

# *Perspectives for European scale services on Fires*

Johannes Kaiser (NILU)

Thanks to

Mark Parrington & the BBURNED community

Contact

[jkai@nilu.no](mailto:jkai@nilu.no)

SEEDS Assembly, Toulouse, 5-6 Dec 2023



PROGRAMME OF  
THE EUROPEAN UNION



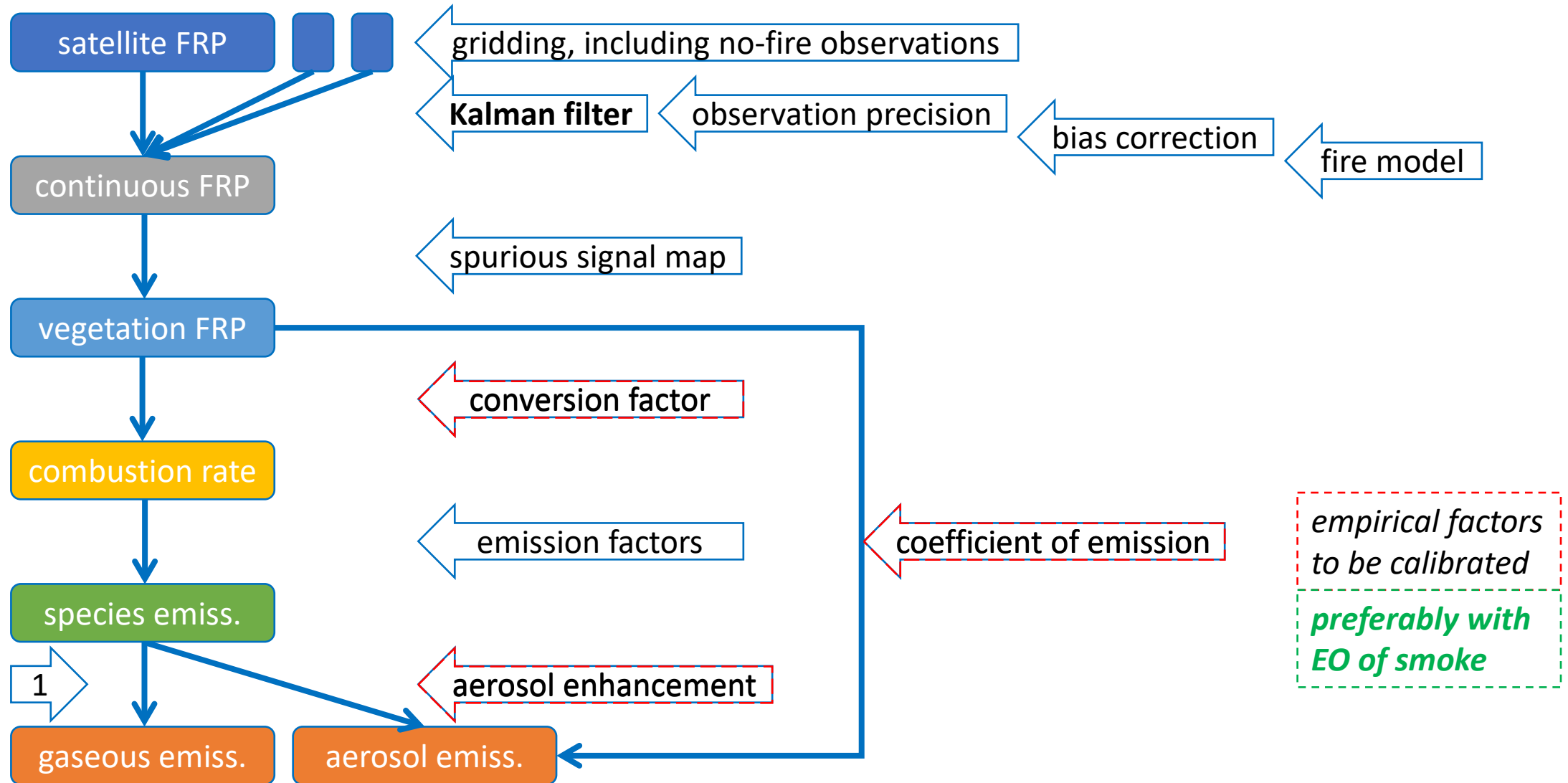
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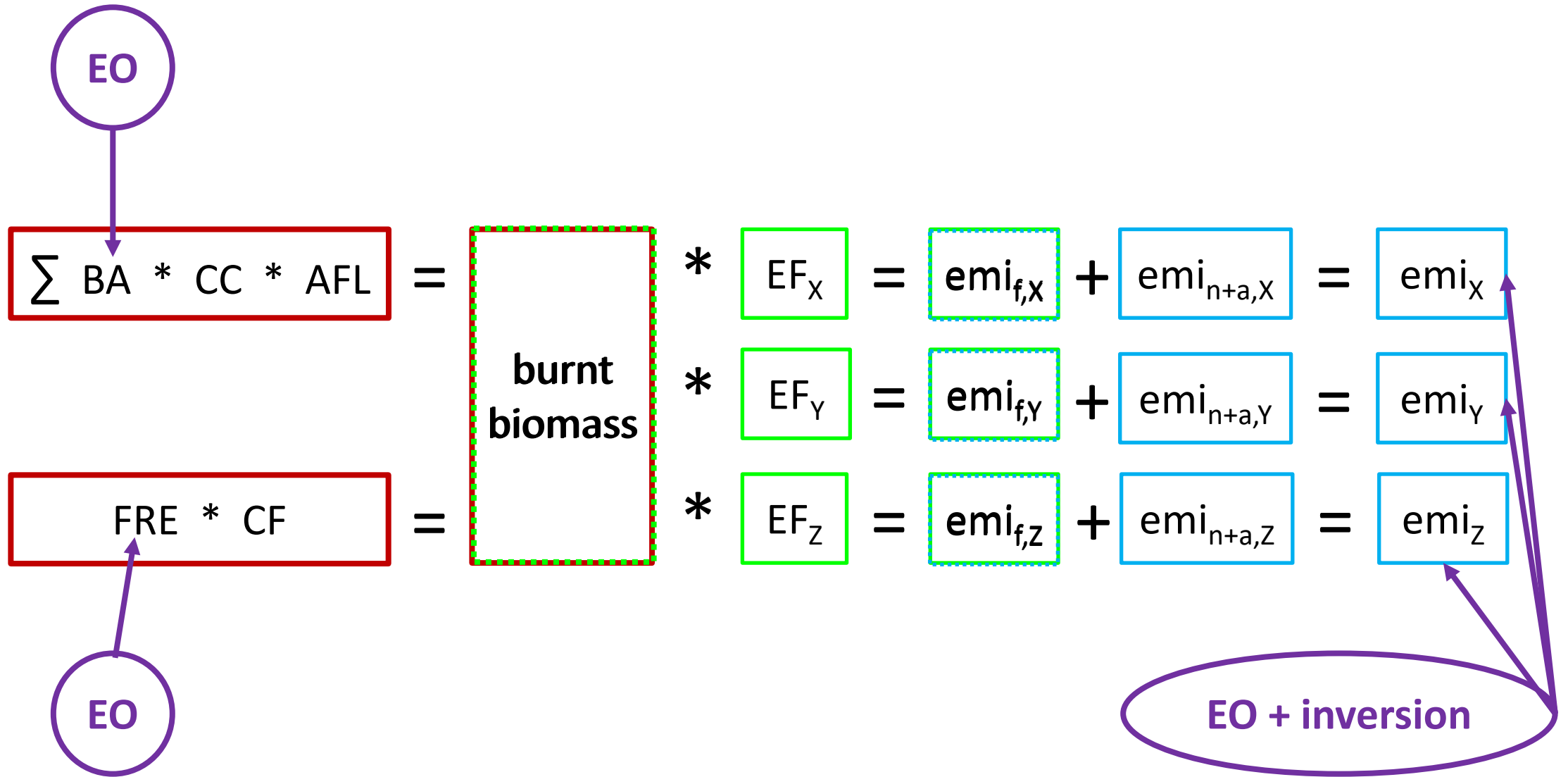
# Outline

