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Integration of the emissions and smoke dispersion models in the European Forest Fire Information System

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Abstract

Since 2000, the European Forest Fire Information System (EFFIS) has provided continuous support and statistics on wildland fire events. The monitoring system covers all the European Countries, North Africa and the Mediterranean Countries of the Middle East, and provides information on the various aspects involved in the fire events, from fire danger forecasting to post-event analysis. One of the major impacts on the environment produced by the wildland fires is the atmospheric pollution. Currently, in EFFIS the only available information on this impact is the amount of atmospheric emissions for each fire event. The current emissions model is static and does not take into account the fire behavior during the event; moreover, it cannot distinguish the contribution of flaming and smoldering fire to the emissions. The workgroup in EFFIS is working on the current atmospheric pollution assessment system to provide a new and improved emissions model integrated with a smoke dispersion model that simulates the distribution of the pollutants in the impacted area. The new emissions estimation model will take as input the evolution of the fire events, a map of the fuel classes and forest types, a digital elevation model and the meteorological data covering the whole Europe. Based on these input data, the new emissions model simulates the behaviour of the fire using the NEXUS, FOFEM5 and CONSUME3 models, calculates the impact of the fire on the fuels and provides an assessment of the ensuing emissions. The new emissions module provides an assessment of the major pollutants emitted by fires, such as CO₂, CO, CH₄, PM_{2.5}, PM₁₀. Large wildfires, although not very frequent, are responsible for a remarkably high percentage of the overall annual burnt area in Europe, with the highest emissions per fire event. In this paper, we present the results of the emissions estimations on the study case of a representative large wildfire event that took place in Zamora (Spain) during the 2017 fire season. The dispersion model, developed along with the new emissions module, takes as an input the output of the emissions model and provides a simulation of the dynamic of the smoke plume for each of the aforementioned pollutants. The dispersion module is a framework of integrated models able to estimate the dispersion of fire plumes in the atmosphere in 3D grid format. There are four main modules: WRF is dedicated for the computation of the meteorological background data, SWIFT for the higher resolution focus on a specific study area, CHIMERE for the assessment of the concentration of the background pollutants at regional scale,

and SCICHEM for the simulation at local scale of the smoke plume of a selected event. The output of the model is a series of NetCDF files (one for each of the pollutants taken into account) that simulate the 3D spatial and temporal development of the smoke plume. The application of the dispersion model on the Zamora study case shows an example of the output product.

Keywords: Forest fires; Wildfires; Atmospheric emissions modelling; Pollutant dispersion; EFFIS.

1. Introduction

Since 2000, the European Forest Fire Information System (EFFIS, <http://effis.jrc.ec.europa.eu/>) of the European Commission, Joint Research Centre (JRC) has systematically delivered information and statistics of burnt areas mapped from satellite imagery (San-Miguel-Ayanz *et al.*, 2013). It is a complex monitoring system covering all the European Countries, North Africa and the Mediterranean Countries of the Middle East. EFFIS is able to collect and disseminate information on the many aspects involved in the fire events, from fire danger forecasting to post-event analysis.

The impact of forest fires on air quality is progressively concerning the population of the main affected areas (Cornwall, 2018; Finlay *et al.*, 2012; Carvalho *et al.*, 2011; Stefanidou *et al.*, 2008). Forest fire smoke can be synonymous of severe crisis, which in recent years increased the number of hospitalizations for respiratory diseases (Wegesser *et al.*, 2009; Ignotti *et al.* 2010). The integration of the new fire emissions and smoke dispersion modules in EFFIS will provide improved tools for air quality assessment both at local and European scale. The new emissions module will take into account the evolution of the burned areas mapped on a daily basis, and provides an assessment of the major pollutants emitted by fires, such as CO₂, CO, CH₄, PM_{2.5}, and PM₁₀. The output of the new emissions module will be the input of the dispersion module, which provides the dynamic of the smoke plume for each of the aforementioned pollutants on selected severe fire events. The objective of this paper is to describe the components and the workflow of the new emissions and dispersion models, and to present their application on a study case.

