by an extension of the Regional Atmospheric Chemistry Mechanism (RACM) (Stockwell et al., 1997) based on the Mainz Isoprene Mechanism (MIM) (Geiger et al., 2003). A 2-step Rosenbrock method is used to solve the set of stiff ordinary differentials equations (Sandu and Sander, 2006). Photolysis frequencies are derived using the FTUV model (fast TUV) according to (Tie et al., 2003). The radiative transfer model therein is based on the Tropospheric Ultraviolet-Visible Model (TUV) developed by (Madronich and Weller, 1990).

The modal aerosol dynamics model MADE (Ackermann et al., 1998) is used to provide information on the aerosol size distribution and chemical composition. To solve for the concentrations of the secondary inorganic aerosol components, a FEOM (fully equivalent operational model) version, using the HDMR (high dimensional model representation) technique (Nieradzik, 2005; Rabitz and Aliş, 1999), of an accurate mole fraction based thermodynamic model (Friese and Ebel, 2010) is used. The updated SORGAM module (Li et al., 2013) simulates secondary organic aerosol formation.

3.4.9 Assimilation system

The EURAD-IM assimilation system (Elbern et al., 2007) includes (i) the EURAD-IM CTM and its adjoint, (ii) the formulation of both background error covariance matrices for the initial states and the emission, and their treatment to precondition the minimisation problem, (iii) the observational basis and its related error covariance matrix, and (iv) the minimisation including the transformation for preconditioning. The quasi-Newton limited memory L-BFGS algorithm described in (Liu and Nocedal, 1989; Nocedal, 1980) is applied for the minimisation.

Currently assimilated in the EURAD-IM analysis and interim re-analysis are surface in-situ observations of O_3, NO_2, SO_2, CO, $PM_{2.5}$, PM_{10}.

3.5 GEM-AQ

3.5.1 Model Overview

GEM-AQ is a numerical weather prediction model where air quality processes (gas phase and aerosols) are implemented on-line in the host meteorological model, the Global Environmental Multiscale (GEM) model, developed at Environment and Climate Change Canada (Côté et al., 1998a). The model is used for operational air quality forecasting in Poland. Also, it is used in a research project to investigate air quality in different environmental conditions (Struzewska and Kaminski, 2008, 2012; Struzewska et al., 2015; Struzewska et al., 2016).

3.5.2 Model geometry

The GEM-AQ model can be configured to simulate atmospheric processes over a broad range of scales, from the global scale down to the meso-gamma scale. An arbitrarily rotated latitude-longitude mesh focuses resolution on any part of the globe. In the CAMS regional production, the model is run in the limited area mode with a resolution of 0.1° x 0.1° on a spherical coordinate system. The coordinates are the following: lower-left (17.4°N / 22.1°W), upper-right (58.6°N/ 86.6°E). In the vertical, GEM-AQ uses the generalised sigma vertical coordinate system. It has terrain-following sigma surfaces near the ground that transform to pressure surfaces higher in the atmosphere. The model top is set at 10 hPa.

3.5.3 Forcing Meteorology

The operational IFS model provides meteorological fields for the initial and boundary conditions used by the meteorological part of the GEM-AQ model. The GEM-AQ model is started using the 12-hour forecast (valid at 00:00 UT of the following day) as the initial conditions. The IFS data are used as boundary conditions with a nesting interval of 3 hours. The IFS meteorological fields are computed from spectral coefficients for the target GEM-AQ grid. Meteorological fields, in the GEM-AQ model domain, are constrained within the nesting zone (absorber), which is defined over 10 grid points on each lateral boundary of the limited area domain.

3.5.4 Chemical initial and boundary conditions

Chemical species of the CAMS-Global forecast for the previous day are used with a temporal resolution of 3 hours (Table 2). For dust aerosols, the three available size bins from the CAMS-Global model are distributed uniformly over the 10 corresponding bins in GEM-AQ. For organic matter aerosol, black carbon and sulphates, the same log-normal based profile was applied. For organic aerosol and black carbon, hydrophobic and hydrophilic components were summed as “total organic aerosol” and “total black carbon aerosol” before applying size-bin distribution profiles.

3.5.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Based on this information, emission fluxes for 15 gaseous species (9 hydrocarbons and 6 inorganics) and 4 aerosol components (primary organic aerosol, black carbon, sulphates, nitrates) are derived using factors provided by TNO. Total emission fluxes for each aerosol component are distributed into 12 bins in the GEM-AQ aerosol module.

Anthropogenic emissions are distributed within the 7 lowest model layers (up to 1350 m) with injection height profiles for each of the GNFR sectors re-mapped for the GEM-AQ levels (Bieser et al., 2011). Temporal profiles modulating annual and diurnal variation of emission fluxes for each GNFR are used.

For biogenic emissions, a temperature-dependent, monthly averaged MEGAN-MACC (Sindelarova et al., 2014) dataset for the year 2010 was used specifically to avoid the short-term variability of reactive biogenic VOCs that would otherwise be generated in an online approach. In contrast to the online method, this approach provides an anticipated variability range, particularly by reducing the influence of online factors such as meteorological errors and extreme values.

3.5.6 Solver, advection and mixing

The set of non-hydrostatic Eulerian equations (with a switch to revert to the hydrostatic primitive equations) maintains the model's dynamical validity right down to the meso-gamma scales. The time discretization of the model dynamics is fully implicit, 2 time-level (Côté et al., 1998b; Côté et al., 1998a). The spatial discretization for the adjustment step employs a staggered Arakawa C grid that is spatially offset by half a mesh length in the meridional direction. It is second-order accurate, whereas the interpolations for the semi-Lagrangian advection are of fourth-order accuracy.

Deep convective processes are handled by Kain-Fritch convection parameterisation (Kain and Fritsch, 1990). The vertical diffusion of momentum, heat and tracers is a fully implicit scheme based on turbulent kinetic energy (TKE) theory.

3.5.7 Deposition

The effects of dry deposition are included as a flux boundary condition in the vertical diffusion equation. Dry deposition velocities are calculated from a `big leaf' multiple resistance model (Wesely, 1989; Aamaas et al., 2013) with aerodynamic, quasi-laminar layer, and surface resistances acting in series. The process assumes 15 land-use types and takes snow cover into account. Wet deposition takes into account cloud scavenging for soluble gas species and aerosols.

3.5.8 Chemistry and aerosols

The gas-phase chemistry mechanism currently used in the GEM-AQ model is based on a modification of version 2 of the Acid Deposition and Oxidants Model (ADOM) (Venkatram et al., 1988), derived from the condensed mechanism of (Lurmann et al., 1986). The ADOM-II mechanism comprises 47 species, 98 chemical reactions and 16 photolysis reactions. In order to account for background tropospheric chemistry, 4 species (CH_3OOH, CH_3OH, CH_3O_2, and CH_3CO_3H) and 22 reactions were added. All species are solved using a mass-conserving implicit time stepping discretization, with the solution obtained using Newton's method. Heterogeneous hydrolysis of N_2O_5 is calculated using the on-line distribution of aerosol. Although the model meteorology is calculated up to 10 hPa, the focus of the chemistry is in the troposphere where all species are transported throughout the domain. To avoid the overhead of stratospheric chemistry, the ozone and NOy fields are replaced above 100 hPa with those from the CAMS-Global model. Additionally, stratospheric columns for absorbing species used in photolysis calculations (cf., ozone) are taken from the CAMS-Global model. Photolysis rates (J values) are calculated on-line every chemical time step using the method described in (Landgraf and Crutzen, 1998). In this method, radiative transfer calculations are done using a delta-two stream approximation for 8 spectral intervals in the UV and visible applying pre-calculated effective absorption cross sections. This method also allows for scattering by cloud droplets and for clouds to be presented over a fraction of a grid cell. The host meteorological model provides both cloud cover and water content. The J value package used was developed for MESSy (Jöckel et al., 2006) and is implemented in GEM-AQ.

The current version of GEM-AQ has 5 size-resolved aerosol types, viz. sea salt, sulphate, black carbon, organic carbon and dust as well as nitrates. The microphysical processes that describe the formation and transformation of aerosols are calculated by a sectional aerosol module (Gong et al., 2003). The particle mass is distributed into 12 logarithmically spaced bins from 0.005 to 10.24-micron radius. This size distribution leads to an additional 60 advected tracers. The following aerosol processes are accounted for in the aerosol module: nucleation, condensation, coagulation, sedimentation and dry deposition, in-cloud oxidation of SO_2, in-cloud scavenging, and below-cloud scavenging by rain and snow.

3.5.9 Assimilation system

Data assimilation in the GEM-AQ modelling system is done with Optimal Interpolation method (Robichaud and Ménard, 2014) and is applied to the forecast. Error statistics are computed with the Hollingsworth - Lönnberg (HL) method (Hollingsworth and Lönnberg, 1986). It estimates the correlation length and the ratio of observation to model error variances by a least-square fit of a correlation model against the sample of the spatial autocorrelation of observation-minus-model residuals.

Currently, data assimilation is done at each forecast hour for O_3, NO_2, SO_2, CO, PM_{10} and $PM_{2.5}$, using surface observations.

3.6 LOTOS-EUROS

3.6.1 Model Overview

The LOTOS-EUROS model is a 3D chemistry transport model aimed to simulate air pollution in the lower troposphere. The model has been used in a large number of studies for the assessment of particulate air pollution and trace gases (e.g. O_3, NO_2) (Hendriks et al., 2016; Schaap et al., 2013; Thürkow et al., 2021; Timmermans et al., 2022). A detailed description of the model is given in (Manders et al., 2017). At present the version used in the production is v2.2.009.

3.6.2 Model geometry

The domain of LOTOS-EUROS is the CAMS regional domain from 25°W to 45°E and 30°N to 72°N. The projection is regular longitude-latitude, at 0.1°x0.1° grid spacing. In the vertical and for the forecasts there are currently 12 model layers and 2 more reservoir layers at the top, defined by coarsening in a mass conservative way the first 77 model levels of the IFS. For output purposes, the concentrations at measuring height (usually 2.5 m) are diagnosed by assuming that the flux is constant with height and equal to the deposition velocity times the concentration at height *z* (taken as average over the grid cell). This applies for several of the gaseous species, namely O_3, NO, NO_2, HNO_3, N_2O_5, H_2O_2, CO, SO_2 and NH_3. For aerosols, the same approach is utilized, only sedimentation velocity is used instead of deposition velocity.

3.6.3 Forcing Meteorology

The forcing meteorology is retrieved from the 00:00 and 12:00 UTC runs of the IFS model at hourly (surface fields) or 3-hourly temporal resolution (model layer fields). The meteorological data is retrieved on a regular horizontal resolution of about 9 km and for all layers covered by the model's vertical extent. The meteorological variables included are 3-hourly 3D fields for wind direction, wind speed, temperature, humidity and density, augmented by hourly 2D gridded fields of mixing layer height, surface wind and temperature, precipitation rates, heat fluxes, cloud cover and surface variables snow depth, sea ice cover and volumetric soil water.

3.6.4 Chemical initial and boundary conditions

The lateral and top boundary conditions for trace gases and aerosols are obtained from the CAMS-Global daily forecasts (see Table 2). LOTOS-EUROS uses a bulk approach for the aerosol size distribution differentiating between a fine and a coarse fraction, but for dust and sea salt there are 5 distinct size classes: ff: 0.1-1 μm, f:1-2.5 μm, ccc: 2.5-4 μm, cc: 4-7 μm, c:7-10 μm. When the chemical boundary conditions from CAMS-Global are missing (which is very rare, typically less than once a year, and can, e.g., be due to delays in the file transfer or other serious technical issues at ECMWF), the model uses climatological boundary concentrations derived from CAMS-Global data. The forecasts are initialised with the LOTOS-EUROS forecast of the previous day.

3.6.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Injection height distribution from the EuroDelta study is implemented, which is per SNAP (or more recently, GNFR) category. Time profiles used are defined per country and GNFR emission category type.

Biogenic NMVOC emissions are calculated online using actual meteorological data and a detailed landuse and tree species database including emission factors from (Köble and Seufert, 2001). The isoprene emissions follow the mathematical description of the temperature and light dependence of the isoprene emissions, proposed by (Guenther et al., 1993). Sea salt emissions are parameterised following (Martensson et al., 2003; Monahan, 1986) from the wind speed at 10-meter height.

The fire emissions are taken from the near real-time GFAS fire emissions database. For the forecast, we assume persistence, so that the latest downloaded emission for the specific hour is used. When the hourly emission is more than 3 days old, it is set to zero.

Mineral dust emissions within the modelling domain are calculated online based on the sand blasting approach by (Marticorena and Bergametti, 1995) with soil moisture inhibition as described by (Fécan et al., 1998). Finally, a parameterization using land cover and temperature is used for handling soil NOx emissions, based on (Yienger and Levy, 1995).

3.6.6 Solver, advection and mixing

The transport consists of advection in 3 dimensions, horizontal and vertical diffusion, and entrainment/detrainment. The advection is driven by meteorological fields (u,v), which are input every 3 hours. The vertical wind speed w is calculated by the model as a result of the divergence of the horizontal wind fields. A linear advection scheme is used to ensure tracer mass conservation, which also allows more efficient parallelization and reduced model complexity. This scheme uses piece-wise linear functions to define sub-grid concentrations, which is sometimes referred to as MUSCL (”Monotonic Upwind-centered Scheme for Conservation Laws”) following (Van Leer, 1984).

Vertical diffusion is described using the standard K_z theory. Vertical exchange is calculated employing the new integral scheme by (Yamartino et al., 2007). For the forecasting set-up with 12 layers, atmospheric stability values and functions, including Kz values, are derived based on the surface heat fluxes from ECMWF meteorology and similarity profiles following the IFS approach (Ecmwf, 2021) to adapt for land-use specific conditions. For the 5-layer version in the assimilation, a correction is made for the vertical diffusion to correct for the height difference between surface and mixing layer.

3.6.7 Deposition

The dry deposition in LOTOS-EUROS is parameterised following the resistance approach. The laminar layer resistance and the surface resistances for acidifying components are described following the EDACS system (Van Zanten et al., 2010), the deposition velocities for particles are based on (Zhang et al., 2001). Wet deposition is divided between in-cloud and below-cloud scavenging. The in-cloud scavenging module is based on the approach described in (Seinfeld and Pandis, 1998) and (Banzhaf et al., 2012).