1. Perspective for integration of top-down and bottom-up
2. Perspective for using better fire observations

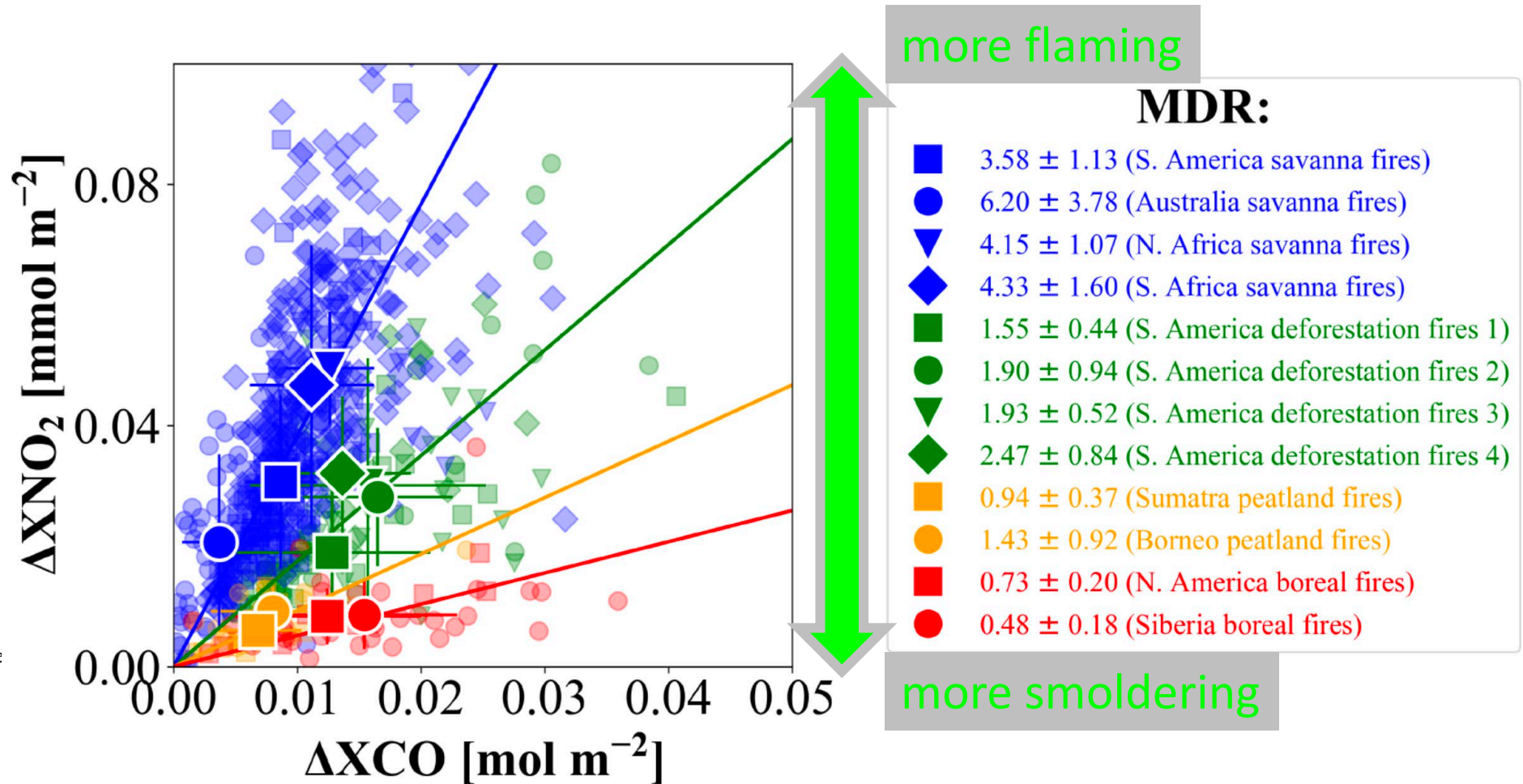
# GFAS algorithm overview



# The *pyrogenic emission network*



# NO<sub>2</sub>/CO emission ratio differs systematically.



Atmos. Chem. Phys., 21, 597–616, 2021  
<https://doi.org/10.5194/acp-21-597-2021>  
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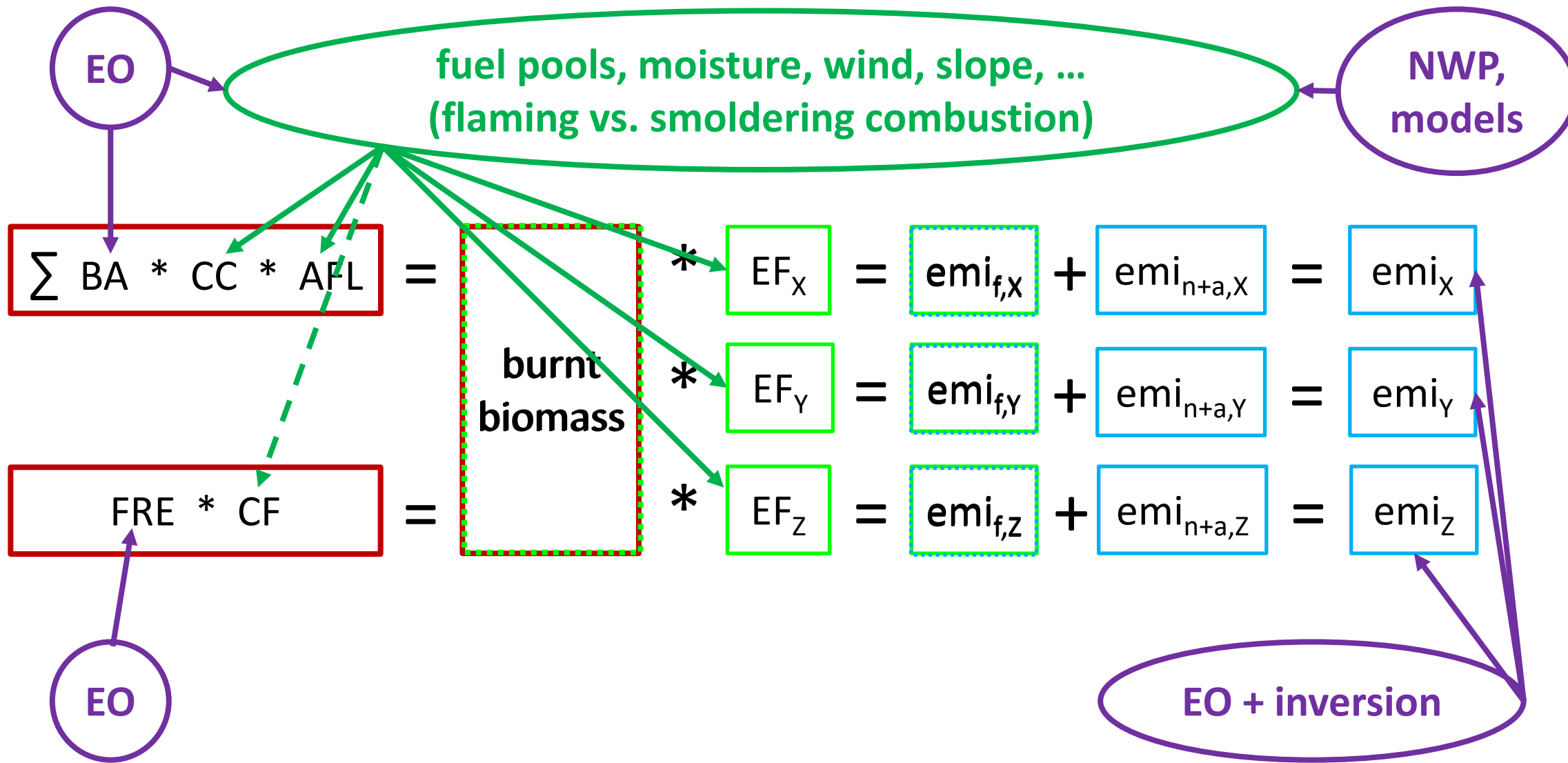