2. Emissions module

2.1. Module description

The current version of the emissions module in EFFIS estimates the concentration of pollutants (Barbosa *et al.*, 2008; Monteiro *et al.*, 2014) relying on classical methodologies of fuel map-based computation and constant burning efficiencies given by fuel types (San Miguel *et al.*, 2011). In order to better reproduce the complex behaviour of the phenomenon, this model has been restyled, updated and integrated in recent years.

In the new version of the model, a richer set of features is considered:

- Burnt areas and their evolutions provided by EFFIS daily mapping (in the current model only the final burnt area is considered);
- Digital Terrain Model, fuel composition (JRC forest types static maps) and meteorological data from the European Centre for Medium-Range Weather Forecast (ECMWF);
- Evaluation of the key variables fuel moisture (provided by the Live Fuel Moisture Content, LFMC model), fireline intensity and fire rate of spread (NEXUS model, Scott, 1999, Scott and Reinhardt, 2001);
- Assessment of burning efficiencies and amounts of fuel burned or consumed during the different combustion phases (provided by the models CONSUME3, Prichard *et al.*, 2005, Ottmar *et al.*, 1993; and FOFEM5, Keane *et al.*, 1995, Reinhardt and Dickinson, 2010, Prichard *et al.*, 2014);

- Emissions estimations from burned fuel loadings applying emission factors taken from the “European biomass burning” (Miranda *et al.*, 2005).

The workflow of the module is represented in Figure 1. The main application of the Emissions module is the daily estimation of the pollutants, which is based on the preliminary mapping of the burnt areas. It is scheduled at 1:00 AM of the day following a burnt area detection, and takes into account the perimeters detected during the previous day. As the definition of the perimeters can be reviewed and corrected, a second typology of the module usage is the reanalysis mode, which consists of a simulation run usually performed at the end of a fire season. The reanalysis mode takes as an input the final perimeters in order to obtain the definitive assessment of the emissions.

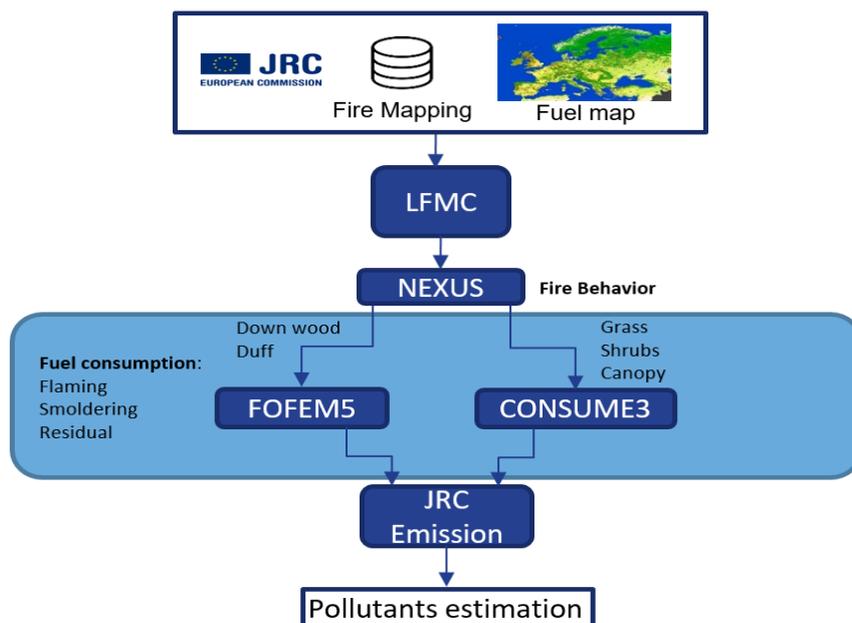


Figure 1 - Emissions module workflow.