3.6.8 Chemistry and aerosols

LOTOS-EUROS uses the TNO CBM-IV scheme, which is a modified version of the original CBM-IV (Gery et al., 1989). N_2O_5 hydrolysis is described explicitly based on the available (wet) aerosol surface area (using $\gamma = 0.05$) (Schaap et al., 2004). Aqueous phase and heterogeneous formation of sulphate is described by a simple first order reaction constant (Barbu et al., 2009; Schaap et al., 2004). Inorganic aerosol chemistry is represented using ISORROPIA II (Fountoukis and Nenes, 2007) and secondary organic aerosols formation based on a VBS scheme (Bergström et al., 2012a; Zare et al., 2014) will be included in the operational forecast version in the future.

3.6.9 Assimilation system

The LOTOS-EUROS model is equipped with a data assimilation package with the ensemble Kalman filter technique (Curier et al., 2012). The ensemble is created by specification of uncertainties for emissions (NOx, VOC, NH_3 and aerosol), ozone deposition velocity, and ozone top boundary conditions. Currently, data assimilation is performed for O_3, NO_2, PM_{10} and $PM_{2.5}$ surface observations, OMI NO_2 is also assimilated.

3.7 MATCH

3.7.1 Model Overview

The Multi-scale Atmospheric Transport and Chemistry model (MATCH) (Robertson et al., 1999) is an off-line chemical transport model (CTM) with a flexible design, accommodating different weather data forcing on different resolutions and projections, and a range of alternative schemes for deposition and chemistry.

3.7.2 Model geometry

The model's geometry is taken from the input weather data. To reduce computational costs, the vertical resolution is reduced compared to the ECMWF operational model by merging pairs of IFS vertical layers, while retaining the use of hybrid vertical coordinates. The horizontal resolution in the MATCH simulation matches that of the meteorological forcing, which is currently provided on a 0.1° latitude–longitude grid. The lowest 78 layers of the ECMWF model are lumped in 39 levels, which then are used for the air quality simulations. The model top is at about 8000 m height. The model domain covers the area between 28.8° W to 45.8° E and 29.2° N to 72.0° N. The grid is an Arakawa C-grid with staggered wind components.

3.7.3 Forcing Meteorology

The forcing meteorology for MATCH forecasts is retrieved from the 12:00 UTC run of the IFS modelling system on a 0.1°×0.1° spatial grid and with a temporal resolution of three hour. For the analyses, the 00:00 UTC analysis of the IFS is used at 0.2°×0.2° resolution. The reason for applying a coarser resolution in the analysis is twofold: 1) the delivery time is rather short from when the in-situ observations are available, 2) the analysis increments are on a larger scale. The meteorological variables included are 3D fields of the horizontal wind components (U, V), temperature, specific humidity, cloud cover, cloud water content, cloud ice water content, and surface fields of surface pressure, logarithm of surface pressure, surface temperature, sea surface temperature, snow depth, albedo, roughness height, total cloud cover, precipitation, and volumetric soil water at the surface.

3.7.4 Chemical initial and boundary conditions

The lateral boundary conditions for trace gases and aerosols are obtained from the CAMS-Global forecasts at 3-hourly resolution for the following species: O_3, CO, HCHO, NO, NO_2, SO_2, HNO_3, PAN, CH_4, C_5H_8, o-xylene, sulphate and C_2H_6 (see Table 2). In the event that the chemical boundary conditions from CAMS-Global would be missing (which has never happened in practice but could in theory happen due to due to corruption or other technical issues), the model uses seasonal climatological boundary concentrations instead.

3.7.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Temporal disaggregation is based on the GENEMIS tables (Ebel et al., 1997), using a GNFR to SNAP matrix. The vertical distribution of the emissions depends on the sector. Near-surface emission sources (SNAP 2,6,7,8,10) are distributed in the lowest 90 m; for other sectors the emissions are allocated over varying model levels up to a maximum of about 1100 m height. According to the sector, the anthropogenic VOC emissions are split into the MATCH chemical mechanism surrogate species: C_2H_6, NC_4H_{10}, C_2H_4, C_3H_6, OXYLENE, BENZENE, TOLUENE, CH_3OH, C_2H_5OH, HCHO, CH_3CHO, $CH_3COC_2H_5$; the particulate matter components elemental carbon, organic matter, anthropogenic dust (other than soil and road dust) are allocated to two bins ($PM_{2.5}$ and PM-coarse), as well as the road dust estimated according to (Schaap et al., 2009) and (Omstedt et al., 2005), and the teluric dust calculated according to (Zender et al., 2003).

Biogenic emissions of isoprene, monoterpenes and sesquiterpenes are calculated following (Simpson et al., 2012; Simpson et al., 1995; Bergström et al., 2012a), taking into account temperature at 2 m, radiation fluxes and the vegetation cover.

The dimethyl sulphide - DMS – emissions from the Ocean and Baltic Sea are also considered; whereas the particulate matters from sea salt are calculated according to the parameterisation proposed by (Sofiev et al., 2011).

The GFAS biomass burning emissions are taken into the model mapping the following species into the MATCH chemical mechanism: NOx, SO_2, CO, CH_4, C_2H_4, C_2H_6, C_3H_6, C_4H_{10}, C_8H_{10}, benzene, toluene, CH_3OH, C_2H_5OH, formaldehyde, acetaldehyde, OC, BC, $PM_{2.5}$, and PM_{10}. The vertical injection is made by a parabolic curve with central height taken from the GFAS INJH parameter. In case the injection height is missing for a GFAS emission cell this is assigned from some neighbour height present. The diurnal emission profile is based on the D-1 GFAS hourly data filled up with GFAS data for D-2 for the not yet available hours in D-1. This diurnal hourly profile is repeated throughout the forecast.

3.7.6 Solver, advection and mixing

Mass conservative transport schemes are used for advection and turbulent transport. The advection is formulated as a Bott-like scheme (Robertson et al., 1999). A second order transport scheme is used in the horizontal as well as the vertical. The vertical diffusion is described by an implicit mass conservative first order scheme, where the exchange coefficients for neutral and stable conditions are parameterized following (Holtslag and Nieuwstadt, 1986). In the convective case the turbulent Courant number is directly determined from the turnover time in the boundary layer.

Part of the dynamical core is the initialisation and adjustment of the horizontal wind components. This is a very important step to ensure mass conservative transport. The initialisation is based on a procedure proposed by (Heimann and Keeling, 1989),

where the horizontal winds are adjusted by means of the difference between the input surface pressure tendency, and the calculated pressure tendency assumed to be an error in the divergent part of the wind field.

Boundary layer parameterisation is based on surface heat and water vapour fluxes as described by (Van Ulden and Holtslag, 1985) for land surfaces, and (Burridge, 1977) for sea surfaces. The boundary layer height is calculated from formulations proposed by (Zilitinkevich and Mironov, 1996) for the neutral and stable case, and from (Holtslag et al., 1995) for the convective case. These parameterisations drive the formulations for dry deposition and vertical diffusion.

3.7.7 Deposition

Dry deposition of gases and aerosols is modelled using a resistance approach (based on the scheme in (Simpson et al., 2012)), which includes stomatal and non-stomatal pathways for vegetated surfaces. In the current operational system, the model applies this scheme across various physiographic tiles derived from the CLC/SEI inventory[5] (Simpson et al., 2012). MATCH uses 3D-precipitation (estimated in the model, based on the surface precipitation and 3D cloud water information from the IFS forecast) and separates wet scavenging into in-cloud and sub-cloud scavenging. For most gaseous components the scavenging is assumed to be proportional to the precipitation intensity (with higher scavenging ratios in-cloud than sub-cloud). For the particulate components in-cloud scavenging is also treated using simple scavenging ratios while the sub-cloud scavenging is treated using a scheme based on (Berge, 1993) with size dependent collection efficiencies (as in (Simpson et al., 2012)).

3.7.8 Chemistry and aerosols

The photochemistry scheme is based on the EMEP MSC-W chemistry scheme (Simpson et al., 2012), with a modified scheme for isoprene, based on the so-called Carter-1 mechanism (Carter, 1996; Langner et al., 1998). The standard MATCH setup used in CAMS treats particles as bulk aerosol in two size classes, fine ($PM_{2.5}$) and coarse ($PM_{2.5-10}$) particles. Particle formation from gases include secondary inorganic aerosol (ammonium sulphate and nitrate) and secondary organic aerosol. Ammonium nitrate equilibrium is calculated according to (Mozurkewich, 1993). Coarse nitrate formation from gas-phase HNO_3 is also included (Strand and Hov, 1994). Secondary organic aerosol formation from oxidation of volatile organic compounds is treated using a volatility basis set scheme based on (Hodzic et al., 2016). Exception is made for the isoprene oxidation for which the chain of reactions is following the Carter-1 chemical mechanism, which has proven to give the comparable results with fewer reactions (Carter, 1996; Langner et al., 1998).

[5] www.sei.org/projects/sei-european-land-cover-map (last accessed 30/10/2024)

3.7.9 Assimilation system

The model for data assimilation is an integrated part of the MATCH modelling system. The data assimilation scheme as such is a variational spectral scheme (Kahnert, 2008), implying that the background covariance matrices are modelled in spectral space. The limitation is that covariance structures are described as isotropic and homogeneous. The advantage is that the background error matrix becomes block diagonal, and there are no scale separations as the covariance between spectral components are explicitly handled. The block diagonal elements are the covariance between wave components at model layers and chemical compounds.

Modelling the background error covariance matrices is the central part in data assimilation. This is conducted by means of the so-called NMC approach (Parrish and Derber, 1992). The CTM (MATCH) is run for a 3-month period for photochemistry and aerosols with analysed and forecasted ECMWF weather data. The differences are assumed to mimic the background errors, and the statistics in spectral space are generated for different combinations of the model compounds: O_3, NO_2, NO, SO_2, CO, $PM_{2.5}$, PM_{10}.

The scheme is fully intermittent in hour-by-hour steps and the above-listed components are assimilated from in-situ measurements. The analysed components are propagated by chemistry and transport into unobserved components as NMVOCs, PAN and NH_3.

3.8 MINNI

3.8.1 Model Overview

MINNI (Italian Integrated Assessment Modelling System for supporting the International Negotiation Process on Air Pollution and assessing Air Quality Policies at national/local level; (D'elia et al., 2021; Mircea et al., 2014) has been developed to support the Italian Ministry for Environment and Territory and Sea. The core of the modelling system is the 3-dimensional offline Eulerian CTM FARM (Flexible Air quality Regional Model, (Silibello et al., 2008) that accounts for the transport, chemistry and removal of atmospheric pollutants.

3.8.2 Model geometry

For the CAMS regional forecast, the model is configured with a regular latitude-longitude grid of 0.15° × 0.10° resolution. The domain spans from -25° to 45.05° degree East and from 30° to 72° degree North. The model uses z-level terrain following mesh with the first central grid point at 20 m AGL (above ground level) and the last one at 6290 m AGL. No vertical downscaling is applied to extrapolate concentrations from 20 meters above the ground to the surface.

3.8.3 Forcing Meteorology

The forcing meteorology is retrieved from the 12:00 UTC run of the IFS modelling system on a 0.1°x0.1° spatial grid and with a temporal resolution of one hour. The meteorological variables included are 3D fields such as temperature, relative humidity, pressure and wind velocity and 2D fields such as boundary layer height, roughness length, albedo, sea surface temperature, total cloud cover and precipitation.

3.8.4 Chemical initial and boundary conditions

The lateral and top boundary conditions for trace gases and aerosols are obtained from the CAMS-Global daily forecasts with a 3-hr temporal resolution (see Table 2). The initial condition is taken from the previous forecast of the MINNI model.

3.8.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. Point emissions are summed up to gridded emissions for each GNFR sector, since no information was available about the characterization of the point sources in terms of injection height. Conservative mass horizontal interpolation has been applied to map the emissions on the actual model domain. Vertical splitting has been applied for each GNFR sector adapting the vertical injection profiles provided by TNO to the actual model levels. Temporal emission profiles for each GNFR sector, as they were provided by TNO, have been applied considering local hour (i.e. the time zones shift has been taken into account).

$PM_{2.5}$ has been speciated following the TNO table as a function of country and sector and AERO3 (Binkowski and Shankar, 1995; Binkowski, 1999) species size fractions below 2.5µm. The coarse component (PM_{10}-$PM_{2.5}$) was associated to non-speciated coarse mode since MINNI dispersion model considers all the secondary aerosol fraction as $PM_{2.5}$. This method leaves the detailed chemical speciation out but ensures mass conservation.

The NMVOC speciation originated from the TNO table as a function of country and sector obtaining the v01-v25 species. The mapping among the v01-v25 species to SAPRC99 species has been done in agreement with the choices made and tested in the frame of EURODELTA III intercomparison exercise (Colette et al., 2017).

Biogenic emissions are computed with the MEGAN model v.2.04 (Guenther et al., 2006), and NOx emissions from soil following (Williams et al., 1992) approach.

Erosion and resuspension of the dust are calculated by means of method proposed by (Vautard et al., 2005). Road dust emissions are parameterized following (Zender et al., 2003).

Fire emissions are taken into account using hourly data from the GFAS database considering emissions from D-1 for AN (D-1) and FC (D+0 and D+1, zero for the remaining days).

3.8.6 Solver, advection and mixing

FARM is a 3-dimensional Eulerian model with first order turbulence closure. Physical and chemical processes influencing the concentration fields within the modelling domain are described by a system of partial differential equations (PDE). The numerical integration of the above system of PDEs is performed by a method that splits the multi-dimensional problem into time dependent one-dimensional problems, which are then solved sequentially over the time step.

Partial differential equations involved in horizontal and vertical advection-diffusion operators are solved in FARM using the schemes employed in CALGRID model (Yamartino et al., 1992). In particular, horizontal advection-diffusion operators are solved using a finite elements method based on Blackman cubic polynomials. The coefficients of a cell-centered cubic polynomial are constrained to maintain high-accuracy and low-diffusion characteristics and to avoid undesirable negative concentrations. In addition, a filter is used for filling undesired short wavelength minima. The numerical integration of the vertical diffusion equation is performed in a hybrid way employing a hybrid semi-implicit Crank-Nicholson / fully implicit scheme (Yamartino et al., 1992).

The calculation of horizontal diffusion coefficients is based on Stress tensor formulation of (Smagorinsky, 1963) also including a dependence on the local stability class and wind speed. For the calculation of vertical diffusion coefficients, the (Lange, 1989) approach to boundary layer scaling regimes is used. Mixing due to deep convection is not explicitly taken into account.