**Biomass burning combustion efficiency observed from space using measurements of CO and NO<sub>2</sub> by the TROPOspheric Monitoring Instrument (TROPOMI)**

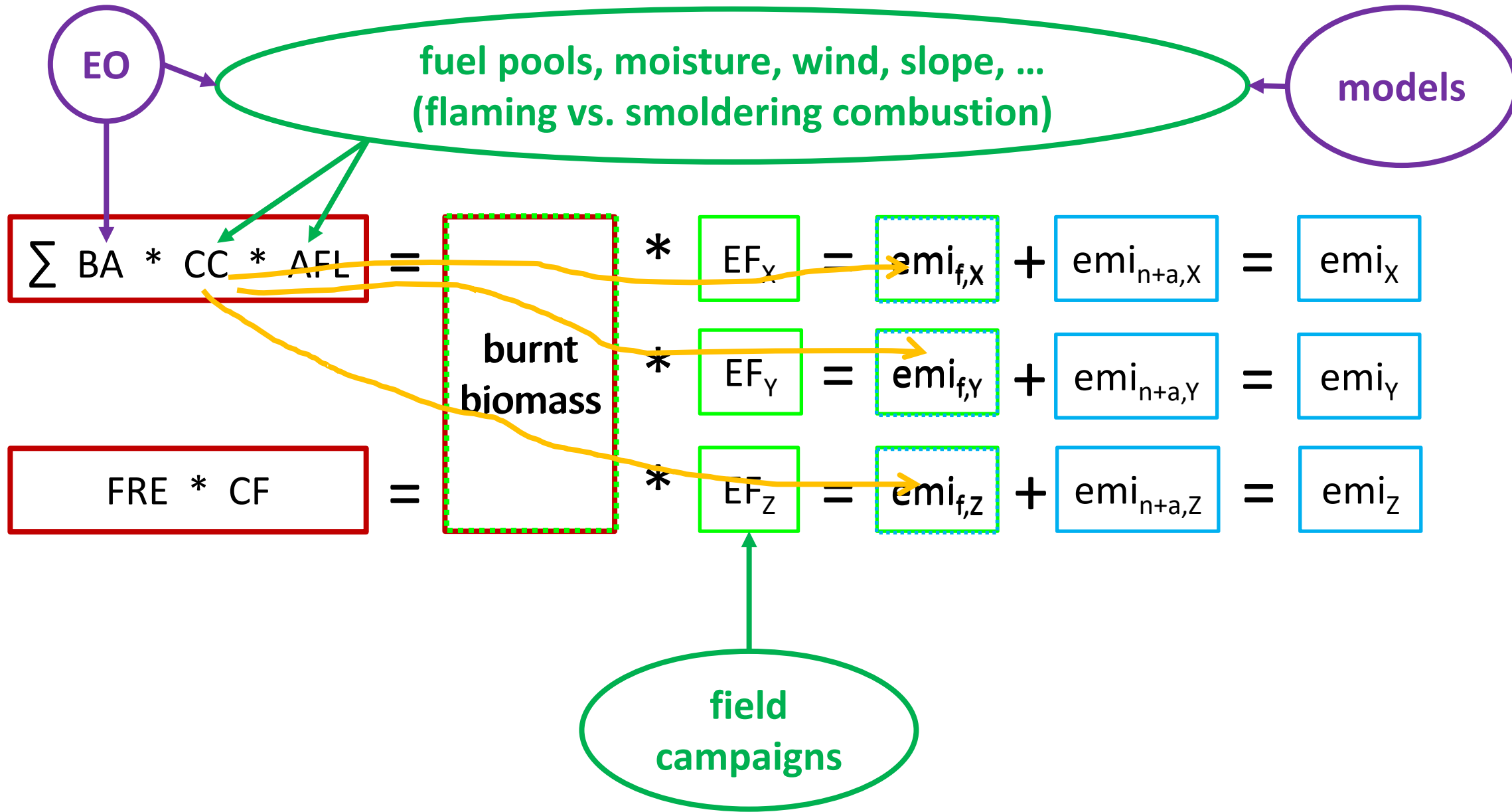
Ivar R. van der Velde<sup>1,2</sup>, Guido R. van der Werf<sup>1</sup>, Sander Houweling<sup>1,2</sup>, Henk J. Eskes<sup>3</sup>, J. Pepijn Veeffkind<sup>3,4</sup>, Tobias Borsdorff<sup>2</sup>, and Ilse Aben<sup>1,2</sup>