When applied for the evaluation of the emissions produced within a burnt area, the new emissions module provides a shapefile with the geometry of the input burnt areas and lists in the associated attribute table the estimated concentrations of the pollutants. For each of these polluting components (Table 1), the module simulates the evolution of the concentrations produced (measured in 10^3 kg) over the day of fire activity with a time step of three hours (from 0 to 24). Compared to the current model, the new version expands the set of output variables and provides an assessment for the SO_2 , NH_3 , BaP, LVGC pollutants (see list on Table 1).

Table 1 - List of the variables (aggregated) reported in the emissions simulation module.

Variable	CO₂	CO	CH₄	PM_{2.5}	PM₁₀	NMHC	VOC
Extended name	Dioxide carbon	Monoxide carbon	Methane	Particulate matter ≤ 2.5 μm	Particulate matter ≤ 10 μm	Non-methane hydrocarbons	Volatile Organic Compounds
Variable	NO_x	OC	BC	SO₂	NH₃	BaP	LVGC
Extended name	Nitrogen Oxides	Organic carbon	Black Carbon	Sulphur dioxide	Ammonia	Benzo(a)-pyrene	Levo- glucosan

As ancillary information, the module also reports the following variables:

- Fire intensity (in $kW m^{-2}$), which is used as input in the dispersion module to estimate the maximum height of injection of the emissions in the atmosphere;

- Fuel consumption in the fire phases of flaming (fire front) and smouldering (after the passage of the fire front), expressed in kg of fuel / 3hours;
- Area increase over each 3 hours time step, assumed proportional to the 3 hours average rate of spread of the fire, expressed in m² / 3hours.

2.2. Study case results

In cases where the fire event takes two or more days of burning activity, and as long as the clouds conditions and smoke presence allow constant monitoring, the mapping activity can theoretically detect the evolution of the event on a daily basis. When these conditions are present, the emissions module estimates the amount of emissions for each day of the mapping.

As an example of the emissions and dispersion modules application, in this paper we report the test case of the fire that took place in Zamora province (Spain) during the day 29/07/2017 and concluded on 30/07/2017 (Figure 2). This study case is representative of a large wildland fire in Europe. Although the number of large wildfires represent a small proportion of the total fire events in Europe, their impact is disproportionately high. Large wildland fires are also the most endangering and impactful for the population. In the Fire Database of EFFIS (a repository of over 2 million individual fire records from 24 countries in Europe and North Africa), the wildfires larger than 1000 ha represent only 0.1 % of the recorded fire events, but are responsible for 30 % of the total burnt area. Only less than 0.02 % of the wildfires spread over 3000 ha: however, this small percentage contributes 16 % of the total damaged area in Europe (Camia *et al.*, 2014; de Rigo *et al.*, *in prep.*).

The wildfire in Zamora spread over a total burnt area of 3087 ha (EFFIS source). In this case, it was not possible to follow the evolution of the fire during the development of the event due to smoke plume coverage on the area, which impeded the constant monitoring during the days of activity, and the speed of the fire spread and consumption.

Table 2 reports the output of the new fire emissions model, along with those provided by the static model currently used by EFFIS for the emissions assessment. For the variables SO₂, NH₃, BaP, LVGC there is no information provided by the current model and no comparison was therefore possible.

Table 2 - Emissions estimations for the test case of wildfire in Zamora province (Spain).

Variable	CO ₂	CO	CH ₄	PM _{2.5}	PM ₁₀	NMHC	VOC	NO _x	OC	BC	SO ₂	NH ₃	BaP	LVGC
New emission model (kg · 10 ³)	69180	3450	139	335	374	387	263	233	228	37	49	25	1	15
Static model (kg · 10 ³)	54875	2466	126	238	281	102	123	172	140	16	-	-	-	-
Variation Static → New (%)	26	40	10	41	33	279	114	36	63	128	-	-	-	-

In the described study case, the new emissions model provides values of pollutant emissions greater than those estimated by the current one. The most remarkable increases are those recorded on NMHC, VOC and BC, for which the estimations result higher than 100% compared to the ones of the current model. The consistency of the increase may be due to the contribution brought by the smouldering fire, which is taken into account with the new model.

