Atmos. Chem. Phys. Discuss., 15, 15909–15976, 2015 www.atmos-chem-phys-discuss.net/15/15909/2015/ doi:10.5194/acpd-15-15909-2015 © Author(s) 2015. CC Attribution 3.0 License.



This discussion paper is/has been under review for the journal Atmospheric Chemistry and Physics (ACP). Please refer to the corresponding final paper in ACP if available.

LSA SAF Meteosat FRP Products: Part 2 – Evaluation and demonstration of use in the Copernicus Atmosphere Monitoring Service (CAMS)

G. Roberts 1 , M. J. Wooster 2,3 , W. Xu 2 , P. H. Freeborn 6 , J.-J. Morcrette 5 , L. Jones 5 , A. Benedetti 5 , and J. Kaiser 4

¹Geography and Environment, University of Southampton, Southampton, UK
 ²Department of Geography, Kings College London, London, UK
 ³NERC National Centre for Earth Observation, UK
 ⁴Max Planck Institute for Chemistry, Mainz, Germany
 ⁵European Center for Medium-Range Weather Forecasts, Reading, UK
 ⁶Fire Sciences Laboratory, Missoula, USA

Received: 31 December 2014 - Accepted: 17 March 2015 - Published: 12 June 2015

Correspondence to: G. Roberts (g.j.roberts@soton.ac.uk)

Published by Copernicus Publications on behalf of the European Geosciences Union.





Abstract

Characterising the dynamics of landscape scale wildfires at very high temporal resolutions is best achieved using observations from Earth Observation (EO) sensors mounted onboard geostationary satellites. As a result, a number of operational active

- ⁵ fire products have been developed from the data of such sensors. An example of which are the Fire Radiative Power (FRP) products, the FRP-PIXEL and FRP-GRID products, generated by the Land Surface Analysis Satellite Applications Facility (LSA SAF) from imagery collected by the Spinning Enhanced Visible and Infrared Imager (SEVIRI) onboard the Meteosat Second Generation (MSG) series of geostationary EO satellites.
- ¹⁰ The processing chain developed to deliver these FRP products detects SEVIRI pixels containing actively burning fires and characterises their FRP output across four geographic regions covering Europe, part of South America and northern and southern Africa. The FRP-PIXEL product contains the highest spatial and temporal resolution FRP dataset, whilst the FRP-GRID product contains a spatio-temporal summary
- that includes bias adjustments for cloud cover and the non-detection of low FRP fire pixels. Here we evaluate these two products against active fire data collected by the Moderate Resolution Imaging Spectroradiometer (MODIS), and compare the results to those for three alternative active fire products derived from SEVIRI imagery. The FRP-PIXEL product is shown to detect a substantially greater number of active fire pixels
- than do alternative SEVIRI-based products, and comparison to MODIS on a per-fire basis indicates a strong agreement and low bias in terms of FRP values. However, low FRP fire pixels remain undetected by SEVIRI, with errors of active fire pixel detection commission and omission compared to MODIS ranging between 9–13 and 65–77 % respectively in Africa. Higher errors of omission result in greater underestimation of re-
- gional FRP totals relative to those derived from simultaneously collected MODIS data, ranging from 35 % over the Northern Africa region to 89 % over the European region. High errors of active fire omission and FRP underestimation are found over Europe and South America, and result from SEVIRI's larger pixel area over these regions. An





advantage of using FRP for characterising wildfire emissions is the ability to do so very frequently and in near real time (NRT). To illustrate the potential of this approach, wild-fire fuel consumption rates derived from the SEVIRI FRP-PIXEL product are used to characterise smoke emissions of the 2007 Peloponnese wildfires within the European

- ⁵ Centre for Medium-Range Weather Forecasting (ECMWF) Integrated Forecasting System (IFS), as a demonstration of what can be achieved when using geostationary active fire data within the Copernicus Atmosphere Monitoring System (CAMS). Qualitative comparison of the modelled smoke plumes with MODIS optical imagery illustrates that the model captures the temporal and spatial dynamics of the plume very well, and that
- high temporal resolution emissions estimates such as those available from geostationary orbit are important for capturing the sub-daily variability in smoke plume parameters such as aerosol optical depth (AOD), which are increasingly less well resolved using daily or coarser temporal resolution emissions datasets. Quantitative comparison of modelled AOD with coincident MODIS and AERONET AOD indicates that the former is
- overestimated by ~ 20–30 %, but captures the observed AOD dynamics with a high degree of fidelity. The case study highlights the potential of using geostationary FRP data to drive fire emissions estimates for use within atmospheric transport models such as those currently implemented as part of the Monitoring Atmospheric Composition and Climate (MACC) programme within the CAMS.

20 **1** Introduction

1.1 Biomass burning emissions and Meteosat SEVIRI FRP products from the LSA SAF

Biomass burning emissions databases derived from Earth Observation (EO) satellite data, such as the widely used Global Fire Emissions Database (GFED; van der Werf

et al., 2006, 2010), typically follow the approach proposed by Seiler and Crutzen (1980) and estimate fire emissions via the multiplication of burned area (m²), fuel load (kg m⁻²)





and combustion completeness (unitless, 0–1) estimates. Emissions databases developed in this manner have been widely applied to deliver wildfire emissions of trace gases and aerosols for use in atmospheric transport models (Mu et al., 2011; Tsyro et al., 2007). However, whilst excellent for many applications, some limitations of this
 ⁵ "burned area" based approach are that it works only after the fire event, cannot be applied in near real-time, and has a relatively low temporal resolution that provides little or no information on the variability of the emissions during the fire itself. All these maybe limitations when modelling certain aspects of fire emissions transport and generally preclude use of the approach in real-time atmospheric monitoring or forecasting
 systems (Reid et al., 2004). The companion paper to this work, Wooster et al. (2015) describes the geostationary Meteosat SEVIRI Fire Radiative Power (FRP) products

- being generated operationally by the EUMETSAT Land Surface Analysis Satellite Applications Facility (LSA SAF; http://landsaf.meteo.pt/). This type of geostationary active fire product offers an alternative route to biomass burning emissions estimation based
- on assessments of the thermal energy being radiated away from fires, and can do so in near real-time with frequent updates whilst the fires are still burning, though there are also some limitations caused mainly by fires having too low a fire radiative power remaining undetectable with the relatively coarse spatial resolution SEVIRI observations (Roberts and Wooster, 2008). Whilst Wooster et al. (2015) describe the methodolo-
- gies and algorithms used to produce the LSA SAF Meteosat FRP products, and their information characteristics, the purpose of the current work is to (i) provide a full evaluation of the product compared to other real-time active fire products derived from the same SEVIRI observations, (ii) to provide a product validation via comparisons to the widely used and higher spatial resolution (albeit lower temporal resolution) MODIS ac-
- tive fire detections, and (iii) to demonstrate how the product can be used as a high temporal resolution biomass burning emissions driver within a case study that exploits components of the prototype CAMS (http://www.copernicus-atmosphere.eu/).





1.2 Satellite Earth observation active fire products

Active fire products that are based on detecting the thermal radiation being emitted by landscape scale fires have been available for over three decades from numerous polar orbiting and geostationary satellites (Prins et al., 1994, 1998; Matson, 1981; Justice
⁵ et al., 1998; Giglio, 2003b). In addition to simple detection, Dozier (1981) first demonstrated the additional potential to estimate a fire's subpixel effective temperature and

- fractional area, and this approach has been applied in the Wildfire Automated Biomass Burning Algorithm (WFABBA) to data from the Geostationary Operational Environmental Satellite (GOES) for over two decades (Prins et al., 1994). Building on this idea, the
 FRP route to characterising active fires and estimate wildfire emissions was first pro-
- posed by Kaufman et al. (1996). The FRP approach is based on the understanding that the amount of heat produced by burning a fixed mass of biomass is relatively invariant to vegetation type (Jenkins et al., 1998). By measuring the component of this "heat of combustion" that is radiated away from the surface, the amount of vegetation
- ¹⁵ being burned per second can then be estimated (Wooster et al., 2003, 2005; Freeborn et al., 2008). An advantage of the FRP approach for estimating smoke emissions to the atmosphere is that it is based on a direct remotely sensed observation, and a large number of polar and geostationary satellite instruments have the requisite midwave infrared (MWIR) waveband required to estimate FRP using the MIR radiance approach
- of Wooster et al. (2003, 2005). The Moderate Resolution Imaging Spectroradiometer (MODIS) instruments onboard the Terra and Aqua satellites have been providing FRP measurements since 2000 and 2002 respectively (Kaufman et al., 1998; Giglio et al., 2003b) and is currently supported by the Visible Infrared Imaging Radiometer Suite (VI-IRS) onboard Suomi-NPP (Csiszar et al., 2013) and the soon-to-be-launched Sea and
- Land Surface Temperature Radiometer (SLSTR) onboard Sentinel-3 (Wooster et al., 2012). Geostationary instruments, such as the Geostationary Operational Environmental Satellite (GOES) imager (Xu et al., 2010), are also providing FRP measurements at much higher temporal resolution but at lower spatial resolution and coverage, and







CC U BY

those from the Meteosat SEVIRI instrument (Wooster et al., 2015) are the target of the current work.

1.3 Wildfire emissions datasets from FRP observations

Information on the fuel consumption totals required to build wildfire emissions inventories have already been developed using FRP data derived from polar-orbiter (Vermote et al., 2009; Ellicott et al., 2009; Kaiser et al., 2012) and geostationary satellite EO data (Pereira et al., 2011; Roberts et al., 2011). A limitation associated with the former is their intermittent observation of the diurnal fire cycle, which needs to be characterised in order to estimate daily Fire Radiative Energy (FRE; the temporal integration of FRP).

- MODIS typically provides around four daily observations depending on latitude which, when accumulated over a sufficiently long time period, have been exploited to model the diurnal fire cycle and estimate total emissions over 8 day or longer periods (Vermote et al., 2009; Ellicott et al., 2009). Geostationary FRP datasets provide much higher observation frequencies, and thus unparalleled data on the diurnal fire cycle (e.g. Roberts
- and Wooster, 2007; Roberts et al., 2009;), and Zhang et al. (2012) illustrate one way such data can be used to develop a near global biomass burning emissions dataset at hourly type temporal resolutions. However, a limitation of geostationary data is their coarse spatial resolution, which results biases in regional-scale FRP and FRE due to the omission of small and/or low intensity wildfires (Roberts et al., 2005; Xu et al.,
- 20 2010). Freeborn et al. (2009) addressed this issue by synthesising a "virtual" FRP product via the integration of both geostationary and polar-orbiter FRP data, maintaining the high temporal resolution of geostationary data whilst simultaneously adjusting them for the active fire detection biases using the higher spatial resolution MODIS measurements. Roberts et al. (2011) blended geostationary FRP data with MODIS-derived burned area information to meet a similar objective.

Perhaps the most obvious advantage FRP-based biomass burning emissions inventories offer over a burned area based inventory is their near real-time capability, since the thermal radiation being emitted by the active fires is being sensed whilst the fire is actually burning, rather than somewhat after the event. As a result, FRP-derived emissions estimates are being increasing applied to characterise wildfire emissions for use in near real time atmospheric transport models. Sofiev et al. (2009) use MODIS FRP measurements to characterise particulate matter (PM) emissions using the method

- ⁵ proposed by Ichoku and Kaufmann (2005), and the dispersion of the resulting emissions are propagated using the System for Integrated modeLling of Atmospheric coMposition (SILAM) dispersion model. In this approach, the diurnal variation of emissions is specified as being 25% greater than the daily mean during the day, and 25% less than the mean during the night. Kaiser et al. (2009a;2012) developed the Global Fire
- ¹⁰ Assimilation System (GFAS) to prescribe wildfire emissions for use in the CAMS, potentially calculating the FRP density emitted by actively burning fires (mWm⁻²) using a variety of FRP measurements from different spacecraft. However, in the NRT version of GFAS used currently only FRP measurements from MODIS are used. The FRE density (Jm⁻²) is estimated by temporally integrating the MODIS-derived FRP density
- ¹⁵ using a Kalman filter. Most recently, Turquety et al. (2014) used SEVIRI FRP measurements from the LSA SAF products to prescribe the fire diurnal cycle for the APIFLAME European fire emissions model, and Baldassarre et al. (2015) used both the LSA SAF SEVIRI FRP products and other active fire products to simulate the emissions and emissions transport of a large fire in Turkey.
- This manuscript provides a detailed evaluation of the Meteosat SEVIRI FRP products available from the LSA SAF, both the full resolution FRP-PIXEL product and the reduced resolution FRP-GRID product, both available in near real time and in archived form (http://landsaf.meteo.pt/), and provides a detailed example of their use in characterising wildfire emissions and its atmospheric transport at high temporal resolution.
- Section 2 provides a brief product summary, and readers are referred to the companion paper (Wooster et al., 2015) for a more detailed description of the algorithms used to derive the information from the raw SEVIRI level 1.5 observations. Section 3 describes a detailed inter-comparison of the LSA SAF SEVIRI FRP-PIXEL product with both the MODIS active fire products (Giglio et al., 2003), and three alternative ac-





tive fire products also derived from SEVIRI observations: namely the WFABBA (Prins et al., 1998), Fire Detection and Monitoring (FDeM; Amraoui et al., 2010) and Active Fire Monitoring (FIR) product (Joro et al., 2008). Section 4 evaluates the specific performance of spatio-temporal summary "FRP-GRID" product available from the

⁵ LSA SAF, which incorporates statistical adjustments for SEVIRI's regional FRP biases, whilst Sect. 5 describes use of the FRP-PIXEL product for parameterising wildfire emissions at high temporal resolution within the ECMWF Integrated Forecasting System (IFS) atmospheric chemistry and transport model that is used to deliver the CAMS (http://www.copernicus-atmosphere.eu/).

10 2 Meteosat Seviri FRP products from the Eumetsat LSA SAF

The Spinning Enhanced Visible and Infrared Imager (SEVIRI) onboard the Meteosat Second Generation (MSG) series of satellites acquires observations every 15 min over the Earth's disk centred on West Africa, including in MWIR and long-wave infrared (LWIR) wavebands. Data collected in these wavebands enables the detection of active fires using the type of algorithms detailed in Li et al. (2001), and this has been exploited for the development of a number of geostationary active fire products based on SEVIRI observations. One of these is the Meteosat SEVIRI FRP-PIXEL family of products that has been produced operationally since 2008 by the European Organisation for the Exploitation of Meteorological Satellites (EUMETSAT) LSA SAF (http://landsaf.meteo.pt).

The LSA SAF Meteosat SEVIRI FRP product suite currently contains two components, (i) the FRP-PIXEL product which records active fire information at the full temporal and spatial resolution of SEVIRI, and (ii) the FRP-GRID product that provides a spatiotemporal summary of the FRP-PIXEL product, along with statistical adjustments for cloud cover and for the regional biases caused by the lowest FRP fires being undetectable with SEVIRI.