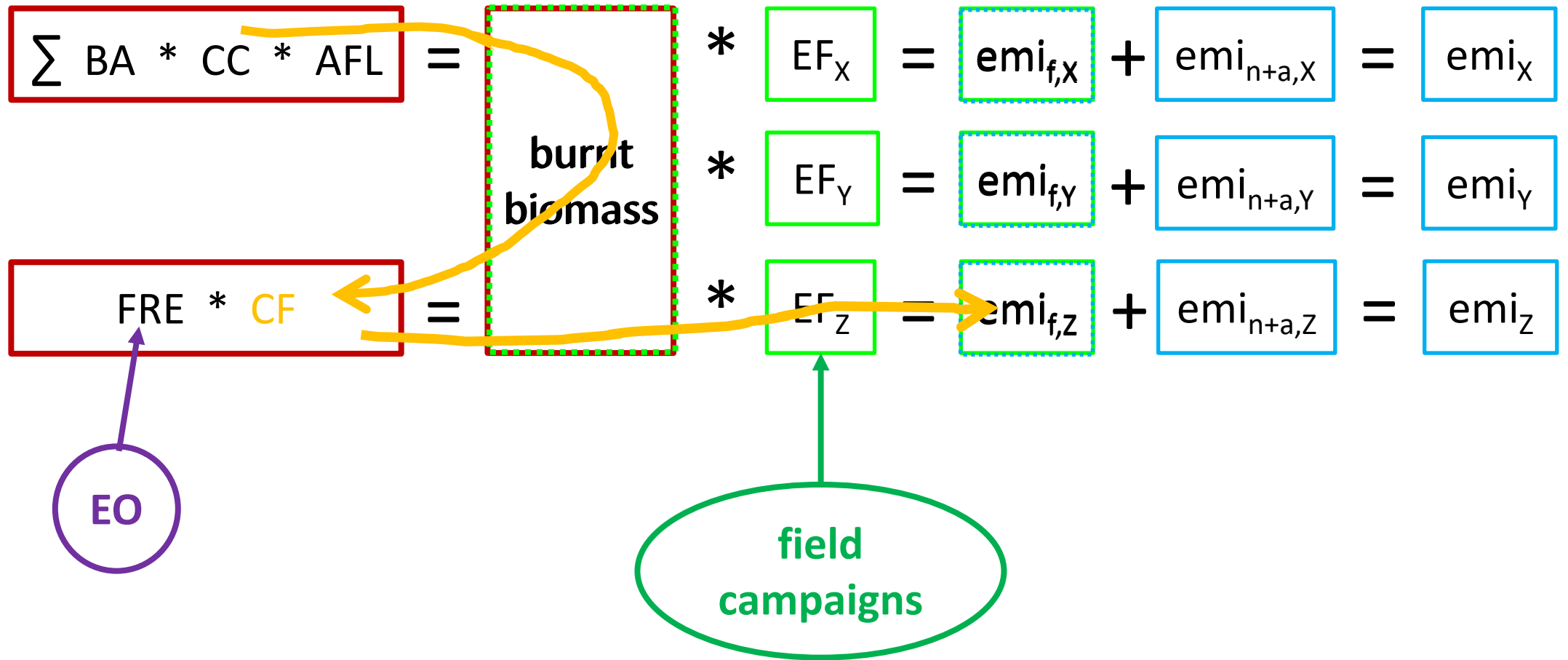
# The pyrogenic emission network



# GFED4

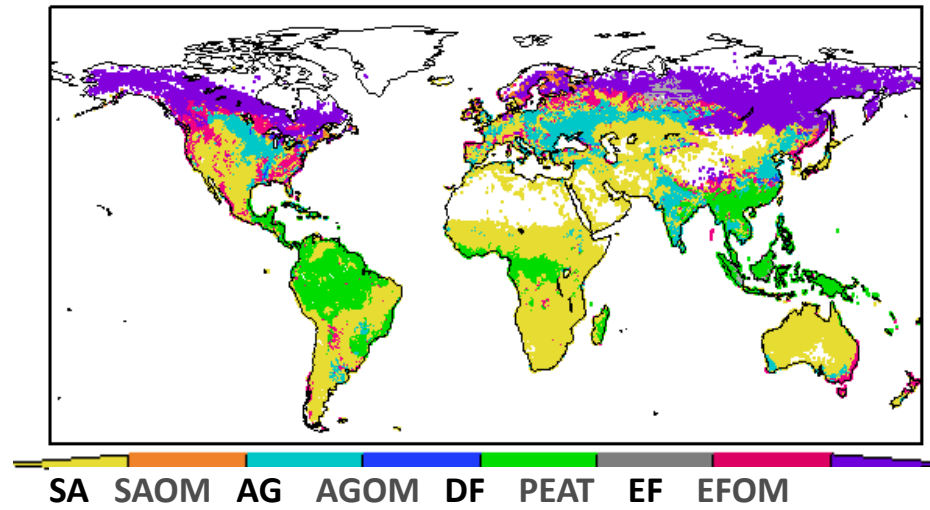
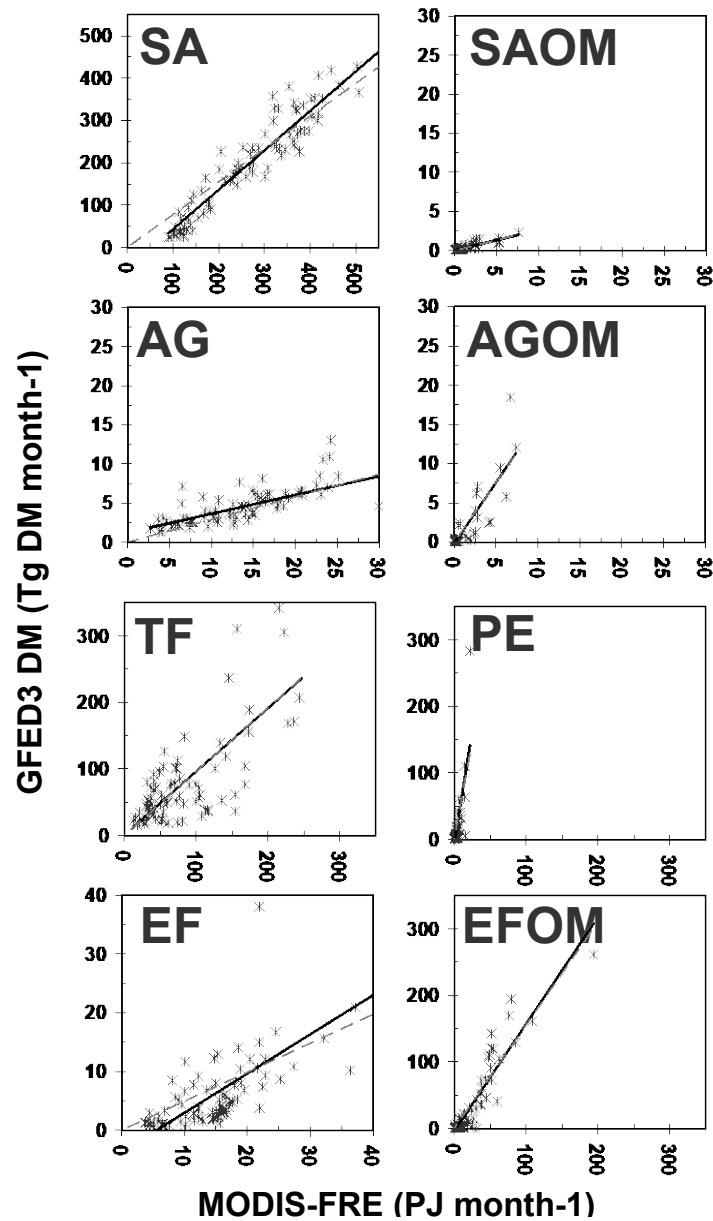


# GFAS1





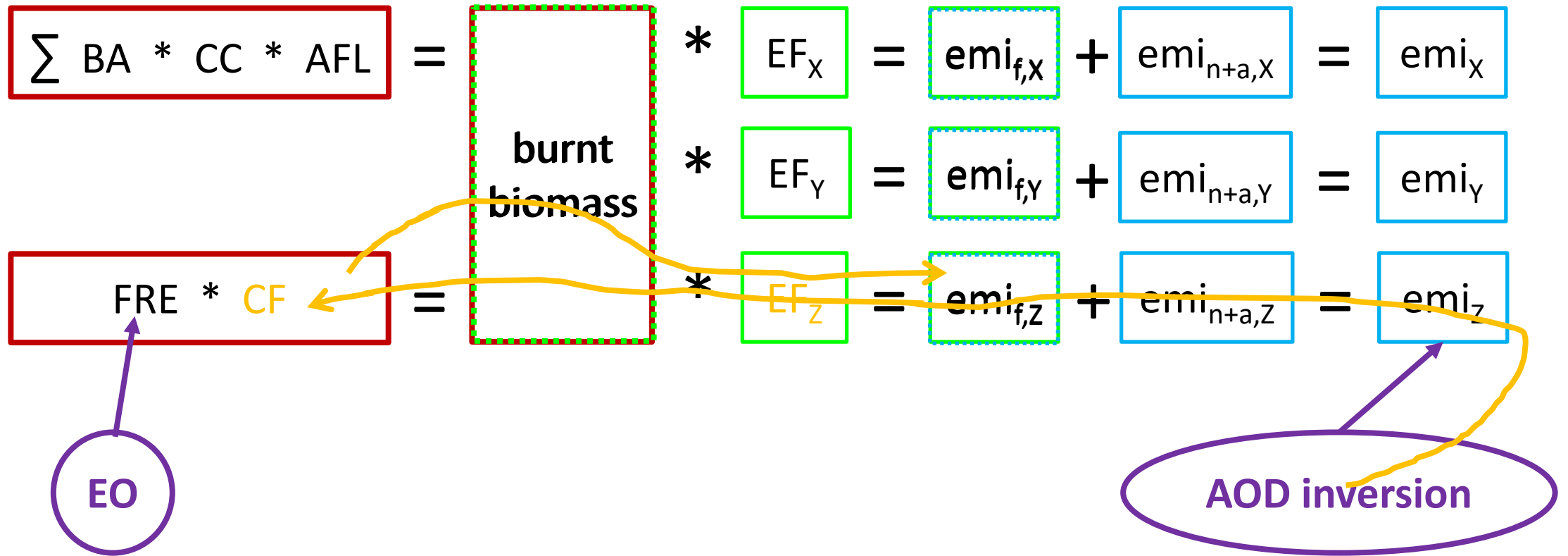
# FRP conversion factor analysis against GFED3