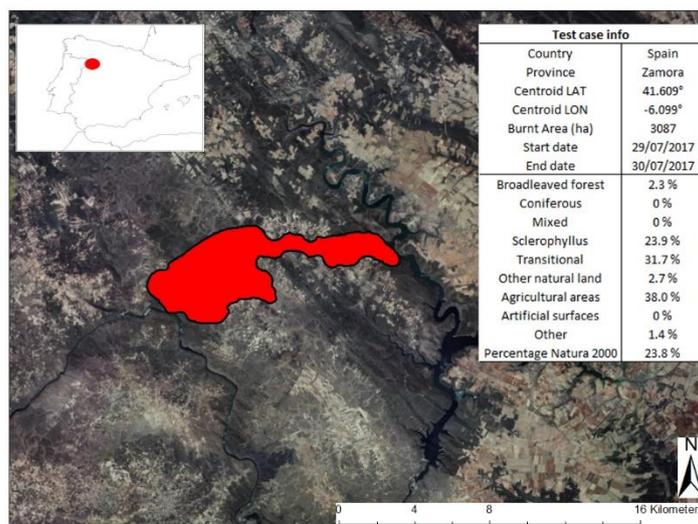


Figure 2 - Localization, shape and ancillary information on the test case in Zamora (Spain).

3. Dispersion module

3.1. Module description

The smoke plume dispersion module is a new feature developed along and integrated with the new emissions module. It consists of a framework of integrated models that take as input the emissions generated by the new emissions module, and simulates over time in 3D grid format their dispersion plumes in the atmosphere. The processing is applied only on selected severe wildland fire events, for which the smoke plume modelling or post-event analysis is of particular interest. The four main modules of the framework are:

- WRF: Weather Research and Forecasting model;
- CHIMERE: Chemistry-transport model;
- SWIFT: Stationary Wind Field and Turbulence;
- SCICHEM: Second-order Closure Integrated puff model with CHEMistry.

The WRF model (Michalakes *et al.*, 2005) is assigned to the computation of the meteorological background data at regional scale (European continent), and SWIFT to the local focus on a specific selected study area. The concentration of the pollutants is then assessed by CHIMERE (Bessagnet *et al.*, 2004) (for the regional pollutant background assessment), while the evolution of the plume at local scale by SCICHEM (Chowdhury *et al.*, 2015) (Figure 3). The final output of the dispersion module is a series of Network Common Data Form (NetCDF) files (one for each of the pollutant emissions generated by the emissions module) that simulate the 3D spatial and temporal development of the smoke plume with a time step of 3 hours.