Two different schemes to compute the PBL scaling parameters are used. In the daytime, the (Maul et al., 1980) version of (Carson, 1973)encroachment method is used. During night-time, the minimum value between (Nieuwstadt, 1981) and (Venkatram, 1980) is used.

3.8.7 Deposition

The dry deposition velocities are modelled following a resistance analogy approach, as an inverse sum of a series of 3 resistances: the aerodynamic resistance, the quasi-laminar layer resistance and the surface resistance. Aerodynamic resistance is dependent on surface characteristics and atmospheric stability conditions (described through friction velocity and Monin-Obukhov length). Quasi-laminar layer resistance is parameterised using (Hicks et al., 1987). Surface resistance is approximated as a set of parallel resistance associated with leaf stomata, leaf cuticles, lower canopy and surface soil, litter and water (Wesely, 1989). Deposition to water surfaces is based on (Slinn et al., 1978).

The deposition velocity of particulate species also depends on particle size distribution and density because of gravitational settling. Sedimentation velocity acts in parallel to the other resistances. Hygroscopic growth is considered over water for particles less than 2 µm. For particles ranging from 0.1 to 1 µm deposition velocity is computed as the inverse of the resistance computed from canopy height, friction velocity and Monin-Obukhov length.

The parameterization of wet deposition follows the (Simpson et al., 2012) approach, including in-cloud and below-cloud scavenging of gas and particles.

3.8.8 Chemistry and aerosols

The gas-phase chemical mechanism used for CAMS forecast is SAPRC-99 with the inclusion of Polycyclic aromatic hydrocarbons (PAHs) and Mercury chemistry; moreover, a simplified aqueous phase mechanism is included for SO_2 oxidation and chemical processes involving Mercury in both gas and aqueous phases.

A simple approach is used to estimate photolysis rates based on look-up tables to calculate the rate constants for photolysis reactions (Nenes et al., 1998). Photolysis rates are computed and adjusted according to local solar zenith angle using an empirical formula based on (Peterson, 1976) data.

The aerosols module is AERO3 (Binkowski and Shankar, 1995; Binkowski, 1999). In AERO3 the representation of the particle size is three-modal (Aitken, accumulation and coarse), following lognormal distributions. The aerosol species included are sulphate, nitrate, ammonium, anthropogenic primary and secondary organic aerosol, biogenic secondary organic aerosol, elemental carbon, sea-salt and dust. The aerosol dynamics takes into account nucleation, condensation and coagulation processes. The gas/particle mass transfer is implemented by means of ISORROPIA v1.7 (Nenes et al., 1998) and SORGAM (Schell et al., 2001a) for secondary inorganic and organic aerosol, respectively.

3.8.9 Assimilation system

The assimilation scheme used is optimal interpolation: the correlation function is factorized in vertical and horizontal components. The horizontal component has pollutant dependent fixed correlation length with a terrain-following exponential decay. The vertical component is modelled with a Cressman function dependent on the boundary layer height. The system assimilates NO_2, O_3, SO_2, CO, PM_{10} and $PM_{2.5}$. In case of aerosol components, the correction applied to each of them is proportional to their content in PM. At present, only data from surface stations are assimilated. More details are available in (Adani and Uboldi, 2023).

3.9 MOCAGE

3.9.1 Model Overview

The MOCAGE 3D multi-scale Chemistry and Transport Model has been designed for both research and operational applications in the field of environmental modelling. Since 2000, MOCAGE has been allowing to cover a wide range of topical issues ranging from chemical weather forecasting, tracking and backtracking of accidental point source releases, trans-boundary pollution assessment, assimilation of remote sensing measurements of atmospheric composition, to studies of the impact of anthropogenic emissions of pollutants on climate change (Guth et al., 2018; Cussac et al., 2020).

3.9.2 Model geometry

For the CAMS Regional Service, MOCAGE operates on a regular latitude-longitude grid at 0.1 resolution covering the 28° to 72° North and 26°W to 46°E domain, for both forecast and assimilation. The products delivered for the CAMS service are issued from the regional domain only. In the vertical, 47 hybrid levels go from the surface up to 5 hPa, with approximately 8 levels in the Planetary Boundary Layer (i.e. below 2km), 16 in the free troposphere and 24 in the stratosphere. The thickness of the lowest layer is about 40 m. There is no downscaling applied to surface concentration.

3.9.3 Forcing Meteorology

The forcing meteorology is retrieved from the IFS model vertical layers covering the MOCAGE vertical extent on a 0.1°x0.1° horizontal grid resolution with a temporal resolution of one hour for the 3 first forecast days and 3 hours for the last forecast day. The forecast released at 12UTC of the previous days is used. The meteorological parameters used for the dynamics calculation in MOCAGE are: horizontal and vertical winds, temperature, humidity, cloud fraction, surface pressure, albedo, precipitations and incoming radiative flux. The variables relevant for the deposition module are soil humidity and temperature, wind speed and direction, specific humidity, pressure at ground level, and sensible heat flux.

3.9.4 Chemical initial and boundary conditions

Chemical initial values in the regional domain are provided by MOCAGE 24h forecast from the day before. The boundary conditions are taken from global CAMS operational suite for the species (chemical and aerosols) that are distributed (see Table 2). For aerosols, the 2 or 3 bins from CAMS-Global are summed to get total concentration and then distributed onto the 6 MOCAGE bins considering Mean CAMS-Global bin size as emission modes. A factor 4.3 is applied to convert Sea Salt from wet to dry fractions. Aerm03 (of diameter larger than 10µm) is only marginally distributed within MOCAGE PM_{10} sea salt because of the matching between bins and log-normal modes. For the species not included in Table 2, the concentrations from the MOCAGE global domain are used, which helps to introduce smoothly, on the horizontal as well as on the vertical, these chemical boundary conditions into the CAMS regional domain.

3.9.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 3.2. Temporal disaggregation is based on the GENEMIS tables (Ebel et al., 1997), using a GNFR to SNAP matrix. Chemical disaggregation for PM species and VOCs is based on sector and country-dependent split factors proposed by TNO.

Isoprene biogenic emissions are computed online using MEGAN model (Guenther et al., 2012), while other biogenic emissions are computed from CAMS global biogenic emission inventory (version 3.1). NOx soil emissions are taken from the CAMS-GLOB-SOILv2.2 emission inventory.

Concerning biomass burning sources, GFAS emissions are emitted according to an 'umbrella' profile, with a maximum injecting height climatologically determined. GFAS "near real time" observation-based fire emissions are made available with a 8-hr delay. So that when the forecast system is initiated, most GFAS emission cover Day-2 of the forecast to be produced. As a consequence, the 2-day persistence is interpreted in a way that fire emissions are only applied for D+0.

3.9.6 Solver, advection and mixing

The chemical solver used is a semi-implicit solver as presented in (Cariolle and Teyssedre, 2007).

Concerning physical and chemical parameterisations, an operator splitting approach is used. Parameterisations are called alternatively in forward and reverse order, with the objective to reduce systematic errors.

Meteorological forcings are read every 3 hours from IFS input data, and are linearly interpolated to yield hourly values, which is the time-step for advection; smaller time-steps are used for physical processes and chemistry, but the meteorological variables are kept constant over each hour. MOCAGE is based upon a semi-lagrangian advection scheme (Williamson and Rasch, 1989), using a cubic polynomial interpolation in all 3 directions.

For sub-gridscale transport processes, vertical diffusion is treated following (Louis, 1979) and transport by convection is from (Bechtold et al., 2001). Scavenging within convective clouds is following (Mari et al., 2000), allowing to compute wet removal processes directly within the convective transport parameterisation.

3.9.7 Deposition

Wet deposition in stratiform clouds and below clouds follows (Giorgi and Chameides, 1986). A description of MOCAGE surface exchanges module is presented in (Michou et al., 2005). The dry deposition parameterisation relies on a fairly classical surface resistance approach (Wesely, 1989), but with a refined treatment of the stomatal resistance, similar to the one used in

Meteo-France numerical weather prediction models (Noilhan and Planton, 1989). Sedimentation of aerosol follows (Nho-Kim et al., 2004).

3.9.8 Chemistry and aerosols

The MOCAGE configuration for CAMS comprises 118 species and over 300 reactions and photolysis. It is a merge of reactions of the RACM scheme (Stockwell et al., 1997) with the reactions relevant to the stratospheric chemistry of REPROBUS (Lefevre et al., 1994). Aqueous chemistry for the formation of sulphate is represented, following (Ménégoz et al., 2009). Detailed heterogeneous chemistry on Polar Stratospheric Clouds (types I, II) is accounted for, as described in (Lefevre et al., 1994). Other heterogeneous chemistry processes are currently not included.

Photolysis is taken into account using a multi-entry look-up table computed off-line with the TUV software version 4.6 (Madronich, 1987). Photolysis depends on month (including monthly aerosol climatologies), solar zenith angle, ozone column above each cell (as the model extends to the mid-stratosphere, it is actually the ozone profile computed by MOCAGE which is used at every time step), altitude and surface albedo in the UV. They are computed for clear-sky conditions and the impact of cloudiness on photolysis rates is applied afterwards.

The aerosol module of MOCAGE includes the primary species dusts, black carbon, sea salts, organic carbon, and the secondary inorganic species sulphate, nitrate and ammonium. The formation and the multi-phasic equilibrium of inorganic secondary aerosols are modelled by the ISORROPIA-II module. Details on MOCAGE aerosol simulation evaluation can be found in (Martet et al., 2009) for dusts, in (Nho-Kim et al., 2005) for black carbon, and in (Sič et al., 2015) for the latest version of MOCAGE primary aerosol module. The implementation and the evaluation of secondary inorganic aerosols in MOCAGE are described by (Guth et al., 2016). Further improvements of the representation of aerosols in MOCAGE are expected in the future with on-going work regarding organic secondary aerosols.

3.9.9 Assimilation system

MOCAGE operations for CAMS use the assimilation system based upon MOCAGE and PALM (Lahoz et al., 2007). As a first approximation, background error standard deviations are prescribed as proportional to background amounts. In order to spread assimilation increments spatially, background error correlations are modelled using a generalized diffusion operator (Weaver and Courtier, 2001). Several assimilation strategies are available in PALM but for CAMS MOCAGE uses a 3D-VAR technique, with an assimilation window that is 1h every hour.

For surface analyses (NRT, IRA and VRA), MOCAGE assimilates O_3, NO_2, CO, PM_{10} and $PM_{2.5}$ in-situ surface observations. The species are assimilated independently every hour without any cross-species covariances, and then the increments per

species are added to the analysis that serves at initial condition for computing the background of the next hour of the assimilation process, in this reanalysis mode.

An hourly assimilation cycle is also used to update the atmospheric state of aerosols, with the assimilation of French lidars (mini-MPL) and some ceilometers from the European network E-profile in the regional domain of MOCAGE. The quantity modified during the assimilation process is the 3D field of total mass of all aerosol types and all sizes all together. The split per aerosol type and particle size is not modified during the assimilation. This hourly assimilation cycle is the backbone and every day at 00 UTC, the +96h forecast is initialised from this assimilation cycle.

3.10 MONARCH

3.10.1 Model Overview

The MONARCH model is a fully online multiscale chemical weather prediction system for regional and global-scale applications (Badia and Jorba, 2015; Badia et al., 2017; Jorba et al., 2012; Klose et al., 2021; Pérez et al., 2011). The system is based on the meteorological Nonhydrostatic Multiscale Model on the B-grid (NMMB; (Janjic and Gall, 2012)), developed and widely verified at the National Center for Environmental Prediction (NCEP). The model couples online the NMMB with the gas-phase and aerosol continuity equations to solve the atmospheric chemistry processes in detail. The model is designed to account for the feedbacks among gases, aerosol particles and meteorology. Currently, it can consider the direct radiative effect of aerosols while ignoring cloud–aerosol interactions.

3.10.2 Model geometry

The hybrid pressure-sigma coordinate is used in the vertical direction and the Arakawa B-grid is applied in the horizontal direction. The regional model is formulated on a rotated longitude–latitude grid, with the Equator of the rotated system running through the middle of the integration domain, resulting in more uniform grid distances. In the operational regional CAMS forecasts, the model is configured for a regional domain covering Europe and part of northern Africa with a regular horizontal grid spacing on the rotated projection of 0.15º (lower-left corner at 16.37ºN 22.14ºW, upper-right corner at 58.56ºN 88.18ºE) and the top of the domain is set at 50hPa using 24 vertical layers. Surface concentrations of gases and aerosols are derived directly from the first model level; no particular vertical downscaling is implemented. The depth of the first vertical layer of the model is around 45 m and about 7 layers are set below 2 km.

3.10.3 Forcing Meteorology

The forcing meteorology is retrieved from the IFS model on a 0.125°x0.125° horizontal grid resolution (the native resolution is remapped as close as possible to the MONARCH grid to optimise transfer time) with a temporal resolution of 6 hours and dynamically interpolated to the final chemistry grid and time steps using the meteorological component of MONARCH. The IFS forecast released at 12:00UTC of the previous days is used. The meteorological variables obtained from IFS are: Skin temperature, Soil temperature, Soil moisture, Snow depth, Sea-ice mask, Sea-level pressure, U component of the wind, V component of the wind, Temperature, Geopotential height, Relative humidity or specific humidity, Cloud water content.

3.10.4 Chemical initial and boundary conditions

The variables used from chemical species available in the CAMS-Global forecast model are detailed in Table 2. Note that CH_4 is not used from CAMS-Global because the MONARCH chemical mechanism considers a constant CH_4 concentration of 1.85

ppmv. A remapping has been applied to couple the modal distribution of the CAMS-Global aerosols with the aerosols distribution of the MONARCH model (see Table 2). The forecasts are initialised by the model results of the previous day.

3.10.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 2.5.1. The High-Elective Resolution Modelling Emission System version 3 (HERMESv3; (Guevara et al., 2019)) is used to pre-process the anthropogenic, ocean and biomass burning emissions for the MONARCH model. HERMESv3 is an open source, parallel and stand-alone multiscale atmospheric emission modelling framework that processes gaseous and aerosol emissions for use in atmospheric chemistry models.