2.1 FRP-PIXEL product summary

The Level 2 FRP-PIXEL product provides information on the spatial location, thermal properties, atmospherically corrected FRP and uncertainty of pixels containing actively burning fires every 15 min over Europe, North and South Africa and part of South
⁵ America (Fig. 1), based upon an extended version of the geostationary Fire Thermal Anomaly (FTA) active fire detection algorithm of Roberts and Wooster (2008) and a set of FRP estimation routines that are together fully detailed in Wooster et al. (2015). The structure of the FRP-PIXEL product is also detailed in Wooster et al. (2015), and follows the heritage of the MODIS active fire products (Giglio et al., 2003) but separated into
¹⁰ two discrete files, (i) the FRP-PIXEL "Quality Product" file, a 2-D dataset that provides information on the status of each SEVIRI pixel in the geographic region under study (e.g. whether it is a cloud, water, or land pixel, whether it has been classed as containing an active fire etc; Wooster et al., 2015), and (ii) a smaller "List Product" file that provides detailed information of pixels in which active fires have been detected (e.g.
¹⁵ including the pixel MWIR and LWIR brightness temperatures, FRP, FRP uncertainty,

Including the pixel MWIR and LWIR brightness temperatures, FRP, FRP uncertainty, latitude and longitude, and some of the metrics derived during algorithm application such as background window size and estimated MWIR band atmospheric transmissivity).

2.2 FRP-GRID product summary

- The Level 3 FRP-GRID product is a spatio-temporal summary of a series of FRP-PIXEL products. At the regional scale, the FRP-PIXEL product provides a minimum estimate of the FRP being emitted from landscape fires due to (i) the inability of SEVIRI to detect the lowest FRP active fire pixels (Roberts and Wooster, 2008; Freeborn et al., 2014a) and (ii) the fact that the assessment of the highest FRP fires suffer from some effects of pixel saturation and other SEVIRI-specific observation characteristics (Wooster et al., 2014a).
- 2015). In order to try mitigate these impacts on regional FRP estimation, the LSA SAF processing chain generates the Level 3 FRP-GRID product by temporally accumulating





active fire pixels and associated information from the maximum of four FRP-PIXEL products obtained each hour, grids this information within 5.0° grid cells, and applies a set of regional bias adjustment factors. Wooster et al. (2015) describe the procedures in full, and an evaluation of the resulting product performance is presented in Sect. 4 herein.

3 FRP-PIXEL product performance evaluation

Here we validate the SEVIRI FRP products using MODIS active fire data. The relatively high spatial resolution of MODIS' active fire observations (1 km at nadir), and the high saturation temperature of its MWIR channel (~ 500 K), coupled with its better than daily
availability from two platforms (the Terra and Aqua satellites), ensure that the MODIS active fire product (Kaufman et al., 1998; Giglio et al., 2003) is the standard against which geostationary active fire products are compared when performing product evaluations (Xu et al., 2010; Schroeder et al., 2014; Roberts and Wooster, 2014). Here we use near-simultaneously recorded Collection 5 MODIS active fire detections (MOD14 from Terra and MYD14 from Aqua) as the basis of our LSA SAF SEVIRI FRP Product

from Terra and MYD14 from Aqua) as the basis of our LSA SAF SEVIRI FRP Product performance evaluations. For completeness, we also include a series of other SEVIRI active fire products, derived using different algorithms and methods to the LSA SAF FRP products, within the same comparison.

3.1 SEVIRI FRP-PIXEL and MODIS active fire product intercomparison

20 3.1.1 Methodology

25

The FRP-PIXEL product is generated in separate files for the four LSA SAF geographic regions whose boundaries as shown in Fig. 1 (Wooster et al., 2015). We conducted the FRP-PIXEL product performance evaluation using one week of operational FRP-PIXEL data collected by Meteosat-9 in each of the LSA SAF regions, together with the matching MODIS MOD14 and MYD14 products. The FRP-PIXEL products of each region

Discussion ACPD 15, 15909–15976, 2015 Paper **Evaluation and** demonstration of use in the Copernicus Discussion **Atmosphere Monitoring Service** G. Roberts et al. Paper **Title Page** Abstract Introduction Discussion Paper Conclusions References **Figures** Tables Back Close **Discussion** Paper Full Screen / Esc **Printer-friendly Version** Interactive Discussion



were derived from 672 separate SEVIRI imaging slots taken every 15 min over a 168 h period in 2008, with the timing of the products for each geographic region being that corresponding to its peak fire period; December in Northern Hemisphere Africa, and August in the remaining three regions. Freeborn et al. (2014a) previously performed an ⁵ evaluation of the FRP-PIXEL product over the Central African Republic (CAR), finding that the products active fire detection errors of commission reduced greatly (from 24 to 9%) when the MODIS active fire detections being used as the independent data source were limited to a $\pm 18.6^{\circ}$ scan angle. This is due to the increasing pixel area of MODIS with increasing scan angle, which results in MODIS itself showing progressively greater active fire errors of omission towards the scan edge (Freeborn et al., 10 2011). When comparing large-scan angle MODIS data to active fire detections made from SEVIRI, it may well be that MODIS actually misses fires that the SEVIRI FRP-PIXEL product actually correctly detects, but in the absence of any other information a SEVIRI-to-MODIS performance evaluation would record this as a SEVIRI commission error. Therefore, to mitigate against the impact of MODIS' decreasing ability to 15 detect low FRP pixels as MODIS scan angle increases, yet balance this with the need to maintain sufficient data in our intercomparison, MODIS observations are limited to those within ±30° scan angle within which MODIS' pixel area increases up to a maximum of 1.7 km² from the nadir 1 km² size (Freeborn et al., 2011). For each LSA SAF geographic region we compared the active fire detections made by MODIS within this scan angle limit to the active fire pixels present in the FRP-PIXEL product subsets covering the same area and collected at the closest matching time (generally this will be within ~ 6 min of the MODIS overpass). To deal with the differing MODIS and SEVIRI pixel sizes, we remapped the MODIS active fire data to SEVIRI's imaging grid. SEVIRI's

²⁵ per-pixel point spread function (PSF) at the sub-satellite point extends more than 5 km radially from the pixel centre (Wooster et al., 2015), so following the approach of Free-born et al. (2014a) we evaluated active fire detection performance using the presence of an active fire pixel within a 3 × 3 pixel window centred on the active fire pixel under investigation within this grid as a matched detection. For SEVIRI errors of commission





we searched for the presence of a matching MODIS pixel for each SEVIRI active fire pixel studied, whilst the reverse analysis was conducted for SEVIRI errors of omission.

When undertaking the SEVIRI-to-MODIS FRP intercomparison, this was conducted on a "per fire" basis by clustering the MODIS and SEVIRI per-pixel FRP measurements

- for the same fire into "fire pixel clusters" on the basis of spatial closeness (e.g. Zhukov et al., 2006; Roberts and Wooster; 2008; Xu et al., 2011). The MODIS FRP measurements were derived using the same MIR radiance approach to FRP derivation as is used for SEVIRI (Wooster et al., 2005, 2015), and as will be employed in the forthcoming Collection 6 MODIS Active fire products (L. Giglio, personal communication, 2014).
- We atmospherically corrected these MODIS FRP estimates using the same procedure applied when generating the FRP-PIXEL product, detailed in Wooster et al. (2015), based on an atmospheric transmission look-up-table (LUT) developed using the MOD-TRAN5 and RTMOM atmospheric radiative transfer models (Berk et al., 2005; Govaerts, 2006) and ECMWF forecasts of total water column vapour (interpolated from an original spatial and temporal resolution of 0.5° and 3 h). Generally, the adjustment for
- the MWIR atmospheric transmission made to the SEVIRI FRP data was larger than that for MODIS, because the SEVIRI MWIR spectral band used in FRP derivation is significantly wider than that of MODIS and extends into spectral regions having much lower atmospheric transmission (Wooster et al., 2015).

20 3.1.2 Results

The results of our SEVIRI-to-MODIS per-fire active fire detection intercomparison are detailed in Table 1, columns 3 and 4. Taking the north African (NAfr) LSA SAF region as the first example, this is closest region to the Meteosat sub-satellite point and therefore offers the highest degree of SEVIRI spatial detail and smallest pixel area. We find that 65% of MODIS' active fire detections made within this region had no corresponding SEVIRI-detected active fire within the closest matching (in time) FRP-PIXEL product file. This "active fire error of omission" rate is higher than the 54% found previously by Roberts and Wooster (2008) over the same geographic area, but using the prototype



SEVIRI FTA algorithm, a different period satellite (Meteosat-8) and different time period. The reverse analysis showed that 9 % of the Meteosat-9 FRP-PIXEL product active fire pixels had no matching MODIS active fire pixel, a very similar commission error to that found by Roberts and Wooster (2008) for the prototype SEVIRI FTA algorithm over the same North African region.

SEVIRI FRP-PIXEL product active fire detection performance metrics for the other three LSA SAF geographic regions are also shown in Table 1, and indicate a substantially increased active fire omission error in South America and Europe compared to the two African regions. This is in part due to SEVIRIs increased pixel area and greater view zenith angle (and thus greater atmospheric attenuation) over the former two regions which are further from the Meteosat SSP. South America and Europe have a mean view zenith angle of 59 and 54° respectively and this significantly raises the minimum per-pixel FRP detection limit in these areas (Fig. 1), meaning a greater proportion of lower FRP landscape-scale fires fail to be detected by SEVIRI in comparison to the African regions.

15 to the African regions.

Figure 2 and Table 1 (column 5) present the results of the SEVIRI-to-MODIS perfire FRP intercomparison. Again taking north Africa as an example, on a per-fire basis there is a strong correlation between the FRP measures made by SEVIRI in this region and by MODIS (Fig. 2; top left) with over half (53 %) of the SEVIRI-to-MODIS matchups

- ²⁰ having an FRP difference less than 20 %. In fact, a strong level of agreement exists for all regions in terms of a low FRP bias between the two datasets, but there is significant scatter. Overall, we find that 57 % of the FRP-PIXEL products per-fire FRP measures are within 20 % of those of MODIS, and this level of agreement remains consistent even when limiting the comparison to fires with FRP > 50 MW to ensure we focus on the
- FRP range where SEVIRI does not clearly underdetect active fires (e.g. Wooster et al., 2015). This suggests that the degree of variability seen between the near-simultaneous measures of per-fire FRP provided by SEVIRI and MODIS is not driven only by active fire pixel errors of omission (e.g. by SEVIRI failing to detect some of the low FRP





fire pixels making up a fire cluster), but maybe impacted by other aspects of the FRP measurement process coming from:

1. uncertainty in the ambient background signal used to calculate the FRP for each fire pixel with SEVIRI and MODIS data (Wooster et al., 2003, 2005, 2015; Zhukov et al., 2006);

5

10

- the ±6 min time difference between corresponding MODIS and SEVIRI observations of the same fire, during which changes in the active fire characteristics that determine the fires FRP may occur;
- 3. the uncertainties present in the MODIS FRP measures coming from the sub-pixel location of the fire with respect to the sensor instantaneous field of view, recently been characterised by Freeborn et al. (2014c), and with SEVIRI also from certain image processing operations conducted during the production of SEVIRI level 1.5 data (Wooster et al., 2015).
- 4. effects of sensor saturation of SEVIRIS MWIR channel at high FRP fire pixels.
- ¹⁵ To place the magnitude of the scatter seen in Fig. 2 between the SEVIRI FRP-PIXEL product's FRP measures and those from the MODIS MOD14 and MYD14 products into context, during the recent Freeborn et al. (2014c) study multiple MODIS FRP measurements of the same fires made almost simultaneously (<< 1 s difference) in consecutive MODIS scans were compared and some large scan-to-scan differences found. An
- ²⁰ approximately normally distributed percentage difference between the two FRP measures, with a mean close to zero but a SD of 26.6% was determined from a large dataset of such matchups (Freeborn et al.; 2014c). Further investigation showed that the scan-to-scan differences were largely controlled by the differing sub-pixel location of the fire within the different MODIS scans, a subject previously indicated as potentially significant with regard to FRP observations made by the BIRD Hot Spot Recognition
- ²⁵ significant with regard to FRP observations made by the BIRD Hot Spot Recognition Sensor (HSRS; Zhukov et al., 2006). Freeborn et al. (2014c) also showed that the





scatter reduced as fire clusters containing increasing numbers of active fire pixels were compared, since the sub-pixel location effects would increasingly cancel out as more pixels were included in the instantaneous scan-to-scan FRP inter-comparison. Nevertheless, given the degree of scatter found between even almost totally simultaneous

- MODIS FRP observations of the same fire made at the same scan angle and pixel area by Freeborn et al. (2014c), it is unsurprising that higher levels of scatter arises when comparing FRP data from different sensors (Fig. 2; Table 1), where pixel areas, scan angles and imaging time differences are all somewhat greater. Nevertheless, our results indicate that when the FRP-PIXEL product and the MODIS active fire products
- both detect the same fire, the FRP reported by the two products show small biases. Over the four LSA SAF regions, 391 individual active fire "clusters" detected by MODIS and SEVIRI were compared and 76 % (298 fire clusters) had an FRP within 30 % of that measured by MODIS. Given the uncertainties on per-fire FRP retrievals, the LSA SAF target accuracy of the FRP-PIXEL product is specified as, on a per-fire basis, 70 % of
- the SEVIRI-retrieved FRP values being within 50% of those simultaneously measured by MODIS. Therefore, the FRP-PIXEL product significantly exceeds this specification, and actually approaches that specified by the LSA SAF "optimal accuracy" definition (70% of retrieved SEVIRI-retrieved FRP value being within 20% of the MODIS-derived value on a per-fire basis).

²⁰ Whilst our per-fire FRP inter-comparison has indicated a comparatively low degree of FRP bias between the FRP-PIXEL and MODIS MOD14/MYD14 FRP records of the same successfully detected active fires, there remains a significant degree of regional-scale FRP underestimation by the FRP-PIXEL product due to the inability of the coarser SEVIRI observations to detect the lowest FRP component of a regions fire regime
 ²⁵ (Roberts and Wooster, 2008). Therefore when data from both the MOD14/MYD14 and near-simultaneous matching FRP-PIXEL products covering the same area (i.e. the area covered by MODIS within a ±30° scan angle) are compared, SEVIRI reports

a lower cumulative "regional" FRP than does MODIS (Table 1, Column 6). This effect is directly related to SEVIRI's aforementioned active fire errors of omission, an effect





that is magnified in geographic regions in which SEVIRI mostly observes at higher view zenith angles. Figure 3 again uses the example of the North African region, where the slope of the linear of best fit to the regional FRP totals recorded near simultaneously in the FRP-PIXEL product and the MODIS active fire products is 0.65. This indicates the

- ⁵ relatively small, but certainly not-insignificant, impact of the FRP-PIXEL products active fire errors of omission in this region, which is that closest to the Meteosat sub-satellite point (SSP) and thus in which the FRP-PIXEL products active fire errors of omission are lowest (Table 1). Regional FRP underestimation increases away from the SSP, and appears particularly extreme in the European LSA SAF geographic region in our inter-
- ¹⁰ comparison. This is in part a result of a large proportion of active fires being present in Eastern Europe during our inter-comparison period, where the SEVIRI view zenith angle exceeds 60°. With respect to regional FRP characterisation, the performance of the FRP-PIXEL product for southern European fires, which lie relatively close to the Meteosat SSP, is likely to be much closer to that of the North African geographic re-¹⁵ gion. Section 5 includes study of the August 2007 Greek Fires as a case study example
- of fires in this region.