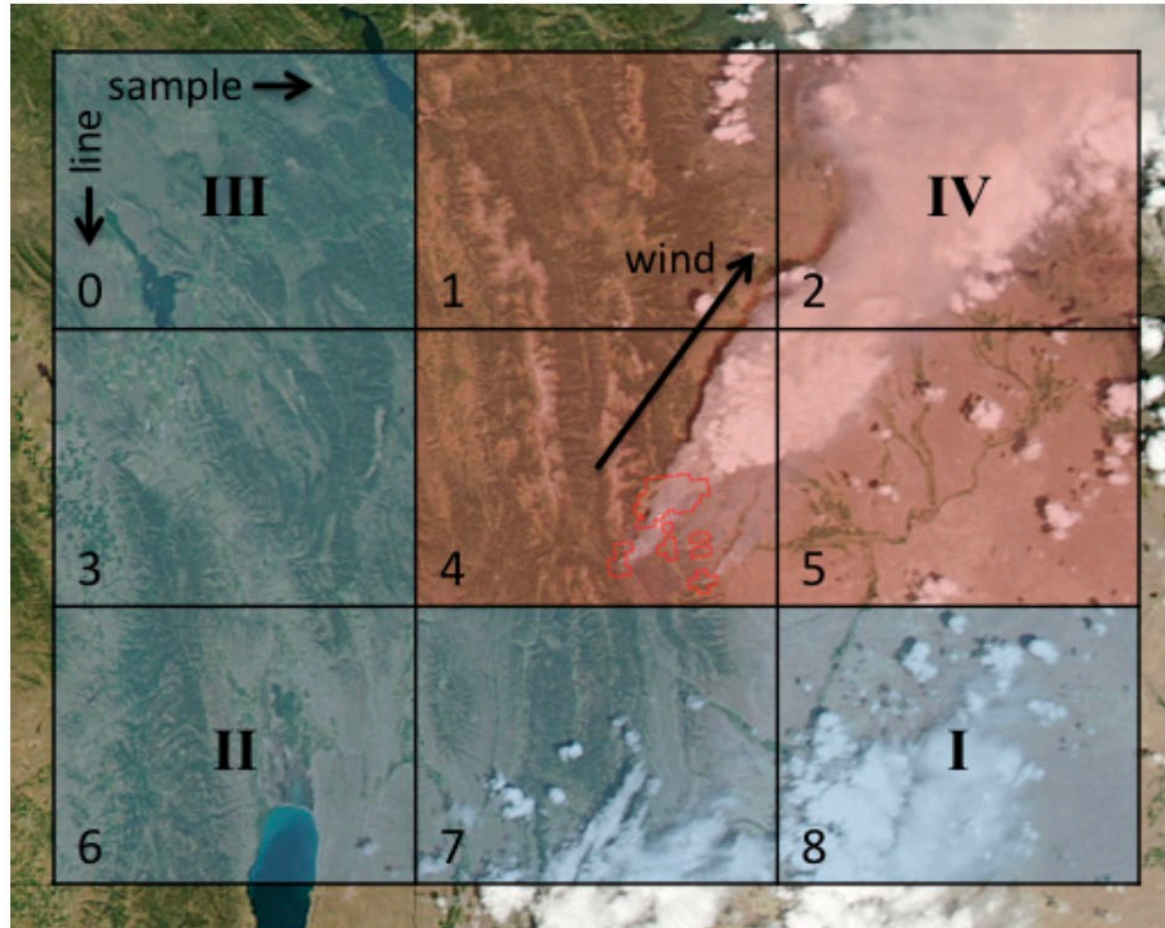
SA: savannah fires  
SAOM: SA with potential OM burning  
AG: agricultural fires  
AGOM: AG with potential OM burning  
DF: tropical fires  
PEAT: peat burning  
EF: extra-tropical fires  
EFOM: EF with potential OM burning

[Heil et al., ECMWF TM628, 2010; Kaiser et al. BG 2012]

# FEER / QFED constrained by plume analyses



# Observe FRP and AOD in individual plumes (FEER)



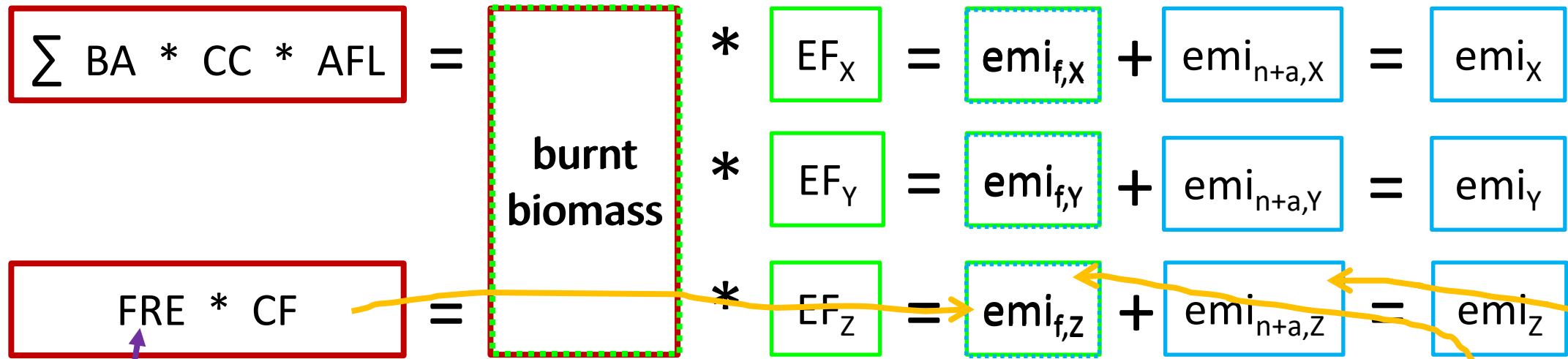
Atmos. Chem. Phys., 14, 6643–6667, 2014  
www.atmos-chem-phys.net/14/6643/2014/  
doi:10.5194/acp-14-6643-2014  
© Author(s) 2014. CC Attribution 3.0 License.