CAMS_REG-AP NMVOC and $PM_{2.5}$ emissions are speciated using the sector and country-dependent split factors proposed by TNO. In terms of NOx, a fraction of 90% NO and 10% NO_2 is considered for all sectors except for road transport, in which the following fractions are applied: (i) 95% NO, 4.2% NO_2 and 0.8 HONO for gasoline road transport and (ii) 70% NO, 28.3% NO_2 and 1.7% HONO for diesel road transport (Rappenglück et al., 2013). The vertical distribution of anthropogenic emissions is performed following the sector-dependent profiles proposed by TNO. The temporal distribution follows the gridded CAMS-REG-TEMPO v4.1 profiles (Guevara et al., 2021).

The biogenic emissions for NMVOC and NO are computed on-line within the MONARCH model using the Model of Emissions of Gases and Aerosols from Nature version 2.04 (MEGANv2.04; (Guenther et al., 2006)), while monthly oceanic emissions of DMS are obtained from the CAMS-GLOB-OCEA v3.1 dataset (Granier et al., 2019; Lana et al., 2011).

Mineral dust emissions can be calculated online using one of the schemes described in (Klose et al., 2021). For sea salt aerosol emissions, multiple source functions are available (Spada et al., 2013).

Finally, biomass burning emissions (forest, grassland and agricultural waste fires) of organic carbon, black carbon, SO_2, and DMS are taken from the GFASv1.4 dataset. This product reports hourly emissions at a horizontal gridded resolution of 0.1° x 0.1°. The vertical allocation of GFAS emissions is done using the maximum fire plume injection height and distributing uniformly all the emissions across the layers below this height. The persistence of the fires in forecast mode is set to 2 days, afterwards biomass burning emissions are set to zero.

3.10.6 Solver, advection and mixing

Different chemical processes were implemented following a modular operator splitting approach to solve the advection, diffusion, emission, dry and wet deposition, and chemistry processes. In order to maintain consistency with the meteorological solver, the chemical species are advected and mixed at the corresponding time step of the meteorological tracers following the

principles described in (Janjic and Gall, 2012) and references therein. The advection scheme is Eulerian, positive definite and monotone, maintaining a consistent mass conservation of the chemical species within the domain of study. Lateral diffusion is formulated following the Smagorinsky non-linear approach, while vertical diffusion is based on the Mellor–Yamada–Janjic level 2.5 turbulence closure scheme.

The convective mixing, however, is treated differently for aerosols and gases. The scheme implemented for aerosols is described in detail in (Pérez et al., 2011) and follows a relaxation approach similar to the Betts-Miller-Janjic convective parameterization of the NMMB. On the other hand, the convective mixing of gases is solved following the sub-grid cloud scheme of (Foley et al., 2010) as described in (Badia et al., 2017).

3.10.7 Deposition

The deposition processes implemented in the MONARCH model are dry deposition, in-cloud grid-scale, and in-cloud subgrid-scale scavenging for gases and aerosols, and below cloud scavenging for aerosols only.

For gases, the dry deposition scheme follows the classical deposition velocity analogy, enabling the calculation of deposition fluxes from airborne concentrations. The canopy resistance is simulated following (Wesely, 1989). The cloud-chemistry processes are included in the system considering both the sub-grid and grid-scale scheme described in (Foley et al., 2010). The processes included are the scavenging, vertical mixing and wet-deposition. Only in-cloud scavenging is considered in the current implementation (Badia et al., 2017).

Regarding aerosols, the parameterization of the aerosol dry deposition is based on (Zhang et al., 2001) which includes simplified empirical parameterizations for the deposition processes of Brownian diffusion, impaction, interception and gravitational settling. Wet scavenging of aerosols by precipitation is computed separately for convective and grid-scale (stratiform) precipitation. The model includes parameterizations for in-cloud scavenging, and for below cloud scavenging. Detailed description of the schemes can be found in (Pérez et al., 2011).

3.10.8 Chemistry and aerosols

A gas-phase module combined with a hybrid sectional-bulk mass-based aerosol module is implemented in the MONARCH model. The gas-phase chemical mechanism used is the Carbon Bond 2005 chemical mechanism (CB05; (Yarwood. G. et al., 2005)) extended with Chlorine chemistry (Sarwar et al., 2012). The rate constants were updated based on evaluations from (Atkinson et al., 2004; Sander et al., 2006). The photolysis scheme used is the Fast-J scheme (Wild et al., 2000). It is coupled with physics of each model layer (e.g., aerosols, clouds, absorbers as ozone) and it considers grid-scale clouds from the atmospheric driver.

The aerosol module in MONARCH model solves the life cycle of sea salt, dust, organic matter (both primary and secondary), black carbon, sulphate, and nitrate aerosols. While a sectional approach is used for dust and sea salt, a bulk description of the other aerosol species is adopted. A simplified gas–aqueous–aerosol mechanism accounts for sulphur chemistry (Spada, 2015). The production of secondary nitrate–ammonium aerosol is solved using the thermodynamic equilibrium model EQSAM (Metzger et al., 2002). The coarse nitrate production is computed with an uptake reaction of HNO_3 on dust and sea salt coarse particles. The formation of SOA is considered using a simple non-volatile scheme accounting for the contribution of anthropogenic, biomass burning, and biogenic formation (Pai et al., 2020). Hygroscopic growth is considered for all aerosol components except mineral dust.

3.10.9 Assimilation system

The MONARCH assimilation system (MONARCH-DA) is based on a Local Ensemble Transform Kalman Filter (LETKF) scheme (Di Tomaso et al., 2022; Di Tomaso et al., 2017; Escribano et al., 2022; Hunt et al., 2007; Miyoshi and Yamane, 2007; Schutgens et al., 2010) coupled to the model through I/O routines. MONARCH ensemble is created by perturbing anthropogenic, biomass burning, soil and ocean emissions that are pre-processed by HERMESv3 or that are modelled by MONARCH via a physically-based scheme for dust aerosol. For analysis production in CAMS, MONARCH ensemble is run at a horizontal resolution of 0.2° latitude × 0.2° longitude in a rotated grid and initialised by the ensemble forecast of the previous day.

Hourly surface observations from in-situ measurements are currently assimilated operationally for O_3, NO_2, SO_2, CO, PM_{10}, $PM_{2.5}$. For near-real time operational analysis production, previous-day observations are combined with a MONARCH 24-hour ensemble forecast initialised at 12 UTC of the previous day.

3.11 SILAM

3.11.1 Model Overview

The System for Integrated modeLling of Atmospheric coMposition SILAM (silam.fmi.fi) is a global-to-sub-km chemistry transport model developed for a wide range of atmospheric composition and air quality assessment tasks (Sofiev et al., 2015b), emergency decision support applications (Sofiev et al., 2008), and data assimilation and source inversion problems (Vira and Sofiev, 2015; Sofiev et al., 2013). The model incorporates Eulerian and Lagrangian dispersion frameworks (the Eulerian transport routine is used for CAMS) and a set of chemical and physical transformation modules for the troposphere and the stratosphere (Carslaw et al., 1995; Damski et al., 2007; Yarwood. G. et al., 2005; Sofiev, 2000; Sofiev et al., 2010). Apart from the transport and physico-chemical cores described below, SILAM includes a set of supplementary tools including a meteorological pre-processor, input-output converters, reprojection and interpolation routines, etc. In the operational forecasts, these enabled direct forcing of the model by the ECMWF IFS meteorological fields.

SILAM has been extensively evaluated in a variety of regional and global air quality projects (Brasseur et al., 2019; Huijnen et al., 2010; Kouznetsov et al., 2020; Petersen et al., 2019; Sofiev et al., 2015b; Xian et al., 2019) and health impact assessment studies (Korhonen et al., 2008; Kukkonen et al., 2020; Lehtomäki et al., 2018).

3.11.2 Model geometry

The centre points of the model grid cover 25.05°W to 44.95°E and 30.05°N to 71.95°N on a regular latitude longitude grid of 0.1°resolution. Following (Sofiev, 2002), SILAM uses a multi-vertical approach with the meteorology-resolving grid corresponding to the tropospheric part of the IFS vertical: hybrid levels from 69 to 137. The chemical transformations and vertical fluxes are computed based on 10 thick staggered layers, with the thickness increasing from 25 m for the lowest layer to 1000-2000 m in the free troposphere. The layer tops are located at 25, 75, 175, 375, 775, 1500, 2700, 4700, 6700 and 8700m above the surface. Within the thick layers, the sub-grid information is used to evaluate the weighted averages of the high-resolution meteorological parameters and effective diffusion coefficients after (Sofiev, 2002).

3.11.3 Forcing Meteorology

Meteorological forcing is the ECMWF IFS operational forecasts taken from the 12:00UTC forecast of the previous day extracted at a resolution of 0.1° and temporal frequency of one hour for the first 72 hours and three hours for the last day of the forecast. The list of meteorological parameters extracted is: U and V components of 10m wind [m/s], 2m temperature [K], dew point temperature 2m [K] accumulated large scale rain [kg/m^2], accumulated convective rain [kg/m^2], surface roughness [m], total cloud cover [fract], convective available potential energy [J/kg], U and V -wind components at model levels [m/s],

temperature at model levels [K], cloud water at model levels [kg/kg], cloud ice at model levels [kg/kg], specific humidity at model levels [kg/kg], cloud cover at model levels[fract], logarithm of surface pressure.

3.11.4 Chemical initial and boundary conditions

Boundary conditions are taken from the CAMS-Global (see Table 2). The full fields are imported every 3 hours; in-between, the linear interpolation is applied. The forecasts are initialised with the SILAM forecast of the previous day.

3.11.5 Emissions

The common annual anthropogenic emissions CAMS-REG are implemented as explained in Section 3.2. The $PM_{2.5}$ emissions are split into EC, OC and mineral components, and OC is mapped to the volatility bins according to (Shrivastava et al., 2008). Emissions of biogenic VOCs, wind-blown dust, and sea salt are computed online in dedicated SILAM modules (Poupkou et al., 2010; Sofiev et al., 2011; Soares et al., 2016; Sofieva et al., 2022). GFAS hourly emissions from wild-land fires are replicated from D-2 to D+1 for forecast and shut down after; in the analysis mode it is used as is.

Emissions of 6 pollen species are computed online following the heat-sum approach for trees (Sofiev et al., 2015b), climatological season for grasses and mugwort species, and multi-criteria hybrid model for ragweed (Prank et al., 2013).

3.11.6 Solver, advection and mixing

The SILAM Eulerian transport core (Sofiev et al., 2015a) is based on the coupled developments: refined advection scheme of (Galperin and Sofiev, 1994) and vertical diffusion and dry deposition algorithm of (Sofiev, 2002)and (Kouznetsov and Sofiev, 2012). The methods are compatible, in a sense that both use the same set of variables to determine the sub-grid distribution of tracer mass. The approach, in particular, allows computing correct vertical exchange using high-resolution input data but low-resolution chemistry and diffusion grids. The later feature is used in the vertical setup with thick layers.

Diffusion is parameterised following the first-order K-theory based closure. Horizontal diffusion is embedded into the advection routine, which itself has zero numerical viscosity, thus allowing full control over the diffusion fluxes. The vertical diffusivity parameterisation follows the approach suggested by (Groisman and Genikhovich, 1997) and (Sofiev et al., 2010). The procedure diagnoses all the similarity theory parameters using the profiles of the basic meteorological quantities: wind, temperature and humidity. Output includes the value of eddy diffusivity for scalars at some reference height (taken to be 1m).

The model uses process-wise splitting and 1-D advection implementation flipping the order of processes every other time step.

3.11.7 Deposition

Dry deposition parameterisation for gases generally follows the resistive analogy of (Wesely, 1989). Deposition velocities for aerosols are evaluated using the original (Kouznetsov and Sofiev, 2012) algorithm. Wet deposition parameterisation is based on the scavenging coefficient after (Sofiev, 2000) for gas species and follows the generalised formulations of (Kouznetsov and Sofiev, 2012) for aerosols.

3.11.8 Chemistry and aerosols

The main gas-phase chemical mechanism is CB05 with additions for SOx from (Sofiev, 2000) and organics from VBS (Volatility-Basis Set, (Shrivastava et al., 2008)). The heterogeneous scheme is an updated version of the DMAT model scheme (Sofiev, 2000). The formation pathways of secondary inorganic aerosols follow the VBS approach extended with the feedback to the main gas-phase chemical module. The aerosol size distribution is represented via sectional approach, with species-specific bin selections. Each bin is characterised with its lower and upper borders, as well as the mass-mean diameter, which is precomputed / predefined for each bin and species from its size spectrum. Primary anthropogenic aerosols are emitted into bins with mass-mean diameter of 0.5 μm (fine aerosol, dry size) and 6 μm (coarse aerosols, dry size). Secondary inorganic aerosols were put into 0.2 and 0.7 μm bins, plus a separate 3 μm bin for coarse nitrates formed on the sea salt surface. The dust size spectrum is described with 4 bins from 0.3 μm up to 20 μm. Finally, the seasalt spectrum is represented with 5 bins, from 0.05 μm up to 20 μm of mass-mean nominal diameter. Throughout computations, the particles are transported in accordance with their mass-mean diameter corrected with regard to actual humidity and the particle solubility. External mixing is assumed.

3.11.9 Assimilation system

The embedded data assimilation is based on the 3d- and 4d-dimensional variational approach, as well as with the EnKF (Vira and Sofiev, 2012, 2015). Tangent-linear (if needed) and adjoint formulations exist for the transport module, the transformation schemes and for the deposition modules. The assimilation procedure has been tested for both initialising the concentration fields and for refinement of the emission (Sofiev, 2019). The observation operators exist for in-situ observations and for the vertically integrated columns observed by the nadir-looking satellites. For the near-real time operational analyses in CAMS, the previous-day observations are used in a 3D-VAR data assimilation suite. That routine assimilates in-situ observations of NO_2, O_3 and $PM_{2.5}$, PM_{10}, SO_2 and CO.

4 Post-processing

4.1 ENSEMBLE model

All eleven individual operational model deliver their results to the CRPU (Météo-France for NRT/FC and NRT/AN, and INERIS for IRA and VRA, using the product definition introduced in Section 2.2). An ENSEMBLE model is subsequently computed as a median of all available operational models. As explicated in Section 3, there are slight differences in the individual model geometry even if they are as close as possible to the common grid. Five models are operated their forecasts directly on the target grid (CHIMERE, DEHM, EMEP, LOTOS-EUROS, and SILAM), one uses area-weighted interpolation of overlapping polygon (EURAD-IM), and the other models use a bilinear interpolation to deliver model output on the common grid. The ENSEMBLE is computed across all models at each horizontal and vertical grid point of the common grid. Each of the model deliver the full list of required species.