3.2 Inter-comparison of alternative SEVIRI active fire products

Since the launch of Meteosat Second Generation in 2002, a number of studies have used different algorithms to study active fires with SEVIRI observations (e.g. Calle
 et al., 2009; Amraoui et al., 2010). This has led to certain other routinely generated SEVIRI active fire products being available, in addition to the LSA SAF FRP-PIXEL product focused upon herein. These alternative SEVIRI-based products include the Wildfire Automated Biomass Burning Algorithm (WFABBA, version 6.5) product (based on the WFABBA fire detection algorithm of Prins et al., 1998), the Fire Detection and Monitoring (FDeM) product (Amraoui et al., 2010), and the Active Fire Monitoring (FIR)

product (Joro et al., 2008), each of which essentially generate active fire pixel detections from SEVIRI level 1.5 data as does the FTA algorithm used within the FRP-PIXEL product processing chain (Wooster et al., 2015).





3.2.1 Methodology

We assessed the active fire detection performance of the FRP-PIXEL product in comparison to the three main alternative SEVIRI active fire products, and to the MODIS MOD14/MYD14 active fire products using the SEVIRI-to-MODIS intercompar-

- ⁵ ison methodology detailed in Sect. 3.1. The inter-comparison was conducted using all available FRP-PIXEL products collected over the southern African LSA SAF geographic region in August 2014 (a total of 2959), a month when fires are highly prevalent in southern Africa. For comparison we collected all the available files from the alternative SEVIRI active fire data products, a total of 2949 for WFABBA (Prins et al., 1998),
- ¹⁰ 2963 for FDeM product (Amraoui et al., 2010), and 2914 for FIR (Joro et al., 2008). Due to various data collection and processing issues, not all products were available for all SEVIRI source scenes, as is evident from the slightly different (max 1.5%) number of products in each case. Also, each product has different classes of output, and the FIR product for example classifies fire pixels as either active fires or potential active fires.
- In this comparison we focus on only confirmed active fire pixels. Similarly the WFABBA product "filters" active fire pixels detected only once in a 24 h period and classes them less likely to be fires, aiming to reduce the number of false alarms detected and minimise effects due to sunglint. We are therefore careful to conduct our comparison with the various classes of WFABB detection data.

For comparison to the SEVIRI-derived active fire products we used 544 Collection 5 MODIS MOD14/MYD14 active fire products, acquired over Southern Hemisphere Africa. To facilitate comparison with the SEVIRI products, we subset the SEVIRI products to cover the same area as the MODIS products and selected the set of temporally coincident MODIS active fire pixels that matched with SEVIRI active fire products in

time (±6 min). The MODIS active fire pixels were remapped to SEVIRI's imaging grid and had their FRP atmospherically corrected using the same approach as detailed in Sect. 3.1 to match the methodology used to generate the FRP values within the FRP-PIXEL product. SEVIRI's per-pixel point spread function (PSF) at the sub-satellite point





extends more than 5 km radially from the pixel centre (Wooster et al., 2015), so following the approach of Freeborn et al. (2014a) we evaluated the SEVIRI-derived active fire detection performances against the presence of MODIS active fire pixels within a 3 × 3 pixel window centred on the SEVIRI active fire pixel under investigation. Again, as with Sect. 3.1 the comparison was restricted to MODIS active fire detections made within a ±30° scan angle (Freeborn et al., 2014a).

3.2.2 Results

The MOD14/MYD14 products contained 286 000 active fire detections during August 2014 over the southern African LSA SAF geographic region, and once remapped onto the SEVIRI imaging grid, this equated to 112 576 pixels. Within the specified ±6 min MODIS to SEVIRI imaging time limit, the FRP-PIXEL product detects 33 414 active fire pixels and 29 037 of these are also detected by the remapped MOD14/MYD14 data. This corresponds to a SEVIRI active fire pixel detection commission error of 13 %. Using the same SEVIRI level 1.5 data, the WFABBA, FDeM and FIR active fire prod-

- ¹⁵ ucts detect 13008, 7664 and 7151 active fire pixels respectively, and of these, 12284, 7260 and 6730 are coincident with a MODIS active fire detection respectively. Hence, the active fire pixel errors of commission are 5.5, 5.2 and 5.8% respectively for these three SEVIRI-derived products, active fire errors of commission rates around half those of the FRP-PIXEL product. A summary of the SEVIRI active fire product intercompari-
- ²⁰ son results is given in Table 2. The ~ 13% active fire error of commission rate for the FRP-PIXEL product found here and by Freeborn et al. (2014a) is higher than the ~ 8% found by Roberts and Wooster (2008, 2014) using the FTA algorithm prototype. The disparity is in part due to the differing way in which the operational FTA algorithm applies a high-pass spatial filter to screen out certain false alarms from the potential fire
- pixel set (Roberts and Wooster, 2008). As detailed in Wooster et al. (2015) whilst the prototype FTA algorithm applies a dynamic threshold derived for each SEVIRI imaging slot at this stage (Roberts and Wooster, 2008), the operational version used to generate the FRP-PIXEL product uses a set of static thresholds to speed up data processing





(since this stage was by far the most computationally intensive part of the algorithm and each slot has to be processed rapidly). It has since been found that this change results in the removal of fewer areas of "solar heated warm ground" than did the prototype implementation, meaning a much larger number of potential fires pixels that are false

- alarms passing through the early stage of the FRP-PIXEL product processing chain, and some of these may end up being classed as "true" fires. This issue will be addressed in a future FRP-PIXEL product update, balancing the need to minimise active fire errors of commission with the requirement to deliver each new product in a timely fashion soon after image acquisition. This change is scheduled to be implemented prior
- to summer 2015, and the entire SEVIRI archive will later be re-processed with the optimised algorithm.

The minimum FRP detection limit of an active fire detection algorithm is directly proportional to the pixel area (Roberts and Wooster, 2008; Wooster et al., 2015). If the active fire detection algorithm of Giglio et al. (2003) used to generate the Collection 5

- ¹⁵ MOD14/MYD14 MODIS active fire products were applied to SEVIRI level 1.5 imagery, the minimum FRP detection limit at the Meteosat SSP would be 70–80 MW, around 10× the minimum FRP detection limit of the MOD14/MYD14 active fire products due to SEVIRI's ~ 10× larger nadir view pixel area. By contrast, the design of the FRP-PIXEL product attempts to lower the minimum FRP detection limit significantly below
- this by detecting active fire pixels whose radiometric signals in the MWIR, LWIR and MWIR-LWIR are raised even quite minimally above that of the ambient background (Roberts and Wooster, 2008). By exploiting a variety of spectral and spatial thresholds and contextual processing methods, the FTA algorithm is sometimes capable of detecting SEVIRI active fire pixels having an FRP down to ~ 20 MW at the Meteosat SSP.
- Nevertheless, statistics show that for active fire pixels below ~ 50 MW the active fire pixel count is underestimated more by SEVIRI compared to the performance above this threshold (Freeborn et al., 2009). However, by restricting our comparison of the FRP-PIXEL product to active fire pixels having FRP ≥ 50 MW the active fire pixel error





of commission of the FRP-PIXEL product fell only slightly to 12%, indicating that false alarms are not necessarily dominated by these low FRP fire pixels.

Whilst our analysis has shown somewhat higher active fire errors of commission for the FRP-PIXEL product compared to the WFABBA, FIR and FDeM products, we

- ⁵ find the latter have much higher active fire errors of omission. Figure 4 illustrates the variation seen in active fire pixel detection performance between the different SEVIRI products for one imaging slot (21 August 2014, 13:15 UTC). In this example, the FRP-PIXEL, WFABBA, FDeM and FIR products detect 1249, 686, 346 and 312 active fire pixels respectively, illustrating a substantial degree of difference. Furthermore, the fire discussed events are simple detection of the fire pixels respectively.
- diurnal cycle retrieved using the four products from a single day of data shown in Fig. 5 highlights the fact that these differences are maintained over the course of the day, leading to very large variations in the total count of active fires detected on a daily basis.

When compared to the matching MODIS active fire pixel detections, the WFABBA,
 FDeM and FIR products contain active fire pixel detections that match 16, 8 and 5% respectively of the MODIS active fire pixels, whereas the figure for the LSA SAF FRP-PIXEL product is substantially higher at 23%. Georgiev and Stoyanova (2013) previously undertook a limited study of the FRP-PIXEL product performance in south-east Europe, and determined that it provided a marginally higher active fire detection effi-

- ciency than did the FIR product. Using a wider area of a region with many more fires covering a wide FRP range we find much larger differences, and indeed the FIR product appears to provide the worst performance of all the four SEVIRI products in terms of its ability to detect active fire pixels. Restricting the FRP-PIXEL active fire detections to those pixels ≥ 50 MW, the FRP-PIXEL product still detects 9896, 14864, 15896
- ²⁵ more active fire pixels that are coincident with MODIS than do the WFABBA, FDeM and FIR products respectively. This corresponds to active fire pixel count differences in excess of ~ 175 %, even when limiting the detection regime to an FRP range where all the SEVIRI-derived products should in theory be able to show a reasonably strong performance.





Our analysis of the operational FTA algorithm's performance has shown an active fire pixel error of omission rate of 77 % when comparing the FRP-PIXEL product to simultaneously collected MODIS active fire pixels. This omission error is similar to that previously found by Roberts and Wooster (2014) and Freeborn et al. (2014a) for the

⁵ FTA algorithm, and primarily results from the ~ 10× larger nadir pixel area of SEVIRI than MODIS. In comparison, the errors of omission for the WFABBA, FDeM and FIR products are significantly greater, at 84, 92 and 95% respectively. Restricting the comparison to those FRP-PIXEL product pixels having a SEVIRI-retrieved FRP ≥ 50 MW, which SEVIRI-based algorithms should be able to detect quite readily, reduces the
 ¹⁰ FRP-PIXEL product active fire pixel error of omission to ~ 50% in comparison to MODIS.

In terms of FRP measurements, the ratio between the total cumulative FRP measured within the same southern African geographic region covered by the nearsimultaneous FRP-PIXEL and MODIS active fire products is 0.48. This represents

- ¹⁵ a lower underestimate of FRP than might be expected from the FRP-PIXEL omission error rate, and the reason is that the unidentified active fire pixels are predominantly those having low FRP values (< 50 MW). Restricting the analysis to only those active fires that are correctly identified by both products provides a cumulative FRP ratio of 0.96, showing an excellent agreement in the regional FRP assessment when only ac-
- tive fires successfully detected by both sensors are taken into account. This agrees with the strong-performance in terms of per-pixel FRP assessment seen in Sect. 3.1.

Certain previous studies evaluating the FTA algorithm or prototype FRP-PIXEL datasets (e.g. Roberts and Wooster, 2008; Xu et al., 2010; Roberts et al., 2014) have applied an alternative approach when comparing these to MODIS active fire

datasets. Rather than the per-pixel approach to inter-comparison applied above, Freeborn et al. (2014a) grouped active fire pixels into contiguous clusters based on their spatial closeness to other active fire pixels in the same manner as that described in Sect. 3.1 for the per-fire FRP intercomparison. To strengthen the link between this work and these previous findings, active fire pixels within each of the active fire products





tested were also clustered into spatially contiguous groupings, and the active fire detection errors of commission and omission calculated based on a "fire cluster" basis instead of for the individual fire pixels. We used a similar strategy for this inter-comparison as used at the pixel scale, specifically searching the surrounding 3×3 pixels for match-

- ⁵ ing active fires in the products to be compared. Using this "clustering" approach, we found the error rates of the FRP-PIXEL product to be higher than those determined using the per-pixel approach, with errors of commission and omission of 19 and 85 % respectively when compared to the matching MOD14/MYD14 products. Again, if only those fire clusters having an FRP ≥ 50 MW are included, these reduce to 18 and 57 %
- respectively, demonstrating in particular a high success of active fire detection in this region of the FRP regime. Using the same approach with the alternative SEVIRI active fire products, we find that the WFABBA products also show slightly higher errors of omission and commission than when examined at the fire cluster scale, now being 7 % (commission) and 90 % (omission) respectively in comparison to the MODIS product.
- ¹⁵ The error rates for FDeM and FIR products are, however, very similar when examined on a fire cluster basis to the results on a per fire pixel basis, with a commission rate of 6 % for both and an omission rate of 96 and 95 % for FDeM and FIR respectively.

4 FRP GRIDDED product evaluation

4.1 Method

- Section 2.2 detailed how the LSA SAF SEVIRI FRP-GRID product uses a series of regionally-specific bias adjustment factors (*a*) to upwardly adjust regional FRP estimates for e.g. the impact of undetected low FRP fire pixels. The aim is to produce an hourly, regional FRP estimate that has minimal bias compared to if MODIS had been able to view the same area at the same time. Full details of the FRP-GRID processing chain are included in Wooster et al. (2015). We evaluated the performance of the
- ing chain are included in Wooster et al. (2015). We evaluated the performance of the applied bias adjustments using a validation dataset composed of coincident SEVIRI





and MODIS observations collected between May 2008 and May 2009 in each of the four LSA SAF geographic regions. Boundaries of the relevant MODIS level 2 swath products were used to identify all MODIS granules that intersected each region during the year-long study period, and fire pixels subset from the full MODIS "MOD14" and

- ⁵ "MYD14" products using six, non-overlapping 5.0° grid cells arranged in the centre of each MODIS granule (Fig. 6). Active fire pixels detected by MODIS outside of this region of interest were discarded and not used during the analysis. The sampling design ensured complete coverage of the 5.0° grid cells regardless of the MODIS ground track, and also mitigated the effects of image distortion at the edge of the MODIS swath. All
- MODIS granules collected during the year-long study period were matched to the most concurrent SEVIRI image, always within ±6 min of each other. The same 5.0° grid cells inscribed within the MODIS granule were then used to clip SEVIRI fire pixels from both (i) the most coincident SEVIRI timeslot, and (ii) the three SEVIRI timeslots immediately preceding the MODIS overpass. Again, active fire pixels detected by SEVIRI outside
- of this region of interest were not included in the analysis. Entire grid cells were also discarded if three consecutive SEVIRI imaging timeslots could not be retrieved prior to the SEVIRI timeslot concurrent with the MODIS overpass (i.e., if four imaging timeslots were not available). This sampling design not only permitted a genuine comparison of coincident SEVIRI and MODIS observations of FRP, but also mimicked the hourly
 temporal resolution of the gridded FRP product.