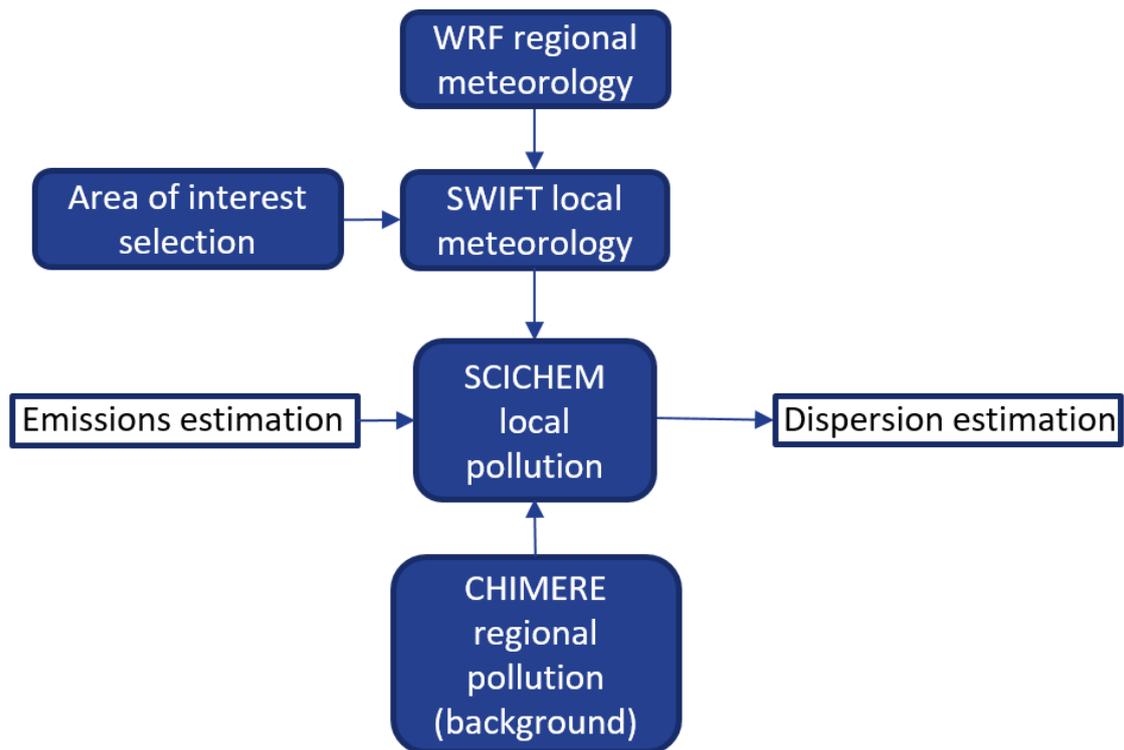


Figure 3 - Dispersion module workflow

3.2. Study case results

The Zamora (Spain) fire event was taken into account for the representation of the dispersion of pollutants on an area of approximately 70 x 70 km² surrounding the centroid of the burnt area. The simulation was performed setting a grid sampling resolution to 1km in X and Y directions, and 0.5km in Z from the ground level. Figure 4 shows the spatial representation of the concentration of the CO emissions produced by the fire in Zamora, values of which were estimated and reported in Table 2. The maps shown are centered in the centroid of the burnt area, and the plots show the evolution of the smoke plume dispersions during the 24 hours of the day 29/07. The CO dispersions in Figure 4 are related to the ground level, which is the one of greatest interest due to the impacts of the pollution on the population.

The following Figure 5 represents the progression of CO concentrations in time steps (top to bottom in columns) and height (left to right in the rows; ground level, 500 and 1000 m).