Relying on 11 different models offers a very comprehensive view on the various possible representations of key atmospheric processes relevant to air quality (see the wide range of modelling design detailed in Section 3) and thus a characterisation of the intrinsic modelling uncertainty. The flipside of this diversity is a relatively higher risk of one model not being able to deliver in a timely basis. A median ENSEMBLE is computed everyday no matter how many models are successfully delivered for that given day. A Key Performance Indicator is documented to track the number of models which have delivered on time to be included in the ENSEMBLE for either the analyses or the forecasts (Figure 2). The fact that timeliness of forecast delivery is higher than for analyses might seem counterintuitive as forecast are expected earlier, but this is due to the fact that most analyses are produced later due to the late availability of assimilated observations, and not necessarily used at present as initial conditions of the forecast.

Using the median to compute such an ensemble is a very robust approach to cope with potential missing members, and it has been shown to outperform individual models for average performances (Galmarini et al., 2004). It is however a very conservative approach and developments are ongoing, in particular to improve the skills of the system to capture air quality exceedance detections by making use of machine learning algorithm coupled to the raw CAMS regional forecasts. Firstly, optimised forecasts at observation sites are produced operationally for 4 pollutants (PM10, PM2.5, NO2 and O3) at thousands of AQ e-reporting stations throughout Europe on a daily basis and for the 96hr forecast period. This product is referred to as CAMS-MOS (Model Output Statistics)[6]. The underlying algorithm is a random forest using as predictor air pollutant concentration in the ENSEMBLE CTM as well as meteorological variables (temperature at 2m, relative humidity, wind speed and boundary layer height)(Bertrand et al., 2022). It is trained on a daily basis using the past 3 days of observations. As such,

[6] https://confluence.ecmwf.int/display/CKB/CAMS+Regional%3A+European+Air+Quality+Forecast+Optimised+at+Observation+Sites+data+documentation (accessed 24 April 2025)

CAMS-MOS is a statistical model of the meteorological dependant ENSEMBLE error, which proved very effective in improving the forecast skills in detecting exceedances of air quality information thresholds. Second, an weighted ensemble forecast at the same resolution as the CTMs (10x10km2) has been developed. It consists of an optimum weighting of the 11 models calibrated on the past 7 days, but in this case the weights are constant and uniform and not dependent on meteorological predictors. CAMS-MOS is already available in the ADS as an operational product. But the weighted ensemble is still experimental. With the rapid development of machine learning and artificial intelligence, such experimental products will be further developed in the future.

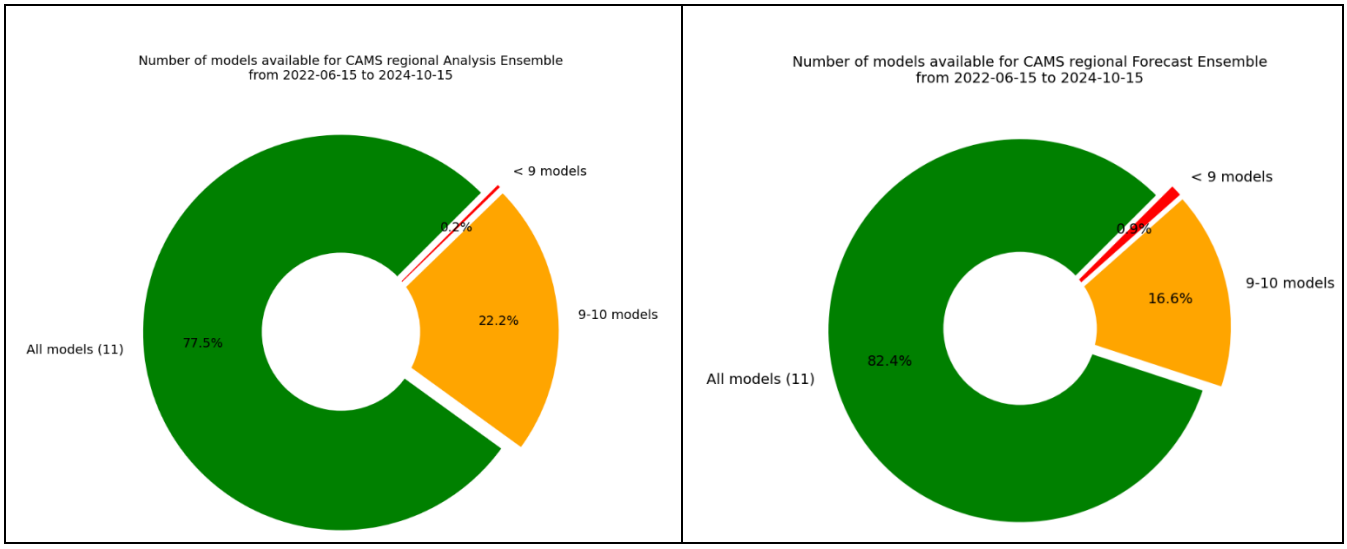

Figure 2: Distribution of the number of operational models having delivered on time to be included in the ENSEMBLE computation for the period 15/06/2022-15/10/2024: left NRT/AN (analysis) and right: NRT/FC (forecasts).

4.2 Evaluation and Quality Control (EQC)

Evaluation and quality control is an essential part of CAMS in order to ensure the reliability and transparency of the products. For all the chemical species where a dense enough monitoring network allows a recurrent and statistically significant evaluation, synthetic performance reports are produced and made available on the CAMS website[7]. These evaluations focus primarily on the surface in-situ air quality regulatory monitoring networks for O_3, NO_2, PM_{10}, and $PM_{2.5}$. For the assimilated products, the evaluation is performed on about one third of the stations, deliberately left out of the assimilation workflow (Section 2.3). The forecasts are evaluated using all available surface stations whose spatial representativity ranges from rural to urban background air quality. The skill scores are updated on a daily frequency and available publicly through an interactive interface on the CAMS EQC pages for the ENSEMBLE and individual models. Quarterly summaries are produced in publicly

[7] https://atmosphere.copernicus.eu/regional-services, last accessed 30/10/2024

available reports. They also include an evaluation of the models in the troposphere against above-surface measurements (aircraft and space borne remote sensing and profiling). For the Interim and Validated reanalyses, the evaluation reports are produced on an annual basis.

The present article is essentially a description of the system rather than a detailed analysis of its performance. Nevertheless, we present here several evaluation diagnostics for illustration purposes. Therefore, the performances of individual models contributing to the ENSEMBLE are anonymised as it would be too complex to enter here in the details of the performances of each model, which relate to intrinsic parametrisations. Such analysis is left for a dedicated future publication, but the interested user can also consult the interactive viewers and reference public reports on the Evaluation and Quality Control website to analyse the performances of individual models.

In Figure 3 we show the root mean square error for surface ozone and PM_{10} taken as the median over each quarter since the beginning of the CAMS production at the end of 2014 and over hundreds of European air quality monitoring stations. The figure is divided in two parts as urban background stations were only included in the evaluation as of fall 2018 (note also that the vertical scales differ). It appears clearly that while the spread of the models was still substantial in the first part of the period, the system has reached a level of maturity since 2017 with more homogeneous performances between the various models and very few outliers. The ENSEMBLE model appears to give better scores overall. It can be surpassed in terms of RMSE in some occasions but not always by the same model, therefore still illustrating the added value of the multi-model ensemble approach. The range of performances is today about 12-18$\mu g/m^3$ for the RMSE (root mean square error) of daily maxima ozone, so that the Key Performance Indicator of 18$\mu g/m^3$ is not always met depending on the models and the season. For PM_{10}, the RMSE is between 5 to 8$\mu g/m^3$ so that the same KPI of 18$\mu g/m^3$ is usually met. Without entering in a more detailed analysis, it is visible that the scores are still gradually improving over the 2018-2023 period. Over the recent years, the median ENSEMBLE seems to produce more systematically better performances and becomes more difficult to beat.

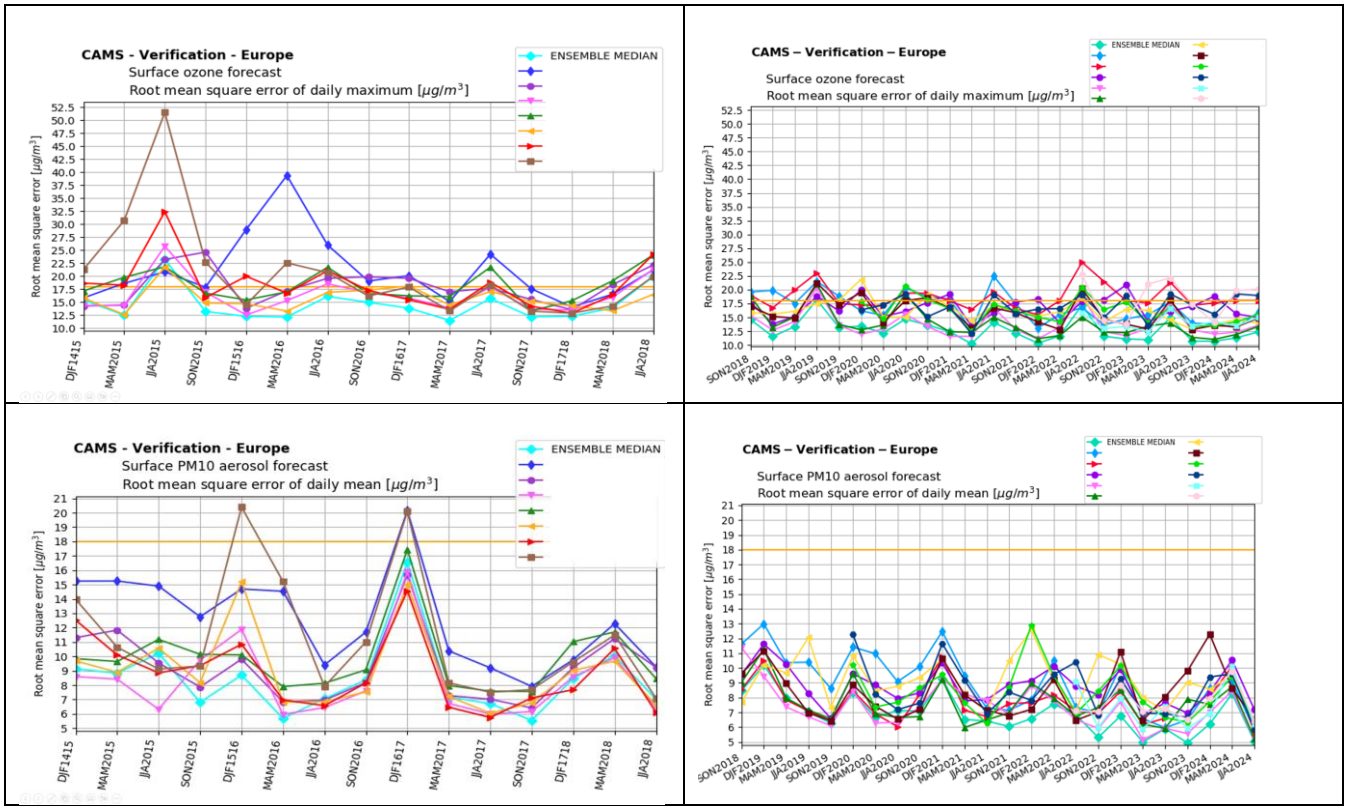

Figure 3: Evolution of the skill scores of the CAMS Regional Air Quality Forecasts (individual models and ENSEMBLE median) between 2014 and 2024 (divided in two parts: before and after 2018 as urban background stations were not included in the evaluation over the first period, and fewer models were available) Each point is the quarterly median of the RMSE (µg/m^3) computed at regulatory air quality monitoring stations for top: daily maximum ozone and bottom: daily mean PM_{10}. The straight yellow line corresponds to the Key Performance Indicator for RMSE of 18µg/m^3.

In the European Air Quality regulation, detrimental air quality situations are identified in terms of various exceedance levels depending on the air pollutants. For PM_{10}, the daily mean concentrations should not exceed 50µg/m^3 more than 35 days (EC, 2008). The performance of the CAMS Regional reanalyses in capturing that threshold can be assessed through the performance diagram presented in Figure 4. On the x-axis the success ratio is the number of hits divided by the number of hits and false alarms. On the y-axis, the probability of detection is the number of hits divided by the number of hits and misses. The dashed lines provide the frequency bias defined as the ratio of the total number of predicted exceedances to the total number of observed exceedances. For this example, for the year 2021, the ENSEMBLE median has the best success ratio, but some individual models outperform in terms of probability of detection. It is not possible to point one single model which would outperform systematically the ENSEMBLE (the best performing model will vary depending on the targeted pollutant, threshold, geographic area, etc.). Therefore the reference product remains the median ENSEMBLE which provides the best

scores for conservative annual average metrics, but interested users can refer to the annual evaluation report to select alternative depending on their specific needs.

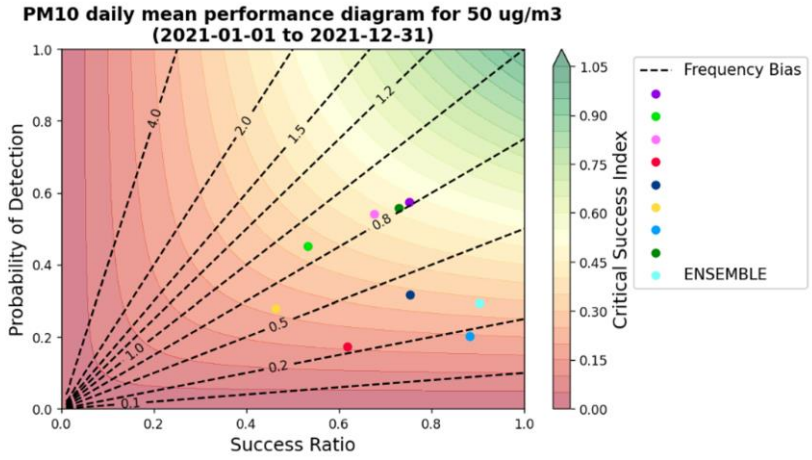

Figure 4: Performance of the CAMS Regional ENSEMBLE and individual models reanalyses in capturing air quality threshold detection for daily mean PM_{10} above 50µg/m^3 in 2021.