After the SEVIRI and MODIS fire pixels were spatially and temporally accumulated, half of the concurrent and collocated 5.0° grid cells in each region were used to generate the validation dataset. Relationships between the atmospherically corrected FRP observed by SEVIRI and MODIS were directly compared among the 5.0° grid cells

²⁵ contained within this dataset. Rather than using the instantaneous FRP observed by SEVIRI at the timeslot most concurrent with the MODIS overpass however, the mean FRP generated from the SEVIRI data available over the preceding hour was used instead to correspond more appropriately with the hourly resolution of the FRP-GRID product.





4.2 Results

A complete summary of the FRP-GRID product validation results derived from the methodology detailed in Sect. 3.1 is provided in Table 3. Application of the weighted least squares (WLS) coefficients in northern and southern Africa to the validation dataset yielded unbiased estimates of the instantaneous FRP that would have been measured by MODIS at 5.0° spatial resolution (e.g., Fig. 7a, Table 3). As expected, however, the region-specific coefficients for South America (Same) and Europe (Euro) geographic regions did not perform as well. Although the adjustment procedure provides an unbiased estimate of the FRP that MODIS would have measured in South America, the coefficient of determination (r^2) indicates that confidence in the predictive capability of the model is limited at this spatial and temporal resolution. As a caveat, however, the validation results in South America and Europe are influenced by observations when SEVIRI did not detect a single active fire pixel within a 5.0° grid cell during the hour. After removing 5.0° grid cells that only contained an active fire pixel

- ¹⁵ detected by a single sensor (i.e., thereby forcing a comparison between observations in which both SEVIRI and MODIS viewed a fire) ther² improved to 0.43 in the South America region. Furthermore, by removing a lone outlier improved the correlation coefficient slightly further to 0.55. Likewise for Europe, only including observations in which SEVIRI and MODIS simultaneously detected an active fire pixel yielded an r^2 of 0.31.
- ²⁰ Of course, the linear bias adjustments applied in the FRP-GRID product only capture the underlying macroscopic features of the sensor-to-sensor relationships, and do not account for any temporal variability in the SEVIRI-to-MODIS ratios of FRP induced by diurnal or seasonal fluctuations in fire activity (e.g. as seen in Freeborn et al., 2009). By deriving different regression coefficients for each of the four LSA SAF regions, however,
- the FRP-GRID algorithm does account for broad spatial differences in the sensor-tosensor relationships that potentially arise from (i) differences in fire regimes, and (ii) differences in SEVIRI view zenith angles.





To assess the predictive capability of the bias adjustment factors at broader spatial and temporal scales than simply the hourly/5° spatio-temporal resolution of the FRP-GRID product, the SEVIRI and MODIS validation data were accumulated over weekly intervals and comparisons were performed at scale of the LSA SAF geographic re-

- ⁵ gions. Figure 7b illustrates that in southern Africa, the bias adjustment factors used to generate the FRP-GRID product consistently underestimate the weekly sum of FRP measured by MODIS across this region, and that these results are typical of all four regions (Table 3). Again, this systematic underestimation is partly attributed to the challenge of performing a bias adjustment when SEVIRI does not detect a fire pixel (i.e.
- the linear bias adjustment coefficient is then applied to an FRP of zero). Nevertheless, the weekly/regional biases shown in Table 3 could in turn be used to adjust the SEVIRI FRP-GRID product measurements to deliver unbiased estimates of the FRP that would have been measured by MODIS at the regional/weekly scale.

5 Example application of the LSA SAF Meteosat SEVIRI FRP products in the Copernicus Atmosphere Monitoring Service (CAMS)

15

5.1 Introduction to FRP-PIXEL product use in atmospheric transport models

From the FRP-PIXEL product evaluation and inter-comparison conducted in Sect. 3 it is apparent that the FRP-PIXEL product detects a larger proportion of the "true" landscape-scale fire activity than do alternative SEVIRI-derived active fire products,
²⁰ albeit with a higher commission rate. That evaluation also highlighted the failure of the FRP-PIXEL product to detect many of the actively burning fires that MODIS would detect, particularly the lower FRP fires, resulting in an overall omission rate of 77% over the four geographic regions (Table 1). The degree of difference between geostationary and polar-orbiting active fire products does, however, vary with factors such as geographic location, season and time of day (which all influence the type of fire regime and its subcomponents being sampled), sensor viewing geometry, land cover



heterogeneity, fire detection algorithm and the quality of ancillary data such as cloud masks (Freeborn et al., 2014a; Schroeder et al., 2008; Roberts and Wooster, 2014; Xu et al., 2010). Indeed, under some conditions, geostationary active fire datasets compare rather favourably against those derived from polar-orbiting sensors. Georgiev and

- Stoyanova (2013) analysed a series of short-lived wildfires in south-eastern Europe with the FRP-PIXEL product, and found the higher temporal resolution of SEVIRI resulted in a 50% lower active fire omission rate than did the use of MODIS. Wooster et al. (2015) also demonstrate that, taking the Central African Republic as an example, most fires detected by the MODIS are detected by the SEVIRI FTA algorithm, just not
- necessarily at the same time as the fire is detected by MODIS. Indeed, the high temporal frequencies offered by geostationary observations can enable the diurnal fire cycle and related short-term changes in fire activity to be far better characterised than with polar-orbiting data, and this ability is starting to be exploited to parameterise wildfire emissions in atmospheric transport models.
- ¹⁵ One such example is provided by Baldassarre et al. (2015), who used the FRP-PIXEL products (Wooster et al., 2015) and the WFABBA SEVIRI products (Zhang et al., 2012), along with MODIS-derived information from the Global Fire Assimilation System (GFAS) inventory of Kaiser et al. (2012), to derived biomass burning emissions inputs for simulations of emissions from a large fire in Turkey (Antalya, 2008).
- The FRP-PIXEL product provided by far the most accurate description of the emissions, both with regard to their spatio-temporal variation and their absolute magnitude. Unlike the MODIS-derived GFAS inventory, the SEVIRI FRP-PIXEL product was able to capture the fires complete life cycle, including the time of peak emissions intensity. And compared to the WFABBA product, the FRP-PIXEL product produced informa-
- tion more consistent with that from MODIS when both SEVIRI and MODIS viewed the Antalya region simultaneously. The simulated smoke plume produced by ingesting the FRP-PIXEL data into the Community Multi-scale Air Quality (CMAQ) atmospheric chemistry model compared far better with observations of MODIS-derived aerosol optical depth (AOD), and with carbon monoxide and ammonia column totals provided



by the Infrared Atmospheric Sounding Interferometer (IASI), in particular in relation to the diurnal variability of the fire emissions and the spatial distribution and peak concentrations of the smoke. Please refer to Baldassarre et al. (2015) in this Monitoring Atmospheric Composition and Climate (MACC) special issue for further information on the simulation and inter-comparison. Here we provide a second European demonstration of the value of geostationary FRP data in the parameterising of wildfire emissions for use in atmospheric transport models, building on a previous limited study carried

out by Kaiser et al. (2009b).

10

5.2 Methodology for modelling emissions transport for the 2007 Peloponnese fires

We use the FRP-PIXEL product as the basis for parameterising the emissions from a series of large wildfires that occurred in August and September 2007 on the island of Peloponnese in Greece, using these within components of the CAMS modelling systems to simulate the transport and fate of the emitted smoke. These catastrophic wildfires occurred after a period of prolonged drought (Gitas et al., 2008), and during a heatwave (Theoharatos et al., 2010). The MODIS burned area product (Roy et al., 2005) indicates a burned area of 1847 km² (Fig. 8), in good agreement with burned area reports provided by the local Hellenic fire brigade (1899 km²). The fires occurred in areas of coniferous and broadleaved forest, shrublands, grasslands and olive groves,

- ²⁰ although they predominantly occurred in forested land (Veraverbeke et al., 2010; Koutsias et al., 2012). Such was their severity that 0.32 Tg or 40 % of the annual CO emissions for the entire country of Greece are estimated to have been released by these fires alone (Turquety et al., 2009) and their average contribution to the 3 day record of PM_{10} measured in Athens was 28 µg m⁻³, which is 67 % greater than the background
- ²⁵ concentration (19µgm⁻³) measured a few days previously (Liu et al., 2009). These exceptional characteristics of the Peloponnese wildfires, which showed strongly varying intensities over their lifecycle, provide an excellent opportunity to demonstrate the value of the high temporal frequency FRP observations provided by SEVIRI. Marlier





et al. (2014) and Reid et al. (2009) already highlight the potential improvements that such high temporal resolution source information can have on the modelling of biomass burning emissions transport.

5.2.1 SEVIRI-derived FRP emissions fields for the Peloponnese wildfires

- ⁵ FRP-PIXEL data of the European LSA SAF geographic region collected between the 1 August and 13 September 2007 was examined for signals of the Peloponnese fires that occurred during July–August 2007. Clear FRP signals were apparent from these fires, but it was also evident that the adjusted version of Cloud Mask (CMa) of Derrien and Le Gleau (2005) delivered by the Nowcasting and Very Short Range Forecasting
 ¹⁰ SAF (NWC SAF; www.nwcsaf.org) and used within the FRP-PIXEL product processing chain (Wooster et al., 2015) was identifying some of the extremely thick smoke emitted by these fires as cloud. This is not a problem for studies requiring clear sky observations, but the sensitivity of the algorithm for detecting cloud or smoke contaminated
- pixels can occasionally result in the omission of fire activity. Since cloud masking is one
 of the first things conducted within the FRP-PIXEL product processing chain (Wooster et al., 2015), misidentification of very thick smoke as cloud prevents fires being identified in these pixels using the FTA algorithm, even though we know that active fires can be quite reliably detected through even quite thick smoke (Petitcolin and Vermote, 2002). This is because smoke particles have a diameter typically much smaller than
- the wavelength of the MWIR band and so do not act as strong scatterers of the fireemitted radiation, unlike meteorological cloud (Kaufman and Remer, 1994). Analysis of the raw SEVIRI level 1.5 data, along with the EUMETSAT Meteorological Product Extraction Facility (MPEF) cloud mask (Tjemkes and Schmetz, 1997), confirmed the identification of some areas of thick smoke as cloud by the CMa cloud mask, and also
- ²⁵ confirmed that the true median percentage cloud cover over Peloponnese was low over the period of the fires (13%). To prevent the masking out of smoke covered fires, which also then impacts surrounding pixels due to the single pixel wide mask that is applied around cloud and water pixels (Wooster et al., 2015), for this particular application we





decided to turn off the use of the adjusted CMa cloud mask, and simply relied on the basic cloud masking tests used within the FTA algorithm itself (Wooster et al., 2015). Currently investigations are ongoing to make the cloud masking within the FRP-PIXEL product less sensitive to thin cloud and other atmospheric phenomena through which
 ⁵ fires can still be identified, including very thick smoke (Wooster et al., 2015).

The FRP data from the FRP-PIXEL products was gridded within 0.1° grid cells and used to calculate the mean FRP for each at an hourly temporal resolution. As with the operational version of the Global Fire Assimilation System (GFAS; Kaiser et al., 2012), the FRP density ($\tilde{\varrho}_j$, Wm⁻²) for each cell was then calculated by normalising the measured FRP by the grid cell area (a_j , m²):

$$\widetilde{\varrho}_{j}(d,h) = \frac{1}{a_{j}} \frac{1}{4} \sum_{k=0,15,30,45i_{k} \in j} F_{ik}(d,h)$$

where *d*, *h* and *k* are the date, hour and minute of the SEVIRI observations respectively, F_{ik} is the summation of all FRP measurements within grid cell *j*.

The rate of dry matter (DM) fuel consumption (φ [kg s⁻¹ m⁻²]) was derived from the ¹⁵ FRP density measures of each grid cell ($\tilde{\varrho}$, Wm⁻²) following the method described in Wooster et al. (2005), but with the land cover dependent adjustments that are designed to related the FRP-derived fuel consumption estimates from GFAS to those from GFEDv3 (Kaiser et al., 2012):

 $\varphi(d,h)=c\times \widetilde{\varrho}(d,h)\times\beta_{l}$

10

where *d* is the day, *h* is the hour and *c* is the conversion factor that relates fuel consumption to FRP and which is 0.368 ± 0.015 (kgMJ⁻¹; Wooster et al., 2005) and where β_l is the adjustment factor for land cover type *l* taken from GFAS (Kaiser et al., 2012). This is the approach to biomass burning fuel consumption estimation currently used within the GFAS component of the CAMS.

15937



(1)

(2)

5.2.2 FRP-derived aerosol emissions and atmospheric modelling

Ichoku and Kaufmann (2005) first developed an approach to estimate aerosol emissions using FRP and aerosol optical depth (AOD) measurements using "*coefficients of emission*" that related FRP to total particulate matter (TPM) as a function of land cover type. The approach implemented by Kaiser et al. (2012) for GFAS and used again herein calculates emissions using the DM fuel consumption rate (φ , kg s⁻¹ m⁻²):

 $\Phi_s(d,h) = \eta_s \times \varphi(d,h)$

where Φ_s is the emission flux density (kgs⁻¹ m⁻²) of species *s*, *d* is the day, *h* is the hour and η is the emissions factor (kgkg⁻¹) given by:

10 $\eta_s = \alpha_I(s) \times \kappa_I(s)$

where κ_l is the land cover (*l*) specific emissions factor for species *s* and α is a constant which is used to adjust bottom-up aerosol emissions estimates to those observed in top-down inventories. A regionally varying bias occurs between bottom-up derived aerosol emissions and MODIS AOD measurements, requiring the former to be ad-

- ¹⁵ justed when being used in air quality or climate model simulations (Peterenko et al., 2012). Kaiser et al. (2012) recommend a global enhancement by a factor of 3.4 as first-order correction. Yang et al. (2011) also found smoke emissions (PM_{2.5}) derived using the bottom-up approach was underestimated by a factor of three when comparted to MODIS AOD measurements. These values are also consistent with differences of up
- to a factor of three found by Ichoku and Kaufmann (2005) using satellite observations of FRP and AOD compared to measurements of $c \times \kappa_I(s)$ derived from laboratory measurements. According to the GFEDv3 land cover dataset, Greece is extratropical forest and the species and their emissions factors are given in Table 4.