**Global top-down smoke-aerosol emissions estimation using satellite fire radiative power measurements**

C. Ichoku<sup>1</sup> and L. Ellison<sup>1,2</sup>

# GHG inversions



$FRE * CF =$

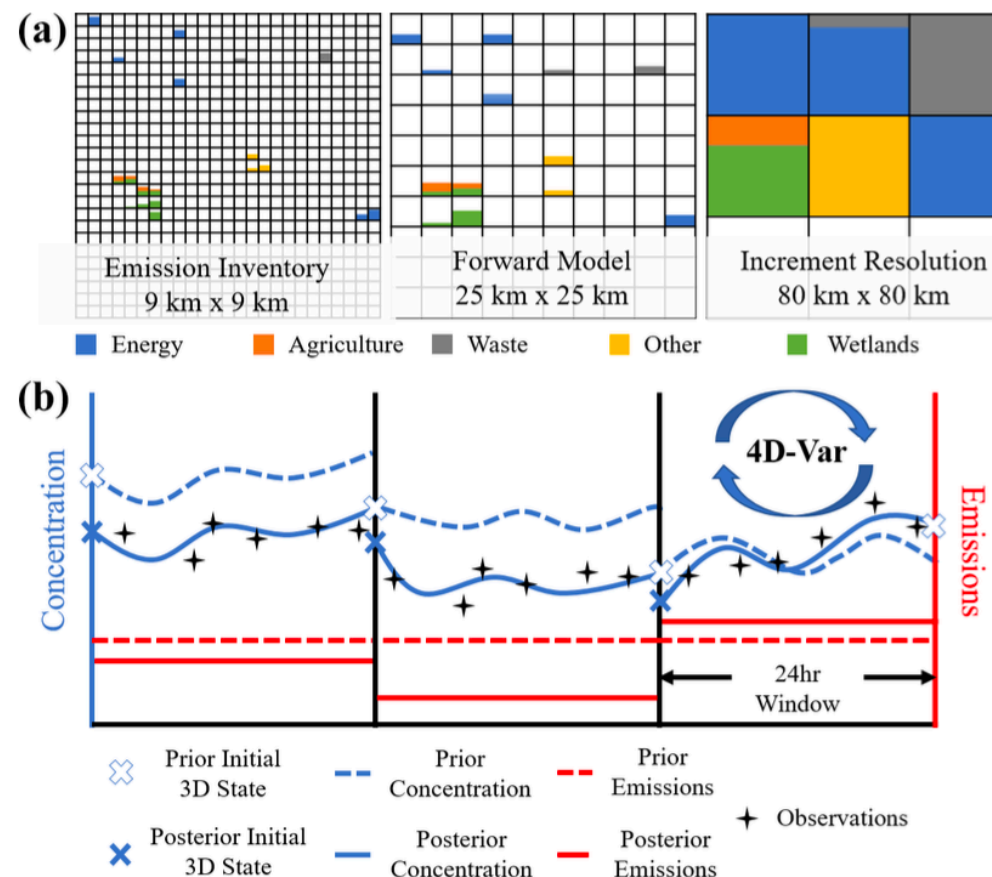
EO

CH4 inversion

# Global 4D-Var CH<sub>4</sub> inversion in GCM as “boundary condition” for other emissions

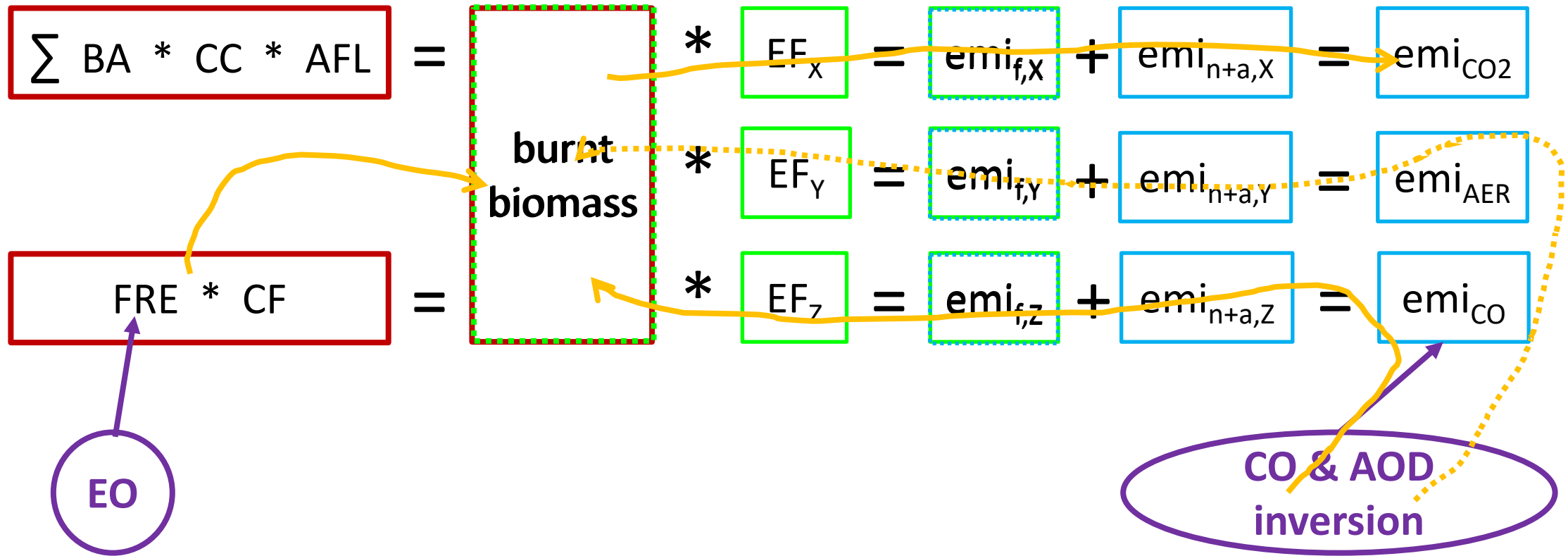
5964

J. McNorton et al.: Quantification of methane emissions from hotspots and during COVID-19



**Figure 1.** (a) Schematic of different resolutions used in the inversion shown by pseudo-data for five sectors. The magnitude of prior emissions at  $\sim 9$  km (left panel) and those same emissions used as input to the forward model at  $\sim 25$  km (middle panel). The inversion increment at  $\sim 80$  km, resulting scaling factors are applied to all sectors within the grid cell, the boxes indicate relative contribution per sector (right panel). (b) Schematic of inversion setup using the 24-h window, correcting for the initial 3D state, emissions, and initial conditions in the prior of the subsequent window.