An illustration of the evaluation above the surface is provided in Figure 5. The tropospheric column of NO_2 in the CAMS regional ENSEMBLE forecast is compared to the observations from the TROPOMI instrument on board the Sentinel 5p satellite. The higher spatial resolution (approximately 5km) available since the launch of the instrument allows reaching out to urban level NO_2 concentrations therefore providing an excellent opportunity for the evaluation of spatial patterns of air pollution. Beyond surface and total columns, it is also essential to assess the performances of the vertical structure as illustrated for the comparison with ozone soundings in Belgium (Uccle). Here both the regional forecast and analyses are compared to assess the impact of surface assimilation of air quality measurement on the vertical profiles. The CAMS global model forecast is also included along with the CAMS regional ensemble range for the forecast and the analysis. A more detailed analysis of the comparison with satellite data can be found in (Douros et al., 2022).

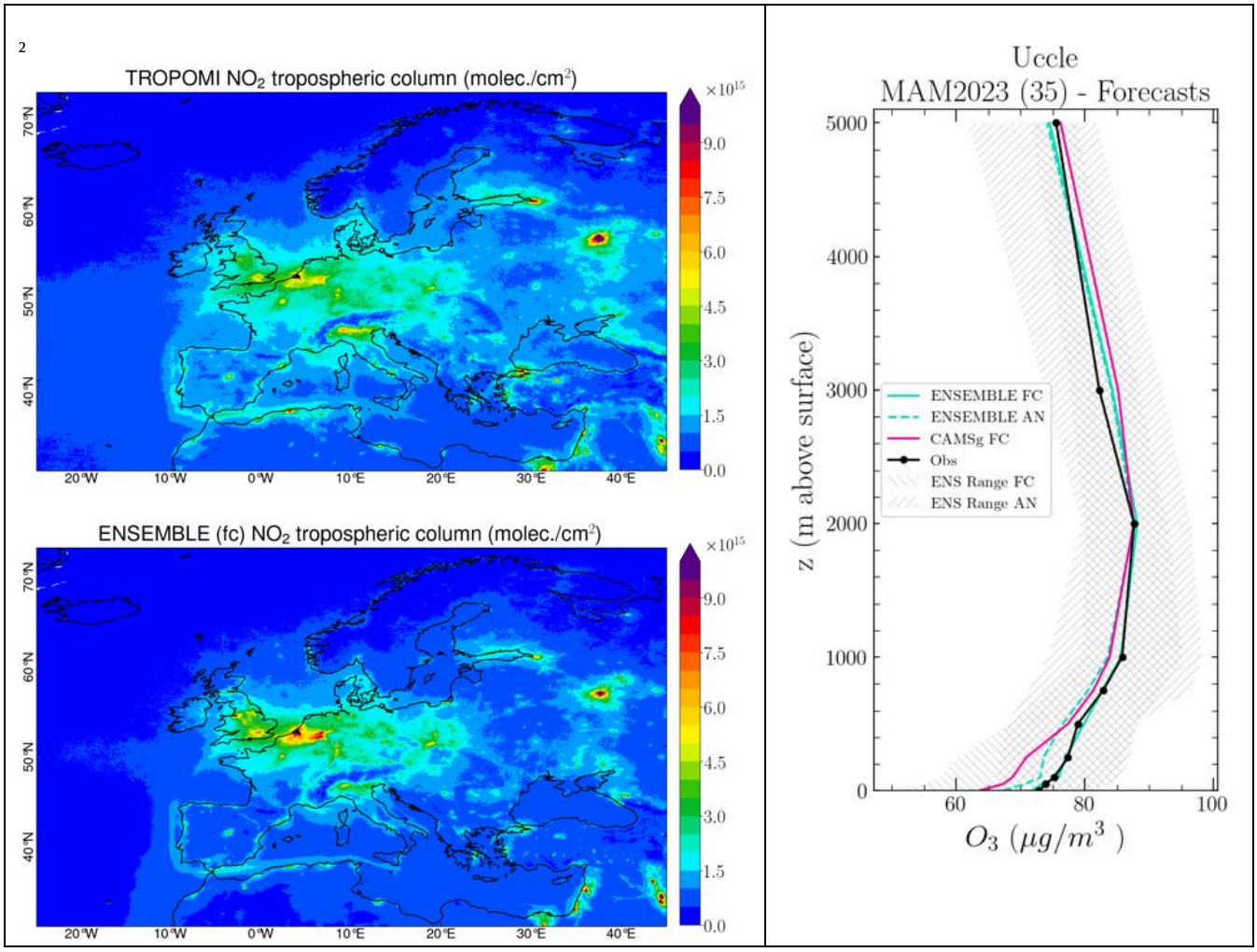

Figure 5: Left: Evaluation over MAM-2023 of the CAMS Regional ensemble forecasts against TROPOMI satellite NO_2 tropospheric columns (10^{15} molecules/cm^2). The CAMS NO_2 profiles have been multiplied with the TROPOMI kernels to remove the dependency on the retrieval a-priori profile shape. Right: Regional and global CAMS forecast and regional analyses of ozone compared to vertical profiles measured with ozone sondes over Uccle, Brussels, Belgium for MAM-2023 (μg/m^3). source: CAMS2_83 Evaluation and Quality Control Service, https://atmosphere.copernicus.eu/regional-services

4.3 Dissemination and further use of the CAMS Regional Products

The results of the CAMS regional production system are made available publicly on the website https://atmosphere.copernicus.eu/european-air-quality-forecast-plots where maps and time series of the various air pollutant and pollen species can be displayed. The results of the median ENSEMBLE as well as each individual model are available for both forecast and analysis products with a three years retention time. Daily means, daily maxima, and hourly fields are available. The list of vertical levels available for interactive plotting on the website is: surface, 100m, 1000m, 3000m and

5000m (note that more vertical levels are available on the ADS). The model spread can also be assessed by selecting any grid point in the map to display the time series of the 4 day forecast including modelled dispersion which provides an information on the uncertainty in the ensemble forecast (Figure 6).

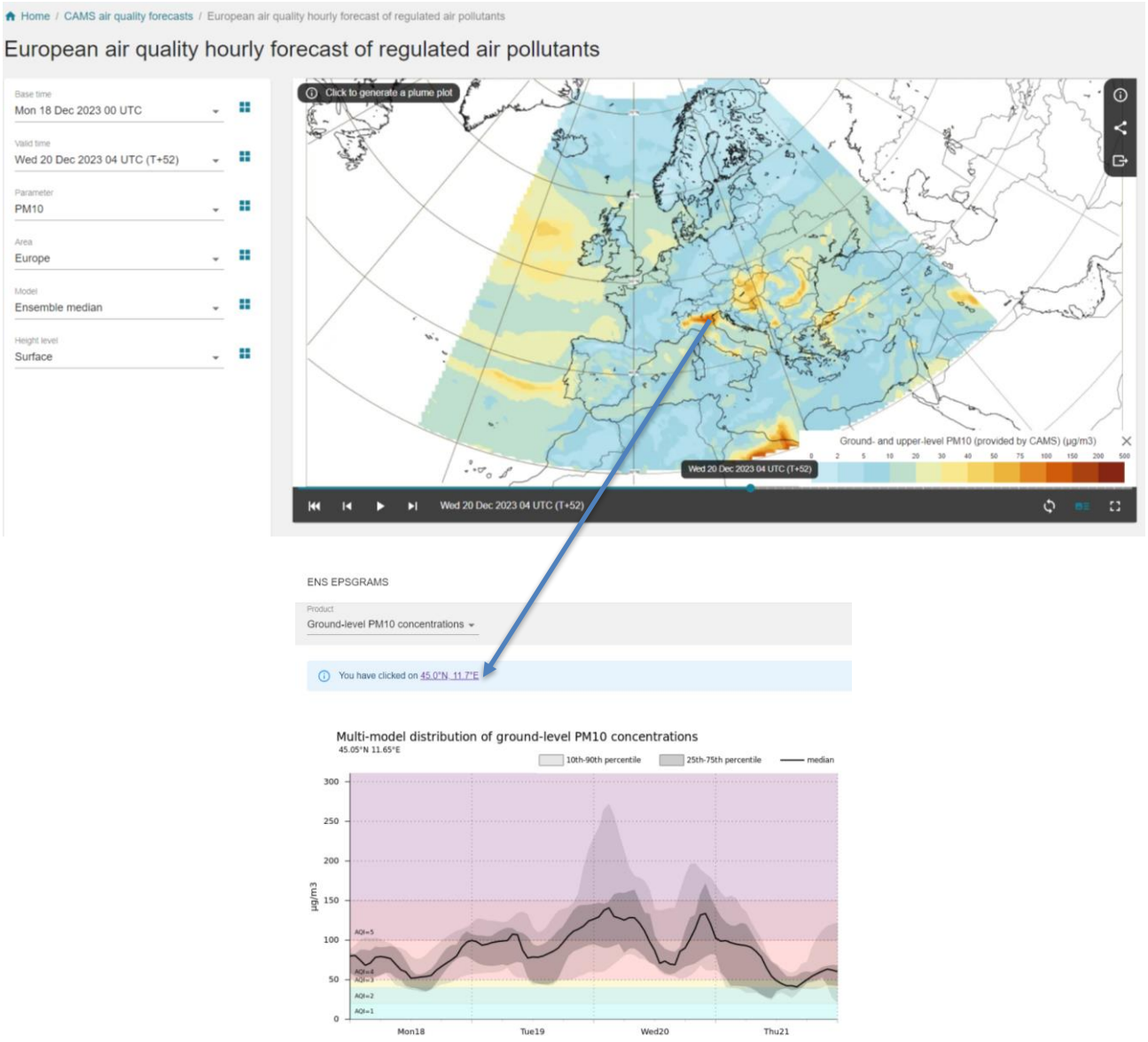

Figure 6: Screenshot of the CAMS Regional Production website displaying air quality forecasts over Europe (atmosphere.copernicus.eu6)

The Copernicus Atmosphere Data Store (ADS) constitutes an important dissemination pathway for the CAMS Regional production system. All the numerical data can be freely retrieved through the website ads.atmosphere.copernicus.eu where automated requests can be built to download entire fields or custom extractions in either grib or netcdf formats.

The typical use of CAMS Regional forecast product is for national and local air quality management agencies to understand the day-to-day air quality situation and anticipate major air pollution events. This can be done either by a qualitative analysis of quicklooks available on the CAMS website or external companies that have developed alternative visualisation tools.

The numerical data obtained on the ADS can also be used as background information for national or local scale air quality modelling applications. Such uses range from the nesting of a Chemistry Transport Model as three-dimensional and hourly concentrations of several chemical species are available in the CAMS Regional Forecast. They can also be used to feed gaussian city-scale surface air quality models. There are also reported uses of the CAMS Regional Forecast to inform machine-learning air quality statistical prediction tools (Bertrand et al., 2022; Petetin et al., 2022).

The use of CAMS Regional reanalyses is rather to inform longer term air quality applications. They can be used as background information for land-use regression models used in air quality policy products or exposure assessment for health impact studies (Horálek et al., 2022). They are also the primary source of information for the Interim Assessment Report produced annually by the CAMS Policy Service and serves as background information for European Member States in the Regulatory Air Quality reporting obligations (Hamer et al., 2023).

5 Conclusion & Perspectives

The regional production of the Copernicus Atmosphere Monitoring Service is today a well-established reference for air quality forecast and analysis in Europe and beyond. It is constituted of a unique ensemble of eleven European Chemistry-Transport models operated in ten countries under the management of a Centralised Regional Production Unit. The system follows strict requirements in order to produce consistent air quality products through the ensemble of individual CTM. Those requirements include in particular forcing fields such as meteorology, chemical hemispheric boundary conditions, and surface fluxes of anthropogenic and wildfire emissions. But the added value of the use of an ensemble of models also lies in the diversity of the modelling strategy. As of today, the ensemble offers a very wide array of choices in terms of model design and structure, as well as regarding the formulation of underlying physical and chemical processes or forcing and coupling at the interfaces (land, sea, biosphere, …).

In the present paper, we provide a comprehensive scientific documentation of the technical characteristics for the common forcing requirements as well as the diversity in modelling design brought about by the individual contributing modelling

groups. We also explained how the billions of data produced on a daily basis are aggregated centrally, evaluated and disseminated for a wide range of air quality applications. The CAMS Service has been operational since the end of 2014 and has reached today a high level of performance and stability. Since 2017 the spread of model performances has converged and it continues to improve gradually over the years.

As an operational service, the Regional Production of CAMS follows closely the research developments in the field of air quality modelling. A substantial part of the model development is undertaken independently by the modelling teams through various research projects and PhD work at national level. The international benchmarking activities (such as the AQMEII or Eurodelta initiatives, (Galmarini et al., 2017; Colette et al., 2017)) are also an important source of information to identify model development priorities. More recently, the European Union has launched a series of research projects devoted to the Evolution of Copernicus in the Horizon Europe Programme[8].

In order to ensure a continuous improvement, the system follows a regular development cycle. The individual models are improved in time so that they remain in the state of the art of chemistry transport modelling. When the progress becomes mature enough, system upgrades are scheduled on a bi-annual basis to allow individual modelling groups to bring their development into the operational model version. These bi-annual upgrades are also the opportunity to carry coordinated changes, such as the regular update of anthropogenic emission fluxes. Through these upgrades, the portfolio of products is also continuously expanding. For instance, in addition to the 19 chemical species already being delivered, the current plan at the time of submission of the present article (i.e. for the year 2024) is to include new PM species such as ammonium nitrate and a tracer of shipping emissions.

A large part of the research effort in relation to the Regional Production is related to Chemistry-Transport deterministic modelling. But there are also interesting prospects in the coupling between machine learning and physical and chemical modelling. The Regional Service already produces operationally optimised forecasts at station level on the basis of Model Output Statistics which relies on Machine Learning to offer unprecedented performance in particular for air quality threshold detection (Bertrand et al., 2022). Novel methodologies to compute the ENSEMBLE model from the eleven individual production and move away from the conservative median approach are also under consideration.

Besides the modelling developments, the uptake of innovative observations is also instrumental in the long-term perspective of CAMS. The production of deposition fluxes is a good illustration of the need to make the best of available observations. While CTMs are producing by nature deposition fluxes, they are not systematically quality checked and therefore the output products are limited at present to ambient air concentrations. A mid-term development is therefore ongoing to benchmark wet

[8] https://atmosphere.copernicus.eu/copernicus-research-whats-horizon

and dry deposition fluxes to ensure their robustness. To achieve this, CAMS relies on the network of deposition data collected in the EMEP network of rural supersites in Europe. But there are also promising prospects in the uptake of near-real-time advanced observations of atmospheric composition at the supersites of the ACTRIS European Research Infrastructure, in particular with regards to particulate matter chemical composition and source apportionment. Lastly, in the outlook of the future perspectives there are also high expectations regarding the uptake of geostationary satellite retrievals with the perspective of the launch of the Sentinel 4 satellite which will bring unprecedented high-frequency atmospheric composition information over Europe.