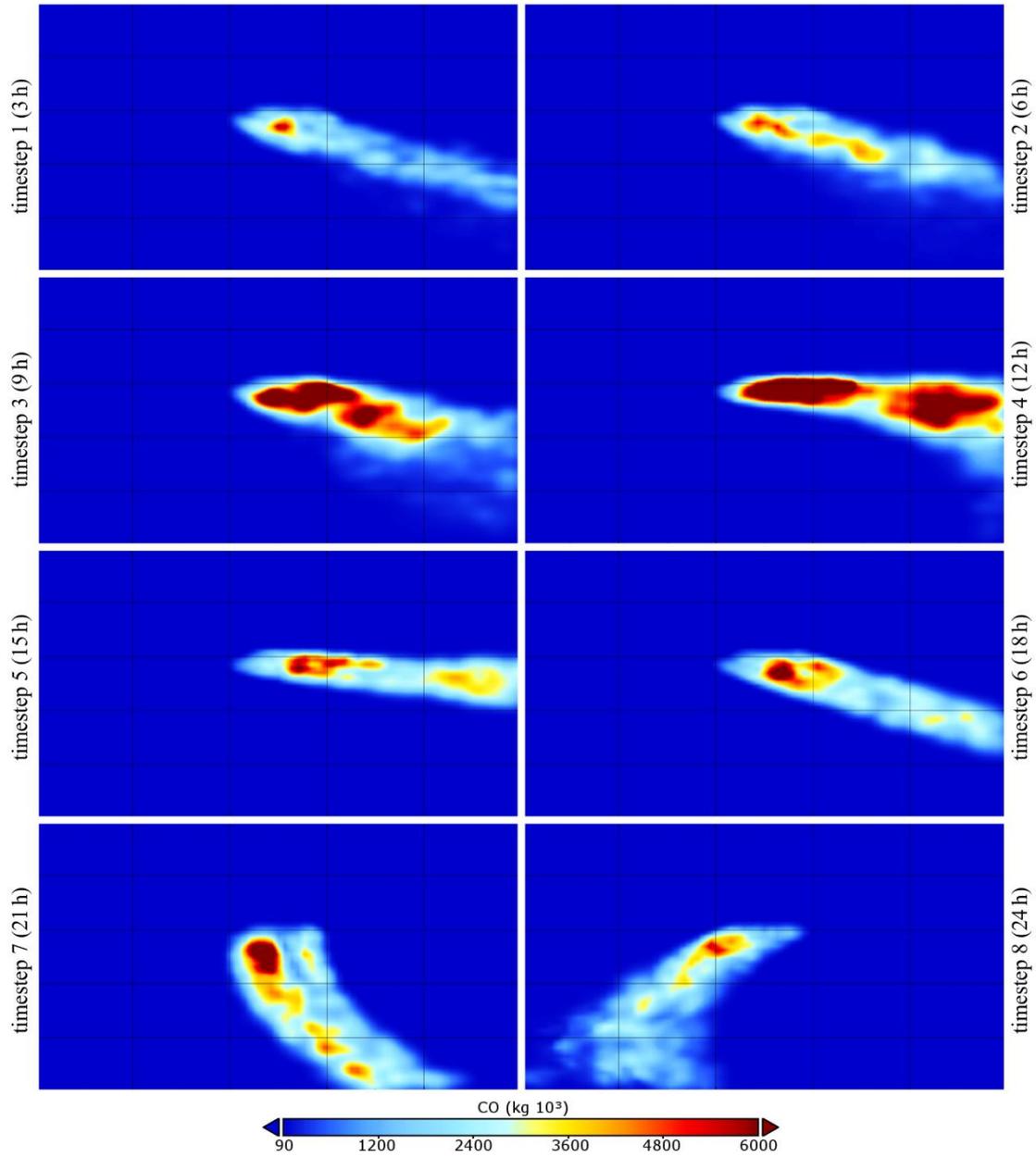


Figure 4 - Progression of the concentration of CO at ground level produced by the wildfire in Zamora (29-30/07/2017).