The atmospheric aerosol model (Morcrette et al., 2008) used within the ECMWF Integrated Forecasting System (IFS) represents smoke aerosols as black carbon (BC) and organic matter (OM) in both hydrophilic and hydrophobic types. Emissions of the latter



(3)

(4)

CC ① BY are approximated by scaling organic carbon (OC) emissions estimates by a factor of 1.5. Other aerosols included in the model are sea salt, dust and sulphate aerosols. The model simulates advection, convection, diffusion, dry and wet deposition and chemical conversion of the aerosols, with meteorology nudged to the operational ECMWF

analysis every 12 h. The aerosol abundance however, is based solely on source and sink processes and the atmospheric transport. In this study the IFS model was run with a horizontal resolution of 25 km (T799) and with 91 vertical levels up to 0.01 hPa. Smoke emissions were calculated using Eqs. (3) and (4), along with the emissions factors given in Table 4, and were released into the lowest atmospheric level.

10 5.3 Results

5.3.1 Fuel consumption during the Peloponnese wildfires

Figure 9a illustrates the temporal dynamics of total fire FRP (MW) and the equivalent rate of fuel consumption (tonness⁻¹), calculated from the MODIS and SEVIRI FRP measurements at their native temporal resolutions. The period of greatest fire activity occurs between the 23 and 27 August, where the initial active fire detections from SE-15 VIRI and MODIS occur at 07:57 and 09:00 UTC respectively (23 August). At their most intense, the Peloponnese fires consumed over 15 ts⁻¹ of biomass, and such was their intensity that large quantities of fuel $(>3ts^{-1})$ were consumed even during the night when typical fires die down guite considerably (Roberts and Wooster, 2007; Roberts et al., 2009). The temporally intermittent MODIS Terra and Aqua FRP measurements 20 broadly capture the pattern seen in the much more frequent SEVIRI data, and are typically much higher in magnitude. On the 25 August, MODIS Aqua (12:05 UTC) detects a total FRP exceeding 180 GW, with the SEVIRI FRP (12:12 UTC) very much lower (38 GW). The large difference mainly derives from the fact that whilst 10 % (31) of the MODIS active fire pixels have an FRP > 1600 MW and 5% > 3000 MW, 23% of the 25 100 active fire pixels detected by SEVIRI are in fact saturated in their MWIR channel



from which the FRP is estimated. This demonstrates the massive scale of these fires, particularly given that the SEVIRI's pixel area over the region is $\sim 14\,\text{km}^2$.

Temporal integration of the FRP measurements between the 23 August and 3 September indicates an energy release of $4.73\,PJ$ which, following Eq. (2), equates

- to 1.74 Tg of combusted fuel predominantly consumed on 23–27 August (Fig. 9b). Various burned area estimates exist for these wildfires, including 1773 km² (Gitas et al., 2008), 1628 km² (European Forest Fires Information System, EFFIS; European Commission, 2010) and 1847 km² (Roy et al., 2005; Fig. 8). Dividing the SEVIRI-FRP derived fuel consumption with these burned areas provides mean dry matter (DM) fuel
- ¹⁰ consumptions of 0.98, 1.07 and 0.94 kg m⁻² respectively. Aleppo pine forests occupy around 370 000 ha in Greece and are abundant on Peloponnese (Verroios and Georgiadis, 2011). Mitsopoulos and Dimitrakopoulos (2013) assessed 40 stands in this fuel type and found canopy fuel loads to range between 0.63 and 1.82 kg m⁻², estimating a mean of 1.08 kg m⁻². Using the maximum fuel load (1.82 kg m⁻²), the three burned
- ¹⁵ area estimates (1773, 1628 and 1847 km²), and assuming a combustion completeness value for forest of 0.6 (van der Werf et al., 2006) we calculated a fuel consumption for these fires of 1.94, 1.77 and 2.01 Tg respectively using the standard burned area based approach (Seiler and Crutzen, 1980). Turquety et al. (2009) estimates that 0.32 Tg of CO was emitted during the fire events which, using the emissions factors given in Ta-
- ²⁰ ble 4, results in a fuel consumption estimate of 3.0 Tg (uncertainty of ~ 30 %). Whilst these alternative, independently derived fuel consumption estimates are not too dissimilar to the SEVIRI-FRP derived values, the fuel load assumption made does not include the combustion of surface litter and/or organic soils, which would increase the burned area based estimates somewhat. Furthermore, due to the SEVIRI MWIR chan-
- ²⁵ nel saturation, the SEVIRI FRP-derived fuel consumption estimate will be a minimum estimate.





5.3.2 Smoke plume evolution

The Peloponnese wildfires produced huge volumes of smoke that affected regional air quality in the Eastern Mediterranean (Poupkou et al., 2014). Figure 10a shows a true colour composite image derived from MODIS Terra imagery acquired on the 26

- ⁵ August 2007 (09:35 UTC). The mirrored "S" shaped plume present over the Mediterranean extends across to Tunisia at this time. Figure 10b shows a snapshot of the modelled smoke emissions derived from our use of the FRP-PIXEL product dataset to derive the wildfire emissions, and the use of these within the IFS model (Sect. 5.2). The modelled smoke emission transport captures the spatial structure of the advected
- ¹⁰ smoke plumes very well, consisting of a series of "pulses" of increased AOD that result from the particularly intense emissions during the peak of each diurnal fire cycle. The large region of particularly high AOD on the coast of Libya (L on Fig. 10b, and shown in Fig. 11a and b) results from the intense fire emissions on the 25 August, where more than 18 t s⁻¹ of biomass were apparently being consumed at the peak intensity. To the
- west of the main smoke plume, a thinner plume with a lower AOD is evident emanating from fires in Albania. To the east, a smaller plume resulting from the wildfires in Turkey is also captured.

It is evident from Fig. 10 that the modelled smoke plumes are offset slightly compared to the actual plumes observed by MODIS, and this is most evident over the Libyan coast. The difference is believed to result from injecting the smoke plume into the lowest atmospheric level, which maybe an oversimplification since MISR-derived smoke plume heights acquired on 26 August indicated that the plume closest to the wildfires had a height of 2.5 km (Lui et al., 2009). Global analysis of MISR data indicates that a large proportion wildfire smoke plume heights remain beneath the bound-

ary layer, although particularly intense fires can inject smoke into the free troposphere (Val Martin et al., 2010; Dirksen et al., 2009; Fromm et al., 2000). The modelled plume is typically also broader than that observed by MODIS and covers a larger spatial extent, which may result from the models relatively coarse spatial resolution. We made





comparisons between our model output and the MODIS AOD estimates made on the 26 August (DOY 238, Fig. 11a and b). These indicate that, whilst the broad magnitude of emission "pulses" are in good agreement, the model typically overestimates AOD. This suggests some inaccuracies remain in the aerosol source modelling, and for example Garcia-Menendez et al. (2014) found modelled $PM_{2.5}$ concentrations are more sensitive to the injection height parameterisation rather than the emissions vertical distribution, due to the diurnal evolution of the planetary boundary layer and local

5.4 Impact of emissions fields temporal resolution

meteorology

- ¹⁰ A number of studies (e.g. Chen et al., 2009; Marlier et al., 2014; Reid et al., 2009; Garcia-Menendez et al., 2014) have found that resolving the diurnal variability of fire emissions has important implications when modelling their atmospheric transport. We used our study of the Peloponnese fires to address this issue by reducing the temporal resolution of the SEVIRI FRP-derived emissions density fields from 1 h to 1 day and
- ¹⁵ 1 week, the latter two being more representative of the global emissions inventories developed using only observations from polar orbiting instruments (van der Werf et al., 2010; Kaiser et al., 2012; Sofiev et al., 2009). The influence of source temporal resolution is illustrated in Fig. 12a and b, which show modelled AOD (at 550 nm) on the 26 August (09:35 UTC) using the emissions prescribed at a daily and weekly temporal res-
- olution. In both cases, the shape of the modelled Peloponnese smoke plume remains broadly consistent with the hourly simulation of Fig. 10a, although smoke emissions from neighbouring countries are much less pronounced. The Albanian plume is progressively shorter in Fig. 12a and b, whilst some plumes (e.g. Turkey to Crete) are missing altogether. Source emissions at weekly temporal resolution (Fig. 12b) remove
- the daily variability, resulting in lower aerosol amounts at both the source region and over the entire plume. It is also evident that emissions are being generated at incorrect times in these reduced temporal resolution instances. For example, the daily and



weekly simulations have plumes emanating from southern Italy too early, since fires are just developing in the source region (Fig. 12b).

5.5 Comparison of in situ and modelled aerosol optical depth

Section 5.4 has indicated that model simulations using hourly smoke emissions fields
⁵ improves the representation of both the spatial and temporal evolution of the Peloponnese smoke plumes. However, qualitative comparison to MODIS AOD estimates (Fig. 11a and b) indicated that the modelled AOD was somewhat higher than the satellite derived estimates. Over the same time period as the Peloponnese fires, a series of fires occurred on the Algerian coast (Fig. 13a) whose plumes were detected by the AERONET (Holben et al., 2001) site at Lecce (Italy; 40.35° N, 18.16° E). Figure 13b and c show the modelled smoke and dust AOD respectively on the 31 August (00:00 UTC) where the former illustrates the smoke plume extension over the AERONET site (yellow star symbol). Figure 13d is a temporal profile of AOD recorded (at 500 nm) over Lecce

- from AERONET observations of total (red circles) and fine mode (orange circles) AOD,
 daily averaged MODIS AOD (550 nm) observations (black triangles) and model simulations of total AOD (blue line). Modelled AOD contributions of smoke (purple line) and dust (green line) to the total AOD are also shown. The MODIS AOD estimates are derived through averaging all observations within the model grid cell. The smoke AOD displays greater short term variability than does the dust AOD, since the wildfires repre-
- sent significantly more localised sources than do the regions of dust uplift. The smoke AOD displays an increase in magnitude from 0.6 to 1.3 between the 31 August and 1 September, which occurs 23 h prior to the peak FRP (63 GW) of the Algerian fires. However, between the 27 and 31 August, MODIS detected 330 active fires in southern Italy (Fig. 14) which were greatest in number on the 27 (114) and 31 (110) August and which are likely to have contributed to the Algerian area.
- which are likely to have contributed to the Algerian smoke plume but which may not all be included in our modelling since the majority (63 %) had an FRP < 30 MW and so may not be detected by SEVIRI.





Compared to the daily averaged MODIS AOD, our modelled total AOD is typically overestimated by ~ 20 % during the overpass of the smoke plume (31 August), but the model does capture the temporal trend of the observed AOD rather well. The AERONET AOD provides a more complete temporal profile than do the MODIS ob-

- servations, and our modelled total AOD typically captures these dynamics. However, the onset of increased AOD due to the Algerian fires (30 August) is captured 8 h earlier by AERONET than by the modelled AOD, whilst the descending limb is temporally coincident between datasets. The former may result from assumptions made regarding the smoke plume injection heights, or to shortcomings in the simulations due to increased
- ¹⁰ cloud cover over Algeria on the 29 August. It is also possible that, given the rapid rise in AOD in a three hour period, this is a localised effect due small, undetected fires in the vicinity of the AERONET station and which are not represented in the model. Between the 28 and 29 August, MODIS detects 96 active fires (Fig. 13, red symbols) to the south-west of Lecce and in close proximity to the smoke plume emitted by the Alge-
- rian fires, and these most likely to contribute to the elevated AOD at this time (Fig. 11a and b). In general, the AOD resulting from the use of the SEVIRI FRP-PIXEL product data and the IFS model is overestimated compared to AERONET observations by 10–40 % during the biomass burning plume overpass, and with a discrepancy of 8 h at the onset of the plume overpass. Clearly we will in future aim to further refine the fire
- emissions parameterisation, which appears currently to be positively biased relative to the observations. Nevertheless, this case study has demonstrated the value of the SEVIRI-derived FRP observations for large, rapidly varying wildfires such as this.

5.6 Air quality assessment

Jacobson (2014) estimated that the average annual number of premature mortalities ²⁵ due to biomass burning emissions of $PM_{2.5}$ and ozone are of the order of 20 000 (10 000–30 000) and 230 000 (63 000–405 000) respectively. This equates to 5–10 % of the global mortality due to indoor and outdoor air pollution. One of the primary uses of the CAMS is to be able to forecast regional air quality across Europe, including im-



pacts from wildfires, providing rapid and reliable information directly relevant to such human health issues (Hollingsworth et al., 2008). It is therefore pertinent to assess our modelled impacts of the Peloponnese fires in relation to such air quality and human health impacts, potentially since Mitsakis et al. (2014) already estimated that over 2000

- ⁵ people were admitted to hospitals and medical centres as a direct result of the event, and of these 1100 were due to cardio-vascular and respiratory problems. The World Health Organisation (WHO) air quality guidelines (WHO, 2006) set a limit of 25 µgm⁻³ for the concentration of fine mode particulate matter (PM_{2.5}) averaged over a 24 h period. In the model, we estimated the concentrations of PM_{2.5} using the simulated OM and BC concentrations in the lowest modelled atmospheric layer, and calculated the
- and BC concentrations in the lowest modelled atmospheric layer, and 24 h running average.

Figure 15 shows the 24 h mean $PM_{2.5}$ concentrations modelled between 23 August and 3 September (when the Peloponnese wildfires were at their most intense; Fig. 9a). It is clear that the impacts of the Peloponnese wildfires extend well beyond national bor-

- $_{15}$ ders, and indeed that they resulted in large parts of the Mediterranean region exceeding the WHO 25 $\mu g\,m^{-3}\,PM_{2.5}$ concentration threshold by large margins. In fact, analysis of the spatial distribution of these data with respect to population density (CIESIN and CIAT, 2005) indicated that, for the region shown in Fig. 15, 41 million people were subject to PM_{2.5} concentrations exceeding the WHO guidelines. However, it should be
- stressed that this is an upper limit for the exposure, because our study almost certainly over-estimates near-surface smoke concentrations due to the assumed near-surface injection of the emissions. In particular, surface PM_{2.5} concentrations in regions close to the source that are well above 100 µg m⁻³ are very likely to be spurious. Nonetheless, the considerable human health impacts that these type of large wildfire events
- can have, and their potential to extend over large regions, highlights the necessity of modelling their smoke emissions and forecasting their atmospheric transport. Through such work, the CAMS and its downstream services aim at improving emergency preparedness through air quality forecasts. Geostationary FRP data are likely to be an important component of this system, particularly so as their high temporal resolution





FRP data provides a unique view of the type of individual large fire event studied here that can impact regional air quality so dramatically over short timescales.

6 Summary and conclusions

15

This work has provided a detailed performance evaluation of the Meteosat SEVIRI 5 FRP products available from the LSA SAF, both the full resolution FRP-PIXEL product and the reduced resolution FRP-GRID product, both available in near real time and in archived form (http://landsaf.meteo.pt/). It has also provided a detailed example of use of the former product in characterising the smoke emissions from a large European wildfire, and in modelling their atmospheric transport and human health impacts at high 10 temporal resolution.