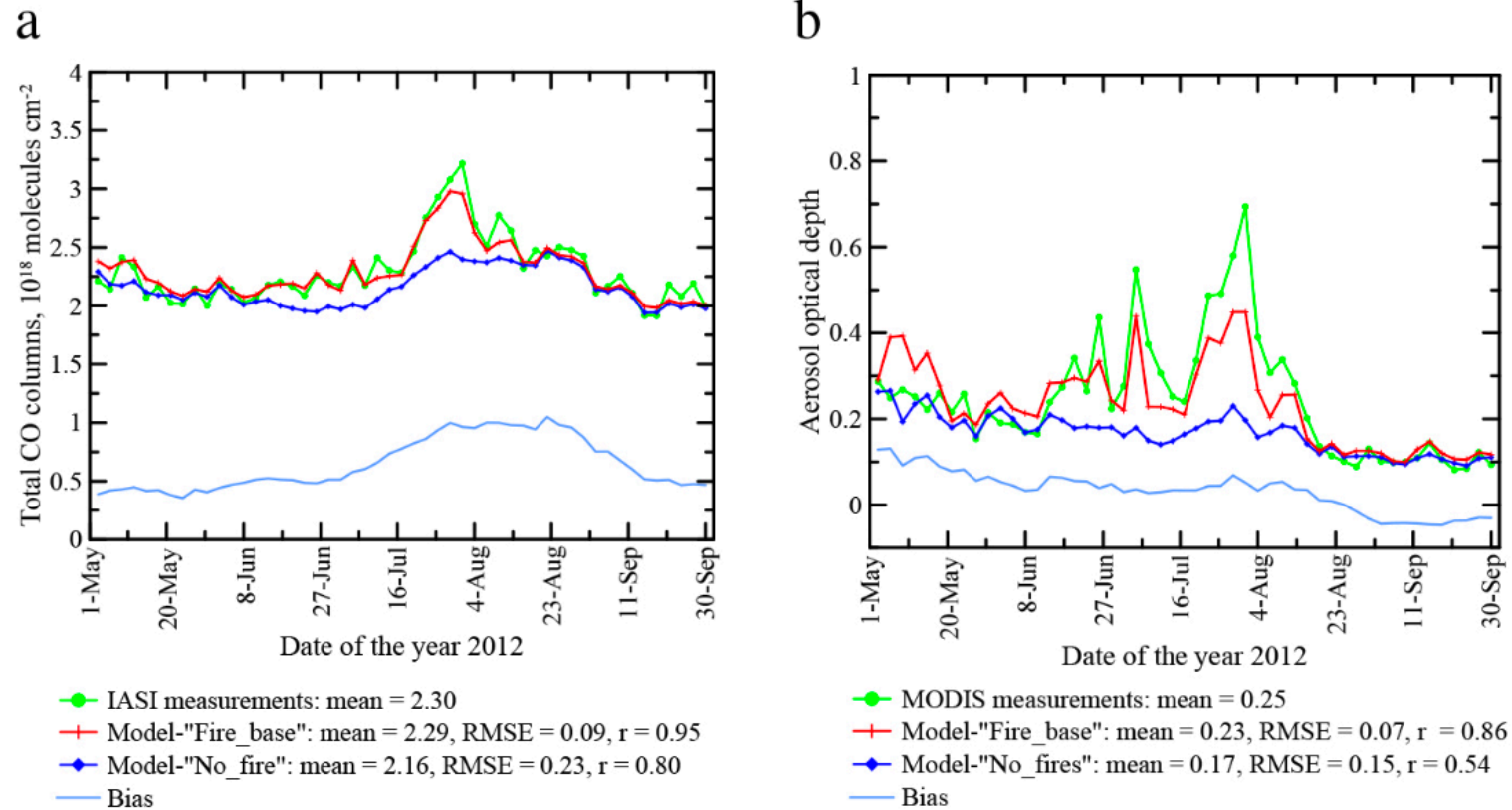
# Probabilistic CO and AOD inversion



# Regional inversion of CO and AOD with CTM

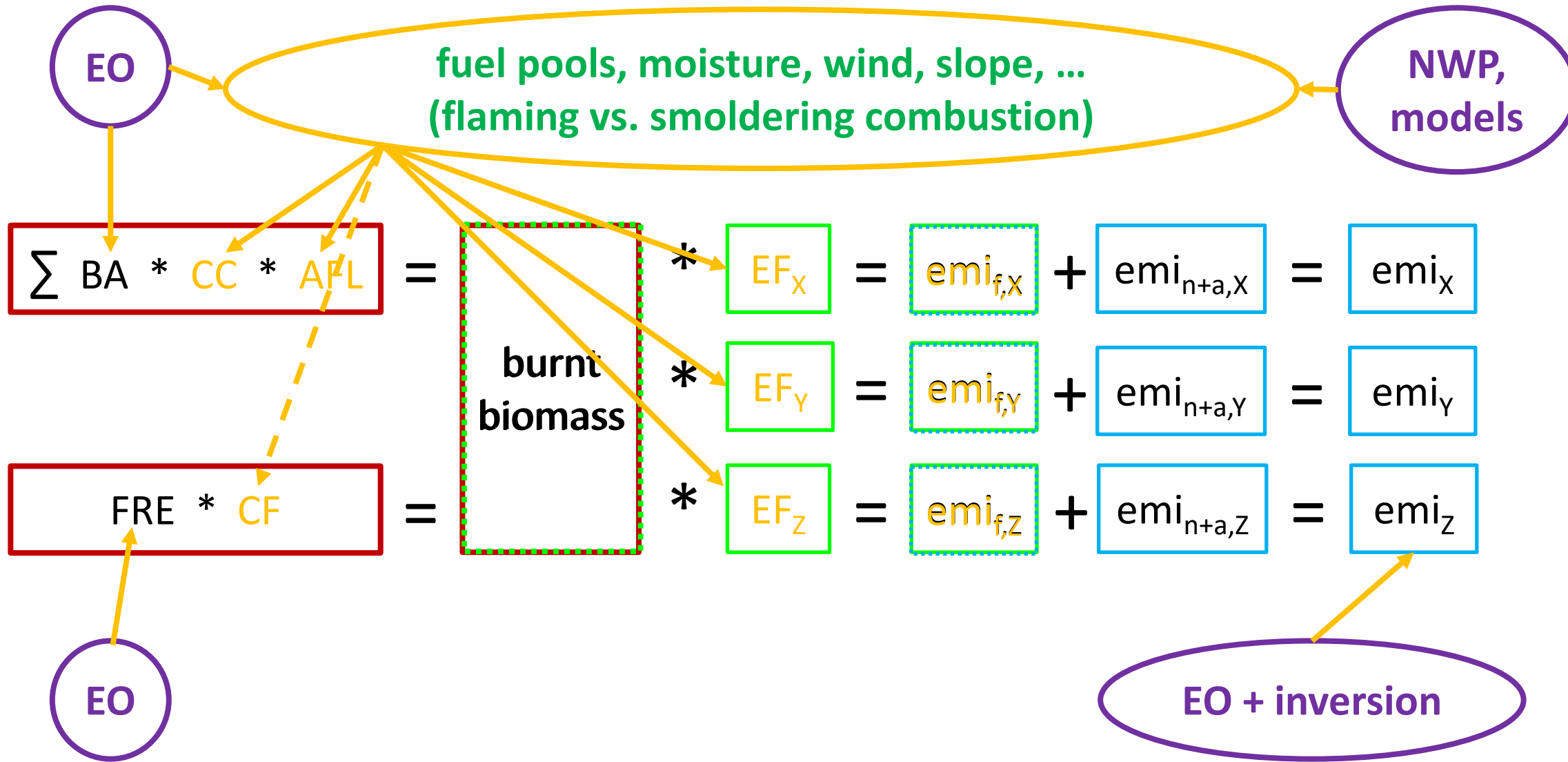
10400

I. B. Konovalov et al.: Constraining CO<sub>2</sub> emissions from biomass burning



**Figure 7.** Time series of (a) daily total CO columns and (b) AOD simulated by CHIMERE with (“Fires\_base”) and without (“No\_fires”) fire emissions in comparison to the data from the corresponding IASI and MODIS measurements. The measurements and simulations for the days shown were withheld from the emission estimation procedure. The simulations are presented after debiasing. Note that the indicated bias represents the values of  $\Delta$  (see Sect. 2.3) taken with the opposite sign. All values are the averages over the Siberian study region.