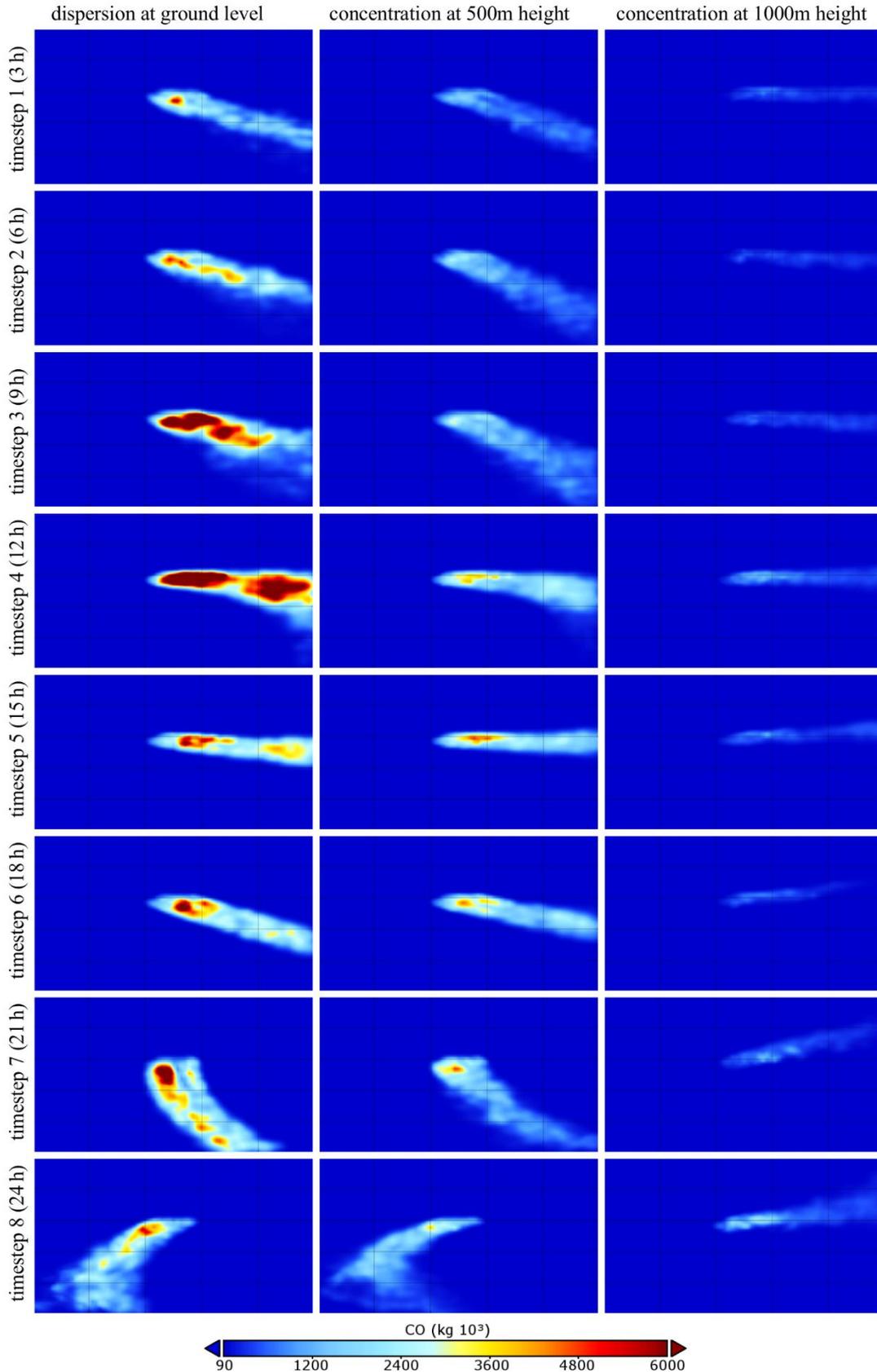


Figure 5 - Dynamics of CO concentrations in timesteps (top to bottom in columns) and height (left to right in the rows) simulated for the Zamora fire episode (29-30/07/2017).

The last step of the processing is the conversion of the resulting concentrations in GeoJSON format isolines for easier visualization on webmaps.

4. Conclusions and way forward

The integration of the new fire emissions and dispersion modules in EFFIS will provide a unique tool for the assessment of the air pollution caused by forest fires in Europe. The resulting information at regional and local scale will be extremely valuable for integrated-assessment applications both during the fire season and in post-event analysis (Lentile *et al.*, 2006; de Rigo *et al.*, 2013; Di Leo *et al.*, 2013). On the study case fire event of Zamora (Spain), the comparison of the new with the current emissions model used in EFFIS shows a consistent increase in the estimation of the concentration for each one of the pollutants, with three peaks in NMHC, VOC and BC. The application of the dispersion model on the outputs of the emissions model will also provide a 3D assessment of the evolution of the smoke plume trajectory. The spatial distribution of the concentrations at ground level represents valuable information on the impact of the smoke plume pollutant on the population resident in the surrounding area. The next steps of the project will consist of the comparison with field data on various test cases and the Sentinel-5P atmospheric pollution estimations. This will be the basis for a bias-adjustment module to be added, so as for the field information to improve the physically based estimations of the fire emission and dispersion modules in EFFIS. At last, the dissemination of the results for each fire season in the EFFIS web application will be available.

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