6 Data Availability

Copernicus is funded under the Copernicus Regulation and operated by ECMWF under the ECMWF Agreement. Access to all Copernicus (previously known as GMES or Global Monitoring for Environment and Security) Information and Data is regulated under Regulation (EU) No 1159/2013 of the European Parliament and of the Council of 12 July 2013 on the European Earth monitoring programme, under the ECMWF Agreement and under the European Commission's Terms and Conditions. Access to all Copernicus information is regulated under Regulation (EU) No 1159/2013 and under the ECMWF Agreement.

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7 Code Availability

Following the Copernicus Programme Data Policy, the Regional Production data and information are available on a full, open, and free-of-charge basis, subject to limitations concerning registration, dissemination formats, and access restrictions. The Copernicus Atmosphere Data Store is located at: https://ads.atmosphere.copernicus.eu/.

The CHIMERE model is available to registered users through the dedicated website at https://www.lmd.polytechnique.fr/chimere/, the actual version used in CAMS is available at https://zenodo.org/records/14724119.

The DEHM model used in CAMS is available at https://zenodo.org/records/14628278.

The EMEP model is available at https://github.com/metno/emep-ctm under the GPLv3 licence. The model version for CAMS is updated once or twice a year in the frame of the regular updates in the CAMS regional service. The current version is https://zenodo.org/records/14507729.

The EURAD-IM version 5.11.1 source code used in CAMS is https://doi.org/10.5281/zenodo.15198902.

The GEM model is a free software that can be redistributed and/or modified under the terms of the GNU Lesser General Public License published by the Free Software Foundation. It is available on a repository administered by Environment and Climate Change Canada at https://github.com/ECCC-ASTD-MRD/gem/. GEM-AQ includes an additional source code tree accessed via an interface routine in GEM. The GEM-AQ code used in CAMS is available at https://zenodo.org/records/14720848.

The LOTOS-EUROS model is available to registered users from the website https://airqualitymodeling.tno.nl/lotos-euros/open-source-version/ the version used in CAMS is available at https://zenodo.org/records/14711996.

The MATCH model as used in CAMS is available at https://zenodo.org/records/14719885.

The FARM code embedded in the MINNI System as used in CAMS is available at https://zenodo.org/records/14650298

The MOCAGE source code used in CAMS is available at https://doi.org/10.5281/zenodo.14625973.

The MONARCH model is available at https://earth.bsc.es/gitlab/es/monarch under the GPLv3 licence. The version used in CAMS is https://zenodo.org/records/5215467.

The SILAM code is available at https://github.com/fmidev/silam-model under the GPLv3 licence. The model is updated several times a year, including two CAMS-related updates. The version used in CAMS is https://zenodo.org/records/14608973.

8 Author Contribution

AC designed and drafted the overall manuscript and coordinated all contributions.

GC, FB, EB, VG, FM, AR, VP, CM, OF, AJ, VHP and LR contributed to drafting the centralised production specifics and general review of the draft.

MA, JA, AB, RB, DB, JB, GB, AC, JHC, FC, IDE, MDI, GD, EDT, JD, JE, HF, YF, JF, EF, LF, MG, CG, GG, MG, AG, JG, RH, MK, JWK, RKo, RKr, ACL, JL, VL, FM, AM, MM, AN, MO, CPGP, JP, AP, BR, LR, AS, MS, PS, DS, MS, AS, JS, CT, RT, TT, ST, ST, AUn, AUp, AV, PvV, LV, ZY contributed to draft the specificities of individual model description.

HE contributed to draft the text on model evaluation

JK, HdvG: contributed to draft the text on emissions.

MR, OF, VP, AR, EB, provided plots and figures

9 Competing Interest

The authors declare that they have no conflict of interest.

10 Acknowledgements

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Table 1: Overview of the main characteristics and configurations of the eleven chemistry-transport models as used in the CAMS Regional Production

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
Discretisation	**Horizontal resolution**	0.1° x 0.1° regular lat-lon	0.1° x 0.1° regular lat-lon	0.1° x 0.1° regular lat-lon	9x9 km Lambert conformal	0.1° x 0.1° lat-lon spherical grid	0.1° x 0.1° regular lat-lon	0.1° x 0.1° regular lat-lon	0.15° x 0.1° regular lat-lon	0.1° x 0.1° regular lat-lon	0.15° x 0.15° rotated regular lat-lon	0.1° x 0.1° regular lat-lon
	number of vertical levels	9	29	20	23	28	12	26	14	47	24	10
	top altitude	500hPa	100hPa	100hPa	100hPa	10hPa	200hPa	8000m	7040m	5hPa	50hPa	8700m
	depth of lowermost layer	20m	20m	50m	35m	20m	20m	45m	40m	40m	40m	25m
	number of lower layers	7 below 2km	12 below 1km	10 in PBL	15 below 2km	14 below 5km	7 below 1km	10 below 850hPa	8 below 1km	8 below 2km	7 below 2km	5 below 1km
Initial & boundary conditions & meteorology	**Meteorological driver**	D-1 00:00 UTC IFS, 3hrly	D-1 12:00 UTC IFS, 3hrly	D-1 12:00 UTC IFS, 3hrly	D-1 12:00 UTC IFS for FC, IFS analysis for AN, 3hrly for FC, 6hrly for AN, downscaled with WRF	D-1 12:00 UTC IFS, 3hrly	D-1 00:00/12:00 UTC IFS, 3hrly	D-1 12:00 UTC IFS, 3hrly	D-1 12:00 UTC IFS, 1hrly	D-1 12:00 UTC IFS for FC, 1hrly (from +00h to +72h), 3hrly (from +72h to +96h) ; D00:00 UTC IFS for AN, 1hrly	D-1 12:00 UTC IFS, 6hrly, downscaled with NMMB	D-1 12:00 UTC IFS, 1hrly (from +00h to +72h), 3hrly (from +72h to +96h)

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
	Boundary values	CAMS-Global	CAMS-Global	CAMS-Global	CAMS-Global	CAMS-Global	CAMS-Global	CAMS-Global	CAMS-Global	CAMS-Global + MOCAGE global for additional species	CAMS-Global	CAMS-Global & SILAM
	Initial values	Previous forecast	Previous forecast	Previous analysis	Previous forecast	Previous forecast	Previous forecast	Previous forecast	Previous forecast	Previous forecast	Previous forecast	Previous forecast
Emissions anthropogenic	**Inventory**	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022	CAMS-REG v6.1 REF2 2022
	Temporal disagregation	TNO	CAMS-REG-TEMPO_v4.1	CAMS-REG-TEMPO_v4.1	CAMS-REG-TEMPO_v4.1	CAMS-REG-TEMPO_v4.1	CAMS-REG-TEMPO_v4.1	GENEMIS	CAMS-REG-TEMPO_v3.2	GENEMIS	CAMS-REG-TEMPO_v4.1	TNO
Emissions: natural & biogenic	**in-domain soil and road dust emissions**	(Marticorena and Bergametti, 1995)	none	(Marticorena and Bergametti, 1995; Marticorena et al., 1997; Dabdub and Seinfeld, 1994; Gomes et al., 2003; Fécan et al., 1998) Road dust emissions currently switched off.	Based on DREAM model	(Marticorena and Bergametti, 1995)	(Marticorena and Bergametti, 1995) and soil moisture inhibition as in (Fécan et al., 1998)	Road dust from (Schaap et al., 2009) and (Omstedt et al., 2005) and mineral dust based on the DEAD model of (Zender et al., 2003) (mainly attributed to the Mediterranean area).	Erosion and resuspension from (Vautard et al., 2005), soil suitable for mobilization parameterized following (Zender et al., 2003)	(Ginoux et al., 2001) and ECOCLIMAP database	Mineral dust scheme based on (Klose et al., 2021) and (Pérez et al., 2011)	SILAM dust source, SILAM sea salt source, Silam BIO-VOC source

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
	in-domain sea-salt emissions	(Martensson et al., 2003) (Monahan, 1986)	(Martensson et al., 2003) (Monahan, 1986)	(Martensson et al., 2003) (Monahan, 1986; Tsyro et al., 2011)	(Sofiev et al., 2011)	(Gong et al., 2003)	(Martensson et al., 2003) {Monahan, 1986 #822	(Sofiev et al., 2011)	(Zhang et al., 2005)	(Sič et al., 2015)	(Jaeglé et al., 2011)	(Sofiev et al., 2011)
	Birch, Grass, Olive, Ragweed,	yes	yes	yes	yes	yes	yes	yes	yes	yes	yes	yes
	Biogenic emissions	MEGAN V2.10 (Guenther et al., 2012)	MEGAN v2.04 (Guenther et al., 2006)	(Simpson et al., 2012)	MEGAN V2.10 (Guenther et al., 2012)	MEGAN-MACC climatology	(Guenther et al., 1993) with detailed tree types for Europe	(Simpson et al., 2012)	MEGAN v2.04 (Guenther et al., 2006)	CAMS-GLOB-BIOv3.1 (Sinderalova et al, 2022) isoprene from MEGAN v2.04 (Guenther et al., 2006)	MEGAN v2.04 (Guenther et al., 2006)	Dynamic biogenic, (Poupkou et al., 2010)
	Soil NOx	MEGAN V2.10 (Guenther et al., 2012)	GEIA (Yienger and Levy, 1995)	CAMS-GLOB-SOIL v2.4 (Simpson et al., 2023)	MEGAN V2.10 (Guenther et al., 2012)	none	(Yienger and Levy, 1995)	none	(Williams et al., 1992)	CAMS-GLOB-SOILv2.2 (Simpson et al, 2021)	MEGAN v2.04 (Guenther et al., 2006)	none
	Wildfires emissions	Hourly emissions from D-2 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	last available 24h cycle over D-2 and D-1 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	Hourly emissions from D-2 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	last available 24h cycle over D-2 and D-1 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	last available 24h cycle over D-2 and D-1 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	Hourly emissions from D-2 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	Hourly emissions from D-1 for AN (D-1) and last available 24h from D-2 and D-1 cycled for FC (D+0 to D+4)	Hourly emissions from D-1 for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	Hourly emissions from D-2 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	Hourly emissions from D-2 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)	Hourly emissions from D-2 cycled for AN (D-1) and FC (D+0 and D+1, zero for the remaining days)

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
Chemistry/Physics	**Gas phase chemistry**	MELCHIOR2 (Derognat et al., 2003), 44 gaseous species and 120 reactions	Modified (Strand and Hov, 1994), 74 species and 158 reactions	EmChem 19a, (Bergström et al., 2022) 127 species and 198 reactions (Simpson et al., 2020a)	RACM-MM (Geiger et al., 2003)	Modified ADOM IIB mechanism, 51 species and 120 reactions	Modified CBM-IV (Schaap et al., 2004)	EmChem 09 (Simpson et al., 2012) and (Langner et al., 1998)	SAPRC 99 (Carter, 2000)	RACM (tropospheric) and REPROBUS (stratospheric)	CB05 (Yarwood. G. et al., 2005)	CBM-IV
	Heterogeneous chemistry	Conversion of NO2 into HNO3 and N2O5 and Conversion of HO2 into H2O2	Oxidation of NO2 by O3 on aerosols	Aerosol-uptake of HNO3, HO2 and to NO3 and O3 and hydrolysis of N2O5(Stadtler et al., 2018)	Hydrolysis of N2O5	Hydrolysis of N2O5	Hydrolysis of N2O5	Hydrolysis of N2O5, aerosol uptake of HNO3 and CH3O2H	none	only relevant for polar stratospheric clouds	Hydrolysis of N2O5 and aerosol uptake of HNO3 on dust and sea salt	Sofiev (2000)
	Aerosol size distribution	10 bins from 10 nm to 40 μm	2 size fractions: PM2.5 and coarse fraction of PM10	2 size fractions: PM2.5 and coarse fraction of PM10	3 log-normal modes: 2 fine + 1 coarse	12 bins from 10nm to 20.5μm	5 size bins for dust and sea-salt, 2 size bins for other aerosols	2 size fractions: PM2.5 and coarse fraction of PM10	3 log3 log-normal model: Aitken, accumulation and coarse	6 bins	8 bins for dust and sea salt. Fine mode for BC, OM, SO4 and NH4. Coarse and fine mode for NO3	2 bins, except for dust (4 bins from 10nm to 30μm) and sea salt (5 bins from 10nm to 30μm)

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
	Inorganic aerosols	(Couvidat et al., 2018): Thermodynamic equilibrium for particles under 1 µm and a dynamic approach for particles above 1 µm. Thermodynamic for the H+-NH4+-SO42--NO3--Na+-Cl--H2O system is based on ISORROPIA 2.1.	(Frohn, 2004)	MARS (Binkowski and Shankar, 1995), thermodynamic equilibrium for the SO4-HNO3-NO3-NH3-NH4-H2O system	thermodynamic equilibrium for the H+-NH4+-SO42--NO3--H2O system (Friese and Ebel, 2010)	(Gong et al., 2003)	ISORROPIA-2 (Fountoukis and Nenes, 2007)	(Mozurkewich, 1993)	ISORROPIA v1.7 (Nenes et al., 1998)	ISORROPIA-2 (Guth et al., 2016)	EQSAM (Metzger et al., 2002)	(Sofiev, 2000)
	Secondary organic aerosols	(Bessagnet et al., 2009)	VBS approach (NPAS scheme of (Bergström et al., 2012a))	VBS approach (NPAS scheme, (Bergström et al., 2012a; Simpson et al., 2012))	updated SORGAM module (Li et al., 2013)	(Jiang, 2003)	not included	VBS schemes for ASOA and BSOA (Bergström et al., 2012a)) (Hodzic et al., 2016)	SORGAM (Schell et al., 2001b)	(Castro et al., 1999)	non-volatile scheme for anthropogenic, biogenic and pyrogenic precursors (Pai et al., 2020)	VBS
	Aqueous phase chemistry	SO2 oxidation by O3 and H2O2	SO2 oxidation by O3 and H2O2 (Jonson et., 2000)	SO2 oxidation by ozone and H2O2 and metal ion-catalyzed O2(Jonson et al., 2000)	10 gas/aqueous phase equilibria, 5 irreversible S(IV) -> S(VI) transformations	SO2 oxidation	SO2 oxidation	SO2 oxidation	SO2 oxidation (Seinfeld and Pandis, 1998)	SO2 oxidation	SO2 oxidation by ozone and H2O2	SO2 oxidation, nitrate formation (Sofiev, 2000), heterogeneous nitrate formation on sea salt particles