When evaluated against the MODIS MOD14 and MYD14 active fire products, the active fire pixel detection error of commission of the FRP-PIXEL product is found to be 9 % in the North African LSA SAF geographic region, and increases to higher values particularly in Europe and South America. The basis of this variation is the combination of SEVIRI's increasing pixel area with view zenith angle away from the sub-satellite point, and the relative proportion of lower intensity and/or smaller fires in the various LSA SAF geographic regions (i.e. their fire regimes). Area-based comparisons indicate that

- the FRP-PIXEL product underestimates compared to simultaneously collected MODIS
 FRP of a region by between 35 and 89%, with the variation being again dependent
 upon the above factors. Underestimation is typically maximised at regions extending towards the edge of the viewing disk, furthest away from the SEVIRI sub-satellite point. However, comparison of the FRP of individual fires successfully detected almost simultaneously by both SEVIRI and MODIS indicates a strong agreement between the two FRP measurements, with the FRP-PIXEL product meeting its Target Accuracy require-
- ments. We find that 76% of the examined simultaneously detected fire clusters had an FRP from SEVIRI within 30% of that measured by MODIS, which given the recent quantification of MODIS' FRP uncertainty (Freeborn et al., 2014c) indicates good





performance from the FRP-PIXEL product. Overall, minimal bias is seen between the per-fire FRP observations made by the two sensors. The FTA errors of commission are currently being reduced by re-inclusion of the dynamic spatial thresholding parameters described in Section 3.2.2 that were removed from the operational FTA algorithm for ⁵ computational speed, but included in the original Roberts and Wooster (2008) proto-type.

When compared against that of other active fire products derived from the same Meteosat SEVIRI observations, the performance of the operational geostationary fire thermal anomaly (FTA) algorithm used within the FRP-PIXEL product (Wooster et al., 2015)

- ¹⁰ compares favourably. During our comparison to MODIS, the SEVIRI WFABBA, FDeM and FIR products from Prins et al. (1998), Amraoui et al. (2010) and Joro et al. (2008) respectively have higher active fire errors of omission, varying between 84 and 95 %, as compared to the 77 % of the FRP-PIXEL product. However, these alternative SEVIRIderived active fire products do have lower errors of commission than the FRP-PIXEL
- ¹⁵ product when compared to MODIS, ranging between 5 and 6 % (the FRP-PIXEL product has a 13 % commission error). The FTA errors of commission are currently being reduced by re-inclusion of the dynamic spatial thresholding parameters described in Section 3.2.2 that were removed from the operational FTA algorithm for computational speed, but included in the original Roberts and Wooster (2008) prototype.
- The Level-3 FRP-GRID product accumulates a series of FRP-PIXEL products and provides regional estimates of mean FRP at an hourly temporal resolution and a 5.0° spatial resolution. These estimates come already adjusted for cloud cover, and for the impact of the low spatial resolution detection bias that results in SEVIRI failing to detect the lower FRP active fire pixels. Our evaluation indicates good performance of
- these bias corrections at the hourly, 5.0° product resolution, but evaluation of accumulated data against summed weekly MODIS FRP over the four LSA SAF geographic regions indicates that the FRP-GRID product underestimates total FRP at this scale. This largely results from the difficulty in accounting for situations where MODIS detects fire activity in a grid cell whilst SEVIRI does not, and so the bias corrections remain in-





active. We provide herein some additional adjustment factors for those wishing to use the SEVIRI FRP-GRID datasets at this type of scale.

Despite their coarse spatial resolution limitations, the FRP products available from geostationary satellites offer an unprecedented high temporal resolution for studying wildfire emissions. This is a key advantage when using such data to parameterise wildfire smoke emissions within atmospheric transport models (Reid et al., 2009). Here we use a version of the FRP-PIXEL product to characterise the smoke emissions from the August 2007 Peloponnese wildfires. The resulting emissions fields are used within ECMWF's Integrated Forecast System (IFS) to model the smoke emissions transport, and in particular the black carbon and organic carbon aerosols and the resulting aerosol optical depth and PM_{2.5} surface concentrations. Our results support the findings of other recent studies (e.g. Garcia-Menendez et al., 2014; Marlier et al., 2014) in

that higher temporal resolution smoke emissions estimates provide increased fidelity in the resulting smoke plume aerial distribution and optical thickness metrics than do

- simulations conducted using daily (e.g. from MODIS FRP) or weekly (e.g. from burned area estimates) temporal resolution data. Visual assessment of the modelled plumes spatial distribution against simultaneous MODIS optical imagery shows good agreement, but the modelled plume is slightly offset from the observations which is believed to result from injecting the plume into the lowest atmospheric layer (whereas in real-
- ity it would have been lofted to higher altitudes). Quantitative comparisons between our modelled AOD and the coincident MODIS- and AERONET-derived AOD values indicate that modelled AODs are overestimated by ~ 20–30 %. Further research into model parameterisation (e.g. injection height) and the aerosol emission factors is required to investigate this bias, particualrly so as it is likely that we underestimate fuel
- ²⁵ consumption due to many SEVIRI FRP pixels being affected by MWIR channel saturation during this extreme wildfire event. The European Union (EU) has recently signed a delegation agreement with ECMWF to provide the services implemented in MACC, including the FRP-based Global Fire Assimilation System (GFAS; Kaiser et al., 2012), in an operational manner until at least 2020. This includes on-going development of





GFAS which aim at providing emission estimates with an hourly temporal resolution by combining FRP observations from both polar orbiting and geostationary satellites. Key pre-requisites are the implementation of a model for the diurnal cycle of FRP (Andela et al. 2015) and a suitable bias correction for geostationary FRP products to account for the omission of low intensity fires, building on the simple linear bias corrections applied currently in the FRP-GRID products.

Acknowledgements. Funding for this work came from the UK NERC National Centre for Earth Observation (NCEO), from the LSA SAF project, from EUMETSAT and the EU H2020 project MACC-III (contract no. 633 080). SEVIRI data were kindly provided under an ESA/EUMETSAT AO, the MODIS data were provided by the NASA EDC DAACS and the European Forest Fire

- AO, the MODIS data were provided by the NASA EDC DAACS and the European Forest Fire Information System (EFFIS; http://effis.jrc.ec.europa.eu) of the European Commission Joint Research Centre provided burned area data. The GOES/SEVIRI WFABBA data were provided by the Cooperative Institute for Meteorological Satellite Studies (CIMSS) within the Space Science and Engineering Center (SSEC) at University of Wisconsin (UW-Madison) as a collabora-
- tive effort between NOAA/NESDIS/STAR and UW-CIMSS personnel. The SEVIRI FRP product were provided by the LSA SAF (http://landsaf.meteo.pt/).The FDeM product was provided by Carlos C. DaCamara and Sofia Ermida at Universidade de Lisboa (http://www.fc.ul.pt/) The FIR fire products were obtained from EUMETSAT EO portal (https://eoportal.eumetsat.int/). The authors would also like to thank Jiangping He (Kings College London), Allessio Lattanzio
- ²⁰ (EUMETSAT), Isabel Trigo (LSA SAF) and Yves Govaerts (Rayference) for the assistance and advice provided during this study.

References

Aminou, D. M. A., Jacquet, B., and Pasternak, F.: Characteristics of the Meteosat second generation radiometer/imager: SEVIRI, Proceedings of SPIE, Europto series, 3221, 19–31, 1997.

 Amraoui, M., DaCamara, C. C., and Pereira, J. M. C.: Detection and monitoring of African vegetation fires using MSG-SEVIRI imagery, Remote Sens. Environ., 114, 1038–1052, 2010.
 Andela, N., Kaiser, J. W., van der Werf, G. R., and Wooster, M. J.: New fire diurnal cycle characterizations to improve fire radiative energy assessments made from low-Earth orbit satellites





sampling, Atmos. Chem. Phys. Discuss., 15, 9661–9707, doi:10.5194/acpd-15-9661-2015, 2015.

- Andreae, M. O. and Merlet, P.: Emission of trace gases and aerosols from biomass burning, Global Biogeochem. Cy., 15, 995–966, 2001.
- ⁵ Berk, A., Anderson, G. P., Acharya, P. K., Bernstein, L. S., Muratov, L., Lee, J., Fox, M., Adler-Golden, S. M., Chetwynd, J. H., Hoke, M. L., Lockwood, R. B., Gardner, J. A., Cooley, T. W., Borel, C. C., and Lewis, P. E.: MODTRAN (TM) 5, a reformulated atmospheric band model with auxiliary species and practical multiple scattering options: update, P. Soc. Photo.-Opt. Ins., 5806, 662–667, 2005.
- ¹⁰ Calle, A., Casanova, J.-L., and Gonzales-Alonso, F.: Impact of point spread function of MSG SEVIRI on active fire detections, Int. J. Remote Sens., 30, 4567–4579, 2009.
 - Center for International Earth Science Information Network (CIESIN) and Centro Internacional de Agricultura Tropical (CIAT): Gridded Population of the World Version 3 (GPWv3), available at: http://sedac.ciesin.columbia.edu/gpw/index.jsp, CIESIN Columbia University, Palisades, NY, 2005.
- ¹⁵ NY, 200

25

- Chen, Y., Li, Q., Randerson, J. T., Lyons, E. A., Kahn, R. A., Nelson, D. L., and Diner, D. J.: The sensitivity of CO and aerosol transport to the temporal and vertical distribution of North American boreal fire emissions, Atmos. Chem. Phys., 9, 6559–6580, doi:10.5194/acp-9-6559-2009, 2009.
- ²⁰ Csiszar, I., Schroeder, W., Giglio, L., Ellicott, E., Vadrevu, K. P., Justice, C. O., and Wind, B.: Active fires from Suomi NPP Visible Infrared Imaging Radiometer Suite: product status and fire evaluation results, J. Geophys. Res.-Atmos., 119, 803–816, 2014.
 - DaCamara, C. C.: The Land Surface Analysis SAF: one year of pre-operational activity, in: The 2006 EUMETSAT Meteorological Satellite Conference, Helsinki, Finland, 12–16 June 2006, EUMETSATP. 48, ISBN 92-9110-076-5, 8 pp., 2006.
 - Derrien, M. and Le Gleau, H.: MSG/SEVIRI cloud mask and type from SAFNWC, Int. J. Remote Sens., 26, 4707–4732, 2005.
 - EUMETSAT: Active Fire Monitoring with MSG, Algorithm Theoretical Basis Document, EUM/MET/REP/07/0170, Darmstadt Germany, 2007.
- ³⁰ European Commission: Forest Fires in Europe 2009, EUR 24502 EN, Office for Official Publications of the European Communities, Luxembourg, 81 pp., 2010.
 - Freeborn, P. H., Wooster, M. J., Hao, W. M., Ryan, C. A., Nordgren, B. L, Baker, S. P., and Ichoku, C.: Relationships between energy release, fuel mass loss, and trace gas





15951

doi:10.1029/2007JD008679, 2008.Freeborn, P. H., Wooster, M. J., Roberts, G., Malamud, B. D., and Xu, W.: Development of a virtual active fire product for Africa through a synthesis of geostationary and polar orbiting

satellite data, Remote Sens. Environ., 113, 1700–1711, 2009.

5

Freeborn, P. H., Wooster, M. J., and Roberts, G.: Addressing the spatiotemporal sampling design of MODIS to provide estimates of the fire radiative energy emitted from Africa, Remote Sens. Environ., 115, 475–489, 2011.

and aerosol emissions during laboratory biomass fires, J. Geophys. Res., 113, D01301,

Freeborn, P. H., Wooster, M. J., Roberts, G., and Xu, W.: Evaluating the SEVIRI fire thermal

- anomaly detection algorithm across the Central African Republic using the MODIS active fire product, Remote Sens., 6, 1890–1917, doi:10.3390/rs6031890, 2014a.
 - Freeborn, P. H., Cochrane, M. A., and Wooster, M. J.: A decade long, multi-scale map comparison of fire regime parameters derived from three publically available satellite-based fire products: a case study in the Central African Republic, Remote Sens., 6, 4061–4089, 2014b.
- ¹⁵ Freeborn, P. H., Wooster, M. J., Roy, D. P., and Cochrane, M. A.:. Quantification of MODIS Fire Radiative Power (FRP) measurement uncertainty for use in satellite-based active fire characterization and biomass burning estimation, Geophys. Res. Lett., 41, 1988–1994, 2014c.
 - Fromm, M., Jerome, A., Hoppel, K., Hornstein, J., Bevilacqua, R., Shettle, E., Servranckx, R., Zhanqing, L., and Stocks, B.: Observations of boreal forest fire smoke in the strato-
- ²⁰ sphere by POAM III, SAGE II, and lidar in 1998, Geophys. Res. Lett., 27, 1407–1410, doi:10.1029/1999GL011200, 2000.
 - Garcia-Meenedez, F., Hu, Y., and Odman, M. T.: Simulating smoke transport from wildland fires with a regional-scale air quality model: sensitivity to spatiotemporal allocation of fire emissions, Sci. Total Environ., 493, 544–553, 2014.
- Georgiev, C. G. and Stoyanova, J. S.: Parallel use of SEVIRI LSA SAF FRP and MPEF FIR products for fire detection and monitoring, 2013 EUMETSAT Meteorological Satellite Conference, 19th American Meteorological Society, AMS Satellite Meteorology, Oceanography and Climatology Conference, 16–20 September 2013, Vienna, Austria, ISSN 1011–3932, 2013.
 Giglio, L., Descloitres, J., Justice, C. O., and Kaufman, Y. J.: An enhanced contextural fire detection algorithm for MODIS, Remote Sens. Environ., 87, 273–282, 2003.
 - Gitas, I. Z., Polychronaki, A., Katagis, T., and Mallinis, G.: Contribution of remote sensing to disaster management activities: a case study of the large fires in the Peloponnese, Greece, Int. J. Remote Sens., 29, 1847–1853, doi:10.1080/01431160701874553, 2008.





- Govaerts, Y.: RTMOM V0B.10 Evaluation Report, Report EUM/MET/DOC/06/0502, EUMET-SAT, 2006, 2226, 2006.
- Govaerts, Y. M., Wooster, M., Freeborn, P., Lattanzio, A., and Roberts, G.: Algorithm Theoretocal Basis Document for MSG SEVIRI Fire Radiative Power (FRP) Characterisation, EUM/MET/SPE/06/0398, EUMETSAT, 2010.
- Heil, A., Kaiser, J. W., van der Werf, G. R., Wooster, M. J., Schultz, M. J., and Dernier van der Gron, H. : Assessment of the Real-Time Fire Emissions (GFAS) by MACC, Tech Memo, 628, ECMWF, Reading, UK, 2010.