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
	Dry deposition: gases	resistance approach (Wesely, 1989)	resistance approach (Simpson et al., 2003; Emberson et al., 2000a)	resistance approach, including non-stomatal deposition of NH3 (Simpson et al., 2012)	resistance approach (Zhang et al., 2003)	resistance approach	resistance approach (Erisman et al., 1994)	resistance approach (Simpson et al., 2012)	resistance approach (Wesely, 1989)	resistance approach (Michou et al., 2005)	resistance approach (Wesely, 1989)	resistance approach (Wesely, 1989)
	Dry deposition: aerosols	gravitational settling	gravitational settling (Simpson et al., 2003; Emberson et al., 2000a)	(Simpson et al., 2012; Venkatram and Pleim, 1999)	resistance approach (Petroff and Zhang, 2010)	gravitational settling	(Zhang et al., 2001)	resistance approach (Simpson et al., 2012)	gravitational settling (Binkowski and Shankar, 1995)	(Sič et al., 2015)	(Zhang et al., 2001; Pérez et al., 2011)	(Kouznetsov and Sofiev, 2012)
	Wet deposition	In-cloud scavenging for all gas/aerosols is taken into account. Below cloud by rain and snow falls is taken into account for soluble gas (HNO3, H2O2) and particles	(Simpson et al., 2003)	In-cloud and sub-cloud scavenging ratios for gases; in-cloud scavenging ratios and sub-cloud scavenging efficiencies for aerosols. (Berge, 1993; Simpson et al., 2012)	CMAQ (Salameh et al., 2007)	Below cloud scavenging for soluble gas species and aerosols	(Banzhaf et al., 2012)	gases: species dependent in-cloud and sub-cloud scavenging ratios; particles: in-cloud scavenging ratio, sub-cloud scavenging (Berge, 1993) and (Simpson et al., 2012)	(Simpson et al., 2003)	Convective: (Mari et al., 2000) Stratiform: (Giorgi and Chameides, 1986),(Slinn et al., 1978; Slinn, 1983)	(Foley et al., 2010; Pérez et al., 2011)	SILAM
Assimilation	**Assimilation method**	Kriging-based analysis	3D-Var	Intermittent 3d-var	Intermittent 3d-var	Optimal Interpolation	ENKF	Intermittent 3d-var	Optimal Interpolation	3D VAR	LETKF (Di Tomaso et al., 2017)	Intermittent 3d-var

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
	Assimilated surface pollutants	NO2, O3, PM2.5, PM10, CO, SO2	NO2, O3, CO, SO2, PM2.5, PM10	NO2, O3, SO2, CO, PM2.5, PM10	NO2, O3, CO, SO2, PM2.5, PM10	NO2, O3, PM2.5, PM10, CO, SO2	NO2, O3, PM2.5, PM10	NO2, O3, CO, SO2, PM2.5, PM10	NO2, O3, CO, SO2, PM2.5, PM10	NO2, O3, PM2.5, PM10	NO2, O3, CO, SO2, PM2.5, PM10	NO2, O3, CO, SO2, PM2.5, PM10
	assimilated satellite	none	none	NO2 (OMI) until 2021, currently disabled	currently none	none	NO2 (OMI) until 2021	none	none	ground-based lidars from French network, ceilometers from e-profile, SO2 Tropomi	none	none
	Assimilation of concentrations	Yes	Yes	Yes	Yes	Yes	None	Yes	Yes	Yes	Yes	Yes
	Assimilation of emissions	None	None	None	None	None	Yes	None	None	None	None	None
	Assimilation of deposition	None	None	None	None	None	Yes	None	None	None	None	None
	Assimilation of other processes	None	None	None	None	None	Ozone top boundary	None	None	None	None	None

		CHIMERE	DEHM	EMEP	EURAD-IM	GEM-AQ	LOTOS-EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
	Frequency of assimilation	Hourly	Hourly	Hourly	Hourly	Hourly	Hourly	Hourly	Hourly	Hourly	Hourly	Hourly

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Table 2: Overview of the matching between chemical species used as boundary conditions from the CAMS-Global model and the eleven regional models of the CAMS Regional production

CAMS-Global	CHIMERE	DEHM	EMEP	EURAD	GEM-AQ	LOTOS EUROS	MATCH	MINNI	MOCAGE	MONARCH	SILAM
aermr01 (wet) (sea salt 0.03-0.5 µm radius)	sea salt bins 3 to 5	SS_25= aermr01/ 4.3+ 0.5*aermr02/4.3	SS_25= aermr01/ 4.3+ 0.5*aermr02/4.3	not used	not used	SS bins 1=aermr01/4.3 (where SS_25 = SS bin 1 and 2)	SS_25=aermr01/4.3+0.4*aermr02/4.3	SS bin [1-2.5µm] = aermr01/ 4.3+0.40 *aermr02 /4.3	SS bins 1-6 = aermr01/ 4.3	SS bin 1=0.34*aermr01/4.3 SS bin 2=0.30*aermr01/4.3 + 0.02*aermr02/4.3	SS bin 0.5µm = aermr01/ 4.3
aermr02 (wet) (sea salt 0.5-5 µm radius)	sea salt bins 6 to 8	SS_co= 0.5*aermr02/4.3	SS_co=0.5*aermr02/4.3	not used	not used	SS bins 2=0.1*aermr02/4.3 SS bins 3=0.2*aermr02/4.3 SS bins 4=0.4*aermr02/4.3 SS bins 5=0.3*aermr02/4.3	SS_co=0.6*aermr02/4.3	SS bin [2.5-10µm] = 0.60*aermr02/4.3	SS bins 1-6 = aermr02/ 4.3	SS bin 3=0.13*aermr02/4.3 SS bin 4=0.18*aermr02/4.3 SS bin 5=0.35*aermr02/4.3 SS bin 6=0.32*aermr02/4.3+ 0.06*aermr03/4.3	SS bin 3µm = aermr02/ 4.3
aermr03 (wet) (sea salt 5-20 µm radius)	sea salt bin 9	not used	not used	not used	not used	not used	not used	not used	SS bins 1-6 = aermr03/ 4.3	SS bin 7=0.40*aermr03/4.3 SS bin 8=0.54*aermr03/4.3	SS bin 9µm = 0.5*aermr02/4.3 SS bin 20µm = 0.5*aermr02/4.3
aermr04 (dust 0.03-0.55 µm radius)	dust bins 4 to 6	DUST_25=aermr04+ aermr05	DUST_25= aermr04+ aermr05	DUST_acc=0.05 total CAMS-Global dust, DUST_coa=0.95 total CAMS-Global dust	dust bins 3-7	dust bin 1 = 0.2*aermr04+ 0.2*aermr05 dust bin 2 = 0.8*aermr04+ 0.8*aermr05	dust_25= aermr04+ aermr05+ 0.11*aermr06	dust bin [1-2.5µm] = aermr04+ aermr05+ aermr06* 0,11	Dust bins 1-6	DUST bin 1 = 0.03 * aermr04 DUST bin 2 = 0.14 * aermr04	Dust 0.3µm = 0.4*aermr04 Dust 1.5µm = 0.6*aermr04

aermr05 (dust 0.55-0.9 µm radius)	dust bin 7	not used	DUST_25= aermr04+ aermr05	DUST_acc=0.05 total CAMS-Global dust, DUST_coa=0.95 total CAMS-Global dust	dust bins 8		dust_25= aermr04+ aermr05+ 0.11*aermr06	used above in dust bin [1-2.5um]	Dust bins 1-6	DUST bin 3 = 0.82 * aermr04 + 0.11 * aermr05	Dust 6µm = aermr05
aermr06 (dust 0.9-20 µm radius)	dust bins 7 to 10	DUST_co = 0,4*aermr06	DUST_co =0,4*aermr06	DUST_acc=0.05 total CAMS-Global dust, DUST_coa=0.95 total CAMS-Global dust	dust bins 9-12	dust bin 3 = 0.08*aermr06 dust bin 4 = 0.16*aermr06 dust bin 5 = 0.16*aermr06	dust_co= 0.44*aermr06	dust bin [2.5-10µm] = aermr06* 0,44	Dust bins 1-6	DUST bin 4 = 0.89 * aermr05 + 0.01 * aermr06 DUST bin 5 = 0.11 * aermr06 DUST bin 6 = 0.23 * aermr06 DUST bin 7 = 0.50 * aermr06 DUST bin 8 = 0.14 * aermr06	Dust 6µm = 0.4*aermr06 Dust 20µm = 0.6*aermr06
aermr07 hydrophilic OM	PPM bins 3 to 6	not used	not used	80% accumulation mode, 20% Aitken mode	OC bins 1-12	POM_25	EC_25=0.7*aermr07; EC_co=0.15*aermr07	AORPA bin 0-1µm = 0,00050* aermr07+ 0,00050* aermr08 AORPA bin 1-2.5µm = 0,44955* aermr07+ 0,44955* aermr08 AORA bin 0-1µm = 0,00050* aermr07 + 0,00050* aermr08 AORA	OC bins 1-6	hydrophilic POM	Non-volatile bin of organic aerosol

								bin 1-2.5µm = 0,49950* aermr07 + 0,49950* aermr08			
aermr08 hydrophobic OM	PPM bins 3 to 6	not used	not used	80% accumulation mode, 20% Aitken mode	OC bins 1-12	POM_25	EC_25=0.7*aermr08; EC_co=0.15*aermr08	AORB bin 0-1µm = 0,00010* aermr07 + 0,00010* aermr08 AORB bin 1-2.5µm = 0,09990* aermr07 + 0,09990* aermr08	OC bins 1-6	hydrophobic POM	Non-volatile bin of organic aerosol
aermr09 hydrophilic BC	PPM bins 3 to 6	BCfresh	not used	70% accumulation mode, 30% Aitken mode	BC bins 1-12	EC_25	OC_25=0.7*aermr09 OC_co=0.15*aermr09	AEC bin 0-1µm = 0,0011*aermr09+0,001*aermr10	BC bins 1-6	hydrophilic BC	EC
aermr10 hydrophobic BC	PPM bins 3 to 6	BCaged	not used	70% accumulation mode, 30% Aitken mode	BC bins 1-12	EC_25	OC_25=0.7*aermr10 OC_co=0.15*aermr10	AEC bin 1-2.5µm = 0,999*aermr09+0,999*aermr10	BC bins 1-6	hydrophobic BC	EC
aermr11 Sulphate Aerosol	SO4 bins 3 to 6	SO4	SO4	90% accumulation mode, 10% Aitken mode	SO4 bins 1-12	SO4_25	SO4	SO4 bin 0-1µm = 0,001*aermr11 SO4 bin 1-2,5µm = 0,999*aermr11	MOCAGE-global	SO4	SO4 split equaly on 2 modes
aermr16 Nitrate fine mode	not used	not used	NO3_F (0-2.5 µm)	90% accumulation mode, 10%	not used	NO3_25	NO3_f	NO3 bin 0-1µm = 0,001*aermr16 NO3 bin	MOCAGE-global	not used	not used

				Aitken mode				1-2,5µm = 0,999*aermr16 + 0,55*aermr17			
aermr17 Nitrate coarse mode	not used	not used	NO3_C (2.5-10 µm)	not used	not used	NO3_co	NITRATE(coarse)	Coarse unspecified =0.45*aermr17	MOCAGE-global	not used	not used
aermr18 Ammonium	not used	not used	NH4_F (0-2.5 µm)	90% accumulation mode, 10% Aitken mode	not used	NH4_25	NH4_f	NH4 bin 0-1µm = 0,001*aermr18 NH4 bin 1-2,5µm = 0,999*aermr18	MOCAGE-global	not used	not used
aerm19 Biogenic SOA	OM	OM	not used	not used	BSOA	not used	SOA	BSOA	BSOA	not used	BSOA
aerm20 Anthropogenic SOA	OM	OM	not used	not used	ASOA	not used	SOA	ASOA	ASOA	not used	ASOA
CHOCHO (Glyoxal)	CHOCHO	not used	CHOCHO	CHOCHO	CHOCHO	not used	CHOCHO	CHOCHO	CHOCHO	not used	CHOCHO
C2H6 (ethane)	C2H6	C2H6	C2H6	C2H6	C2H6	not used	C2H6	ALK1	MOCAGE-global	C2H6	2xPAR5
C5H8 (isoprene)	C5H8	C5H8	C5H8	C5H8	C5H8	C5H8	C5H8	C5H8	MOCAGE-global	C5H8	C5H8
CH4_c (methane)	CH4	not used	CH4	not used	CH4	CH4	CH4	CH4	MOCAGE-global	not used	not used

CO (carbon monoxide)	CO	CO	CO	CO	CO	CO	CO	CO	CO	CO	CO
GO3 (ozone)	O3	O3	O3	O3	O3	O3	O3	O3	O3	O3	O3
H2O2 (hydrpogen peroxyde)	not used	not used	not used	H2O2	H2O2	not used	seasonal climatological conc used	not used	MOCAGE-global	H2O2	not used
HCHO (formaldehyde)	HCHO	HCHO	HCHO	HCHO	HCHO	HCHO	HCHO	HCHO	MOCAGE-global	HCHO	HCHO
HNO3 (nitric acid)	HNO3	HNO3	HNO3	HNO3	HNO3	HNO3	HNO3	HNO3	MOCAGE-global	HNO3	HNO3
NO (nitrogen monoxide)	not used	NO	NO	NO	NO	NO	NO	NO	MOCAGE-global	NO	NO
NO2 (nitrogen dioxide)	NO2	NO2	NO2	NO2	NO2	NO2	NO2	NO2	MOCAGE-global	NO2	NO2
PAN (Peroxyacetyl nitrate)	PAN	PAN	PAN	PAN	PAN	PAN	PAN	PAN	MOCAGE-global	PAN	PAN
SO2 (Sulphur dioxide)	SO2	SO2	SO2	SO2	SO2	SO2	SO2	SO2	SO2	SO2	SO2

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