5

Holben, B. N., Smirnov, A., Eck, T. F., Slutsker, I., Abuhassan, N., Newcomb, W. W.,

- Schafer, J. S., Tanre, D., Chatenet, B., and Lavenu, F.: An emerging ground-based aerosol climatology: aerosol optical depth from AERONET, J. Geophys. Res.-Atmos., 106, 12067– 12097, doi:10.1029/2001JD900014, 2001.
 - Hollingsworth, A., Engelen, R. J., Benedetti, A., Dethof, A., Flemming, J., Kaiser, J. W., Morcrette, J.-J., Simmons, A. J., Textor, C., Boucher, O., Chevallier, F., Rayner, P., Elbern, H.,
- Eskes, H., Granier, C., Peuch, V.-H., Rouil, L., and Schultz, M. G.: Toward a monitoring and forecasting system for atmospheric composition: the GEMS Project, B. Am. Meteorol. Soc., 89, 1147–1164, doi:10.1175/2008BAMS2355.1, 2008.

Ichoku, C. and Kaufman, Y. J.: A method to derive smoke emission rates from MODIS fire radiative energy measurements, IEEE T. Geosci. Remote, 43, 2636–2649, 2005.

- Jacobson, M. Z.: Effects of biomass burning on climate, accounting for heat and moisture fluxes, black and brown carbon, and cloud absorption effects, J. Geophys. Res.-Atmos., 119, 8980– 9002, doi:10.1002/2014JD021861, 2014.
 - Joro, S., Samain, O., Yildirim, A., van de Berg, L., and Lutz, H. J.: Towards an Improved Active Fire Monitoring Product for MSG Satellites, available at:
- ²⁵ www.eumetsat.int/cs/idcplg?ldcService=GET_FILE&dDocName=pdf_conf_p_s8_47_ joro_v&allowInterrupt=1&noSaveAs=1&RevisionSelectionMethod=LatestReleased, 2008.
 - Kaiser, J. W., Suttie, M., Flemming, J., Morcrette, J.-J., Boucher, O., and Schultz, M. G.:. Global real-time fire emission estimates based on space-borne fire radiative power observations, AIP Conf. Proc., 1100, 645–648, 2009a.
- ³⁰ Kaiser, J. W., Boucher, O., Doutriaux-Boucher, M., Flemming, J., Govaerts, Y. M., Gulliver, J., Heil, A., Jones, L., Lattanzio, A., Morcrette, J.-J., Perrone, M. R., Razinger, M., Roberts, G., Schultz, M. G., Simmons, A. J., Suttie, M., and Wooster, M. J.: Smoke in the air, ECMWF Newsletter, 119, European Centre for Medium-range Weather Forecasts, 9–15, 2009b.



Discussion

Paper

Discussion

Paper

Discussion Paper

Discussion Paper



- Kaiser, J. W., Heil, A., Andreae, M. O., Benedetti, A., Chubarova, N., Jones, L., Morcrette, J.-J., Razinger, M., Schultz, M. G., Suttie, M., and van der Werf, G. R.: Biomass burning emissions estimated with a global fire assimilation system based on observed fire radiative power, Biogeosciences, 9, 527–554, doi:10.5194/bg-9-527-2012, 2012.
- Kaufman, Y. J. and Remer, L. A.: Detection of forests using Mid-IR reflectance: an application for aerosol studies, IEEE T. Geosci. Remote, 32, 672–683, 1994.
 - Koutsias, N., Arianmoutsou, M., Kallimanis, A. S., Mallinis, G., Halley, J. M., and Dimopoulos, P.: Where did the fires burn in Peloponnese, Greece the summer of 2007?, Evidence for a synergy of fuel and weather, Agr. Forest Meteorol., 156, 41–53, 2012.
- Li, Z., Kaufman, Y. J., Ichoku, C., Fraser, R., Trishchenko, A., Giglio, L., and Yu, X.: A review of AVHRR-based active fire detection algorithms: principles, limitations, and recommendations, in: Global and Regional Vegetation Fire Monitoring From Space, Planning and Coordinated International Effort, Academic Publishing, The Hague, 199–225, 2001.

Liu, Y., Kahn, R. A., Chaloulakou, A., and Koutrakis, P.: Analysis of the impact of the forest fires in August 2007 on air quality of Athens using multi-sensor aerosol remote sensing data, meteorology and surface observations, Atmos. Environ., 43, 3310–3318, 2009.

- Mallinis, G., Mitsopoulos, I., Stournara, P., Patias, P., and Dimitrakopoulos, A.: Canopy fuel load mapping of Mediterranean pine sites based on individual tree crown delineation, Remote Sens., 5, 6461–6480, doi:10.3390/rs5126461, 2013.
- Marlier, M. E., Voulgarakis, A., Shindell, D. T., Faluvegi, G., Henry, C. L., and Randerson, J. T.: The role of temporal evolution in modeling atmospheric emissions from tropical fires, Atmos. Environ., 89, 158–168, doi:10.1016/j.atmosenv.2014.02.039, 2014.
 - MeteoFrance: Algorithm Theoretical Basis Document For Cloud Products, Technical Report, SAF/NWC/CDOP/MFL/SCI/ATBD/01, MeteoFrance, 2010.
- ²⁵ Mistakis, E., Stamos, I., Panakinolaou, A., Aifadopoulou, G., and Kontoes, H.: Assessment of extreme weather events on transport networks: case study of the 2007 wildfires in Peloponnesus, Nat. Hazards, 72, 87–107, doi:10.1007/s11069-013-0896-3, 2014.
 - Mitsopoulos, I. D. and Dimitrakopoulos, A. P. : Estimation of canopy fuel characteristics of Aleppo pine (*Pinus halepensis Mill.*) forests in Greece based on common stand parameters,
- ³⁰ European J. Forest Res., 133, 73–79, doi:10.1007/s10342-013-0740-z, 2014.
 - Morcrette, J.-J., Jones, L., Kaiser, J. W., Benedetti, A., and Boucher, O.: Toward a Forecast of Aerosols With the ECMWF Integrated Forecast System, ECMWF Newsletter. No. 114, ECMWF, Reading, UK, 2008.





- Petrenko, M., Kahn, R., Chin, M., Soja, A., Kucsera, T., and Harshvardhan: The use of satellitemeasured aerosol optical depth to constrain biomass burning emissions source strength in the global model GOCART, J. Geophys. Res., 117, D22204. doi:10.1029/2012JD017870, 2012.
- 5 Pereira, G., Shimabukuro, Y. E., Moraes, E. C., Freitas, S. R., Cardozo, F. S., and Longo, K. M.: Monitoring the transport of biomass burning emission in South America, Atmos. Pollut. Res., 3, 247-254, 2011.
 - Petitcolin, F. and Vermote, E.: Land surface reflectance, emissivity and temperature from MODIS middle and thermal infrared data, Remote Sens. Environ., 82, 112–134, 2002.
- Prins, E. M. and Menzel, W. P.: Trends in South American biomass burning with the GOES 10 visible infrared spin scan radiometer atmospheric sounder from 1983 to 1991, J. Geophys. Res., 99, 16719-16735, 1994.
 - Prins, E. M., Felts, J. M., Menzel, W. P., and Ward, D. E.: An overview of GOES-8 diurnal fire and smoke results for SCAR-B and 1995 fire season in South America, J. Geophys. Res.,

103. 31821-31835. 1998. 15

- Poupkou, A., Markakis, K., Liora, N., Giannaros, T. M., Zanis, P., Im, U., Daskalakis, N., Myriokefalitakis, S., Kaiser, J. W., Melas, D., Kanakidou, M., Karacostas, T., and Zerefos, C.:. A modeling study of the impact of the 2007 Greek forest fires on the gaseous pollutant levels in the Eastern Mediterranean, Atmos. Environ., 148, 1–17, 2014.
- Reid, J. S., Hyer, E. J., Prins, E. M., Westphal, D. L., Zhang, J., Wang, J., Christopher, S. A., 20 Curtis, C. A., Schmidt, C. C., Eleuterio, D. P., Richardson, K. A., and Hoffman, J. P.: Global monitoring and forecasting of biomass-burning smoke: description of and lessons from the Fire Locating and Modeling of Burning Emissions (FLAMBE) program, IEEE J. Sel. Top. Appl., 2, 144-162, 2009.
- Roberts, G. and Wooster, M. J.: New perspectives on Africa biomass burning dynamics, EOS, Trans. Am. Geophys. Union, 88, 369-370, 2007.
 - Roberts, G. and Wooster. M., J.: Fire detection and fire characterization over Africa using Meteosat SEVIRI, IEEE T. Geosci. Remote, 48, 1200-1219, 2008.
- Roberts, G. and Wooster, M. J.: Development of a multi-temporal Kalman filter approach to geostationary active fire detection and fire radiative power (FRP) estimation, Remote Sens. 30
 - Environ., 152, 392-412, doi:10.1016/i.rse.2014.06.020, 2014.
 - Roberts, G., Wooster, M. J., Perry, G. L. W., Drake, N., Rebelo, L.-M., and Dipotso, F.: Retrieval of biomass combustion rates and totals from fire radiative power observations: application





to southern Africa using geostationary SEVIRI imagery, J. Geophys. Res., 110, D21111, doi:10.1029/2005JD006018, 2005.

Roberts, G., Wooster, M. J., and Lagoudakis, E.: Annual and diurnal african biomass burning temporal dynamics, Biogeosciences, 6, 849–866, doi:10.5194/bg-6-849-2009, 2009.

- ⁵ Roy, D. P. and Boschetti, L.: Southern Africa Validation of the MODIS, L3JRC and GLOBCARBON Burned Area Products, IEEE T. Geosci. Remote, 47, 1032–1044, doi:10.1109/TGRS.2008.2009000, 2009.
 - Schroeder, W., Prins, E., Giglio, L., Csiszar, I., Schmidt, C., Morisette, and Morton, D.: Validation of GOES and MODIS active fire detection products using ASTER and ETM+ data, Remote Sens. Environ., 112, 2711–2726, 2008.
 - Seiler, W. and Crutzen, P. J.: Estimates of gross and net fluxes of carbon between the biosphere and the atmosphere from biomass burning, Climatic Change, 2, 207–247, 1980.

10

25

- Sofiev, M., Vankevich, R., Lotjonen, M., Prank, M., Petukhov, V., Ermakova, T., Koskinen, J., and Kukkonen, J.: An operational system for the assimilation of the satellite information on
- wild-land fires for the needs of air quality modelling and forecasting, Atmos. Chem. Phys., 9, 6833–6847, doi:10.5194/acp-9-6833-2009, 2009.
 - Tjemkes, S. A. and Scmetz, J.: Synthetic satellite radiances using the radiance sampling method, J. Geophys. Res., 102, 1807–1818, 1997.

Theoharatos, G., Pantavou, K., Mavrakis, A., Spanou, A., Katavoutas, G., Efstathiou, P.,

- ²⁰ Mpekas, P., and Asimakopoulos, D.: Heat waves observed in 2007 in Athens, Greece: synoptic conditions, bioclimatological assessment, air quality levels and health effects, Environ. Res., 110, 152–161, 2010.
 - Tsyro, S., Simpson, D., Tarrason, L., Klimont, Z., Kupianen, K., Pio, C., and Yttri, K. E.: Modeling of elemental carbon over Europe, J. Geophys. Res.-Atmos., 112, D23S19, doi:10.1029/2006JD008164, 2007.
 - Turquety, S., Hurtmans, D., Hadji-Lazaro, J., Coheur, P.-F., Clerbaux, C., Josset, D., and Tsamalis, C.: Tracking the emission and transport of pollution from wildfires using the IASI CO retrievals: analysis of the summer 2007 Greek fires, Atmos. Chem. Phys., 9, 4897–4913, doi:10.5194/acp-9-4897-2009, 2009.
- ³⁰ Turquety, S., Menut, L., Bessagnet, B., Anav, A., Viovy, N., Maignan, F., and Wooster, M.: API-FLAME v1.0: high-resolution fire emission model and application to the Euro-Mediterranean region, Geosci. Model Dev., 7, 587–612, doi:10.5194/gmd-7-587-2014, 2014.





- 15956
- 30 Wooster, M. J., Roberts, G., Freeborn, P., Xu, W., Govaerts, Y., Beeby, R., He, J., Lattanzio, A., and Mullen, R.: Meteosat SEVIRI Fire Radiative Power (FRP) products from the Land Surface Analysis Satellite Applications Facility (LSA SAF) - Part 1: Algorithms, product contents

- Wooster, M. J., Zhukov, B., and Oertel, D.: Fire radiative energy for quantitative study of biomass 20 burning: derivation from the BIRD experimental satellite and comparison to MODIS fire products, Remote Sens. Environ., 86, 83-107, 2003.

 - Wooster, M. J., Roberts, G., Perry, G. L. W., and Kaufman, Y. J.: Retrieval of biomass combustion rates and totals from fire radiative power observations: FRP derivation and calibration

relationships between biomass consumption and fire radiative energy release, J. Geophys.

product: pre-launch algorithm development and performance evaluation using MODIS and

Wooster, M. J., Xu, W., and Nightingale, T.: Sentinel-3 SLSTR active fire detection and FRP

Res., 110, D24311, doi:10.1029/2005JD006318, 2005.

ASTER datasets, Remote Sens. Environ., 120, 236–254, 2012.

- (southern Greece): plant communities and diversity, Plant Biosyst., 145, 606-619, 2011.
- doi:10.1016/j.rse.2010.05.029, 2010. Verroios, G. and Georgiadis, T.: Aleppo pine forests of northern and western Peloponnisos
- sion of differenced Normalised Burn Ratio (dNBR) fire/burn severity studies: the case of the large 2007 Peloponnese wildfires in Greece, Remote Sens. Environ., 114, 2548-2563,
- van der Werf, G. R., Randerson, J. T., Giglio, L., Collatz, G. J., Mu, M., Kasibhatla, P. S., Mor-10 ton, D. C., DeFries, R. S., Jin, Y., and van Leeuwen, T. T.: Global fire emissions and the contribution of deforestation, savanna, forest, agricultural, and peat fires (1997-2009), Atmos. Chem. Phys., 10, 11707-11735, doi:10.5194/acp-10-11707-2010, 2010. Veraverbeke, S., Lhermitte, S., Verstraeten, W. W., and Goossens, R.: The temporal dimen-

Atmos. Chem. Phys., 6, 3423-3441, doi:10.5194/acp-6-3423-2006, 2006.

15

25

- based observational constraints for 1-D fire smoke plume-rise models, J. Geophys. Res.-5 Atmos., 117, 1–17, D22204, doi:10.1029/2012JD018370, 2012. van der Werf, G. R., Randerson, J. T., Giglio, L., Collatz, G. J., Kasibhatla, P. S., and Arellano Jr., A. F.: Interannual variability in global biomass burning emissions from 1997 to 2004,
- Atmos. Chem. Phys., 10, 1491–1510, doi:10.5194/acp-10-1491-2010, 2010. Val Martin, M., Kahn, R. A., Logan, J. A., Paugam, R., Wooster, M., and Ichoku, C.: Space-



Paper

Discussion Paper

Discussion Paper



Monitoring Service

G. Roberts et al.



and analysis, Atmos. Chem. Phys. Discuss., 15, 15831–15907, doi:10.5194/acpd-15-15831-2015, 2015.

- World Health Organisation: Air Quality Guidelines For Particulate Matter, Ozone, Nitrogen Dioxide and Sulphur Dioxide, WHO/SDE/PHE/OEH/06.02, World Health Organization, WHO
- 5 Press, Geneva, Switzerland, 2006.
 - Xu, W., Wooster, M. J., Roberts, G., and Freeborn, P.: New GOES imager algorithms for cloud and active fire detection and fire radiative power assessment across North, South and Central America, Remote Sens. Environ., 114, 1876–1895, 2010.
 - Yang, E.-S., Christopher, S. A., Kondragunta, S., and Zhang, X.: Use of hourly Geostationary Operational Environmental Satellite (GOES) fire emissions in a Community Multiscale Air
- ¹⁰ Operational Environmental Satellite (GOES) fire emissions in a Community Multiscale Air Quality (CMAQ) model for improving surface particulate matter predictions, J. Geophys. Res.-Atmos., 116, 1–13, D04303, doi:10.1029/2010JD014482, 2011.
 - Zhang, X., Kondragunta, S., Ram, J., Schmidt, C., and Hung, H.-C.: Near-real-time global biomass burning emissions product from geostationary satellite constellation, J. Geophys. Res.-Atmos., 117, 1–13, D14201, doi:10.1029/2012JD017459, 2012.
- Res.-Atmos., 117, 1–13, D14201, doi:10.1029/2012JD017459, 2012.
 Zhukov, B., Lorenz, E., Oertel, D., Wooster, M., and Roberts, G.: Spaceborne detection and characterisation of fires during the bi-spectral infrared detection (BIRD) experimental small satellite mission (2001–2004), Remote Sens. Environ., 100, 29–51, doi:10.1016/j.rse.2005.09.019, 2006.





Table 1. Performance characteristics of the LSA SAF Meteosat SEVIRI FRP-PIXEL product in the four LSA SAF geographical regions, as compared to MODIS active fire product (Collection 5 MOD14 and MYD14) collected over the same area and at the same time. Errors of omission and commission with respect to MODIS were calculated on a per fire pixel basis as described in Sect. 3.1.1. The per-fire basis results (column 5) were obtained when comparing the total FRP retrieved from MODIS and SEVIRI for fires (defined as a spatially contiguous set of active fire pixels) detected by both sensors. The area-based results (column 6) were derived from comparison of the total FRP measured by all detected fires in a matching MODIS and SEVIRI image area, and thus include the influence of non-detected low FRP fires by SEVIRI whilst the per-fire comparison results (column 5) do not.

LSA SAF Geographic Region	Image Dates (2008)	Active Fire Pixel Detection Omission Error (%)	Active Fire Pixel Detection Commission Error (%)	Slope of linear best fit relationship between SEVIRI-to-MODIS per-fire-based FRP measures	Slope of linear best fit relationship between SEVIRI-to-MODIS Area-based FRP measures
northern Africa	1–8 Dec	65	9	0.96	0.65
southern Africa	19–24 Aug	77	13	0.97	0.53
South America	14–24 Aug	91	39	0.97	0.22
Europe	9–17 Aug	97	30	0.88	0.11



Table 2. Summary of active fire pixel detection errors of omission and commission of the four SEVIRI-derived active fire products explored herein (LSA SAF FRP-PIXEL product; Wooster et al., 2015, WF-ABBA; Prins et al., 1998, Fire Detection and Monitoring – FDeM; Amraoui et al., 2010, and FIR Active Fire Monitoring; Joro et al., 2008). Data were collected over the LSA SAF southern Africa geographic region during August 2014, when fire activity is widespread in this area. The MODIS active fire products (MOD14 and MYD14; Giglio et al., 2003) acted as the independent data source for the comparison.

	FRP-PIXEL	WFABBA	FDeM	FIR
SEVIRI fire pixels at coincident MODIS overpasses	33414	13008	7664	7151
SEVIRI fire pixels detected by MODIS	29 037	12284	7260	6730
Commission error (percent)	13	6	5	6
Omission error (percent)	77	83	92	95





Table 3. Summary of the results related to evaluation of the regional bias adjustment factors implemented during the processing of the LSA SAF FRP-GRID product. Slope of the linear best fit between the SEVIRI-predicted regional FRP using the FRP-GRID bias adjustment factors and the FRP measured by MODIS over the same areas are shown, as are the coefficients of determination (r^2), at both 5° and hourly resolution (which is the native FRP-GRID product resolution) and also at a weekly resolution accumulated over the entire LSA SAF geographic region.

LSA SAF Region	Abbreviation	Validation Results: slope (r^2)	
		5.0° and hourly	weekly and regional
northern Africa southern Africa South America Europe	NAfr SAfr SAme Euro	1.04 (0.76) 1.02 (0.91) 0.97 (0.34) 1.72 (0.19)	1.15 (0.96) 1.24 (0.97) 1.89 (0.83) 4.94 (0.84)





Discussion Paper **ACPD** 15, 15909-15976, 2015 **Evaluation and** demonstration of use in the Copernicus **Discussion** Paper **Atmosphere Monitoring Service** G. Roberts et al. **Title Page** Abstract Introduction **Discussion Paper** Conclusions References **Tables** Figures 4 Close Back **Discussion** Paper Full Screen / Esc **Printer-friendly Version** Interactive Discussion

Table 4. Trace gas and particulate smoke emission factors (η) for species (s) based on extratropical forest fuels, taken from Andreae and Merlet (2001). * The emission factor for BC was derived specifically for use in this study (see main text).

Species	Emissions factor (gkg ⁻¹ DM)	
Black carbon (BC)	1.7*	
Organic carbon (OC)	8.6–9.7	
Organic matter (OM)	42*	
Total particulate matter (TPM)	17.6 ± 6.4	
Fine mode aerosol (PM _{2.5})	13.0 ± 7.0	
Carbon Monoxide (CO)	107 ± 37	
()		



Figure 1. SEVIRI's imaging disk showing the mean per-pixel FRP (MW) seen in each SEVIRI pixel, calculated using all FRP-PIXEL products available between 2008–2013. Also indicated are the four geographic regions that LSA-SAF SEVIRI products are subset to.







Figure 2. A comparison of per-fire FRP derived from SEVIRI and MODIS observations of fires observed near-simultaneously by each sensor during one week in each LSA SAF geographic region (Fig. 1). Fires are designated as contiguous clusters of active fire pixels. SEVIRI FRP were taken from the LSA SAF FRP-PIXEL product in each case and MODIS FRP is taken from the MOD14 product (Collection 5; Giglio et al., 2003). The most radiant fires were detected in the northern Africa region (top left), and all regions are displayed on the same x and y axis scales for ease of comparison.







Figure 3. Relationship between regional-scale inter-scene FRP derived from all spatially matched, contemporaneous SEVIRI and MODIS FRP-PIXEL observations for the northern Africa region (1–7 December 2009). The MODIS swath is taken as the observation area. The least squares linear best-fit passing through the origin is shown (bold line), along with the 95% confidence intervals on the mean (light dotted line) and on the prediction of *y* from *x* (outermost lines). The 1 : 1 line is also shown (dashed). SEVIRI tends to generally underestimate regional-scale FRP, primarily due to the non-detection of the lowest FRP fire pixels, many of which MODIS can detect. However, the degree of underestimation is relatively small as described by the slope of the linear best fit to the data.







Figure 4. Example of the active fire pixel detections contained within the four SEVIRI-derived active fire detection products studied herein (LSA SAF FRP-PIXEL product; Wooster et al., 2015, WF-ABBA; Prins et al., 1998, Fire Detection and Monitoring – FDeM; Amraoui et al., 2010, and FIR Active Fire Monitoring; Joro et al., 2008). The images are produced from a single SEVIRI time slot (13:15 UTC on 21 August 2014) and show the active fire detections made in **(a)** FRP-PIXEL (1249 active fire pixel detections), **(b)** WFABBA (filtered version; 686 detections made), **(c)** FDeM (346 detections) and **(d)** FIR (312 detections). The underlying greyscale image is the SEVIRI brightness temperature difference image (3.9–10.8 µm channels) from the same imaging slot. Water bodies and clouds have been masked out (black). The region shown is that over Angola in the southern African LSA SAF geographic region (Fig. 1). It is clear than whilst all the products tend to detect a reasonable number of fires that are comprised on multiple SEVIRI active fire pixels, it is the FRP-PIXEL and WF-ABBA products that detect more of the single pixel fires, with the FRP-PIXEL product dominating in this regard.







Figure 5. Diurnal cycle of active fire detections made by the four SEVIRI active fire products discussed herein over the LSA SAF southern African geographic region (Fig. 1) on a single day 30 August 2014. The products are the LSA SAF FRP-PIXEL product (Wooster et al., 2015), Wildfire-ABBA (WFABBA; Prins et al., 1998), Fire Detection and Monitoring (FDeM; Amraoui et al., 2010) and Active Fire Monitoring (FIR; Joro et al., 2008). All confirmed active fire detections made in each product are included here for completeness, and results are shown in terms of the local solar time of detection. The LSA SAF FRP-PIXEL product detects a total of 89781 active fire pixels over this day, whilst WFABBA, FDeM and FIR detect 35759, 13477 and 14645 active fire pixels respectively.







Figure 6. Graphical representation of the procedure used to generate the dataset for use in evaluating the bias adjustment factors used within the FRP-GRID product. Fire pixels were subset from the MOD14 and MYD14 MODIS Active Fire products available between May 2008 and April 2009 using six 5.0° grid cells centred on the MODIS swath, as illustrated in (a). These same grid cells were then used in (b) to subset fire pixels from the SEVIRI full Earth disk images acquired at times coincident with the MODIS overpass, as well as from the three previous SEVIRI imaging timeslots collected prior to the MODIS overpass.







Figure 7. Evaluation of the bias adjustment factors used in the SEVIRI FRP-GRID product. Results are based on coincident SEVIRI and MODIS observations taken between May 2008 and May 2009, collected and matched as shown in Fig. 6. The nearly 1 : 1 relationship between the predicted and measured values of MODIS FRP demonstrates the unbiased nature of the adjustment factor applied at (a) 5.0° grid cell resolution and hourly temporal resolution in the FRP-GRID product, in this case for 5.0° grid cells in southern Africa. In (b) the effect of accumulating observations over weekly intervals and over the entire southern Africa LSA SAF geographic region demonstrates that the FRP-GRID product tends to still deliver a result that underestimates the sum of FRP measured by MODIS at this broader spatiotemporal scale, owing primarily to the numerous observations in which SEVIRI failed to detect at least one active fire pixel in a 5.0° grid cell in which MODIS did successfully detect a fire. Full results of the evaluation exercise for all four geographic regions are presented in Table 3.







Figure 8. The Peloponnese wildfires as viewed by the MODIS 500 m burned area of Roy et al. (2005) collected in August and September 2007 and coloured by day of the year they were detected (DOY). The fires occurred in areas forest, shrublands and olive groves and affected 1847 km² according to these data. Also shown as a red outline are the 2007 burned area perimeters extracted from the European Forest Fire Information System (EFFIS; European Commission, 2010) that encompass 1628 km².







Figure 9. (a) Time series of atmospherically corrected SEVIRI FRP measures (MW, left axis) and equivalent fuel consumption rate (tonnes s⁻¹) for the Peloponnese wildfires, as measured between 22 and 31 August 2007 using the LSA SAF SEVIRI FRP-PIXEL product. Also shown are the atmospherically corrected MODIS FRP data collected over the same time period (red crosses). Note that for clarity of presentation the MODIS FRP measure recorded on 25 August (12:05 UTC) is not shown as this exceeds 180 GW, and SEVIRI reaches a far lower value due to strong prevalence of SEVIRI MWIR channel pixel saturation at this time. **(b)** Daily total dry matter fuel consumption estimated using the time-integrated SEVIRI FRP data. We estimate 1.74 Tg of fuel was consumed in these fires, the bulk of which was burned between 24–26 August.







Figure 10. (a) MODIS Terra *"true"* colour composite derived for 26 August (09:35 UTC) and **(b)** fire-emitted smoke aerosol optical depth at 550 nm derived using the modelling scheme detailed in Sect. 5.2 (blue scale) along with SEVIRI-derived FRP-density observations derived from the FRP-PIXEL product [Wm², top, red scale] and interpolated to the atmospheric model grid. The FRP-PIXEL observations indicate the smoke plume sources and highlight the strength of the Peloponnese fires at this time. The Peloponnese (P), Libya (L), Algeria (A) and Turkey (T) are identified. MODIS data source in **(a)**: http://rapidfire.sci.gsfc.nasa.gov.













Figure 12. Modelled smoke plume on the 26 August (09:35 UTC) calculated using (a) daily, and (b) weekly temporal resolution FRP-derived smoke source emissions as described in Sect. 5.4. The blue scale indicates variations in the modelled smoke aerosol optical depth (AOD) at 550 nm. The corresponding modelled AOD obtained using hourly FRP-derived source emissions is shown in Fig. 10b.



Discussion Paper



Figure 13. MODIS FRP from the Algerian wildfires **(a)** between the 26 August and 4 September (2007), **(b)** modelled smoke, and **(c)** modelled dust aerosol optical depth (AOD) at 550 nm on 31 August 2007 (00:00 UTC). **(d)** Time series of daily averaged MODIS total AOD observations (open black triangles), the AERONET observations of total (red circles) and fine mode AOD (orange circles), modelled total AOD (blue line), and its contributions due to smoke (purple line) and dust (green line). Data sources: MODIS (http://disc1.sci.gsfc.nasa.gov) and AERONET (http://aeronet.gsfc.nasa.gov).







Figure 14. MODIS active fire detections occurring between the 27 and 31 August (blue symbols) and 28 and 29 August (red symbols). These fires typically occur downwind of the Algerian smoke plume seen in Fig. 13, and therefore are likely to have contributed to elevated AOD values detected at the Lecce AERONET site.





Figure 15. Simulated maximum 24 h running mean smoke aerosol concentration $[\mu g m^{-3}]$ recorded at the surface between the 23 August and 3 September (2007), based on the methodology outlined in Sect. 5.6. The World Health Organisation (WHO) air quality guidelines (WHO, 2006) set a limit of 25 $\mu g m^{-3}$ for the surface concentration of fine mode particulate matter (PM_{2.5}) averaged over a 24 h period.





Discussion Paper