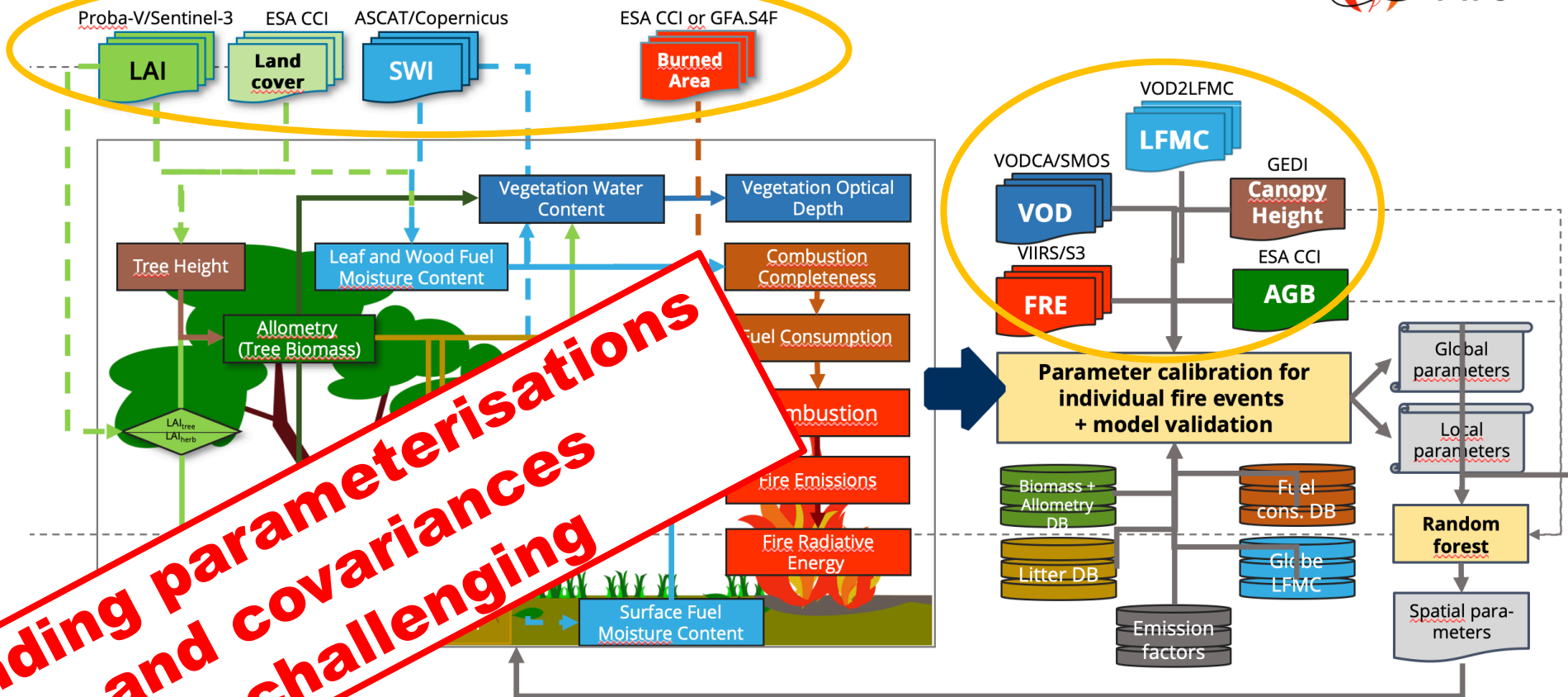
# Goal: Constrain dynamic model for CC, AFL, EF





# Example modelling of CC, AFL, CF & $EF_{x,y,z}$

## TUD S4F Data-Model Fusion Approach



**finding parameterisations and covariances is challenging**



# Possible starting point

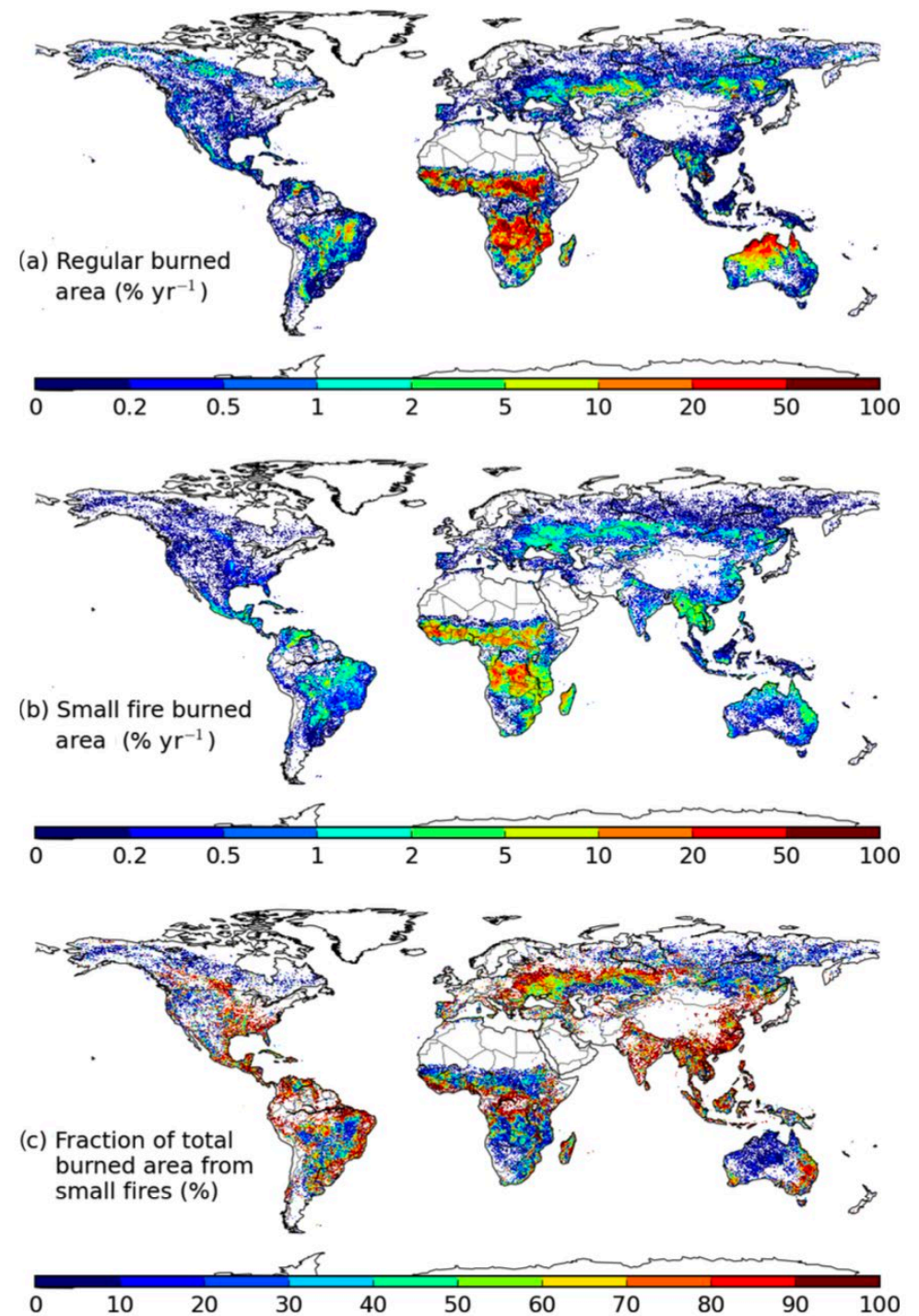
1. invert species with best observational constraint and knowledge on *emission factor (EF)* → carbon monoxide
  - CO emission flux inversion from S5P-TROPOMI, MetOp-IASI (SEEDS!)
  - $EF_{CO}$  dependent on vegetation and fuel/soil moisture, possibly online
2. calculate *conversion factor (CF)*
  - dependent on vegetation and fuel/soil moisture
3. use *EF* for other species from literature
4. adjust *EF* well-observed species with dedicated regional inversions
  - S5P-TROPOMI: HCHO, NO<sub>2</sub>, CH<sub>4</sub> (SEEDS!)
  - Metop, MODIS, VIIRS: aerosols
  - including dependence on vegetation and fuel/soil moisture

# Outline

1. Perspective for integration of top-down and bottom-up
2. **Perspective for using better fire observations**

# Some sources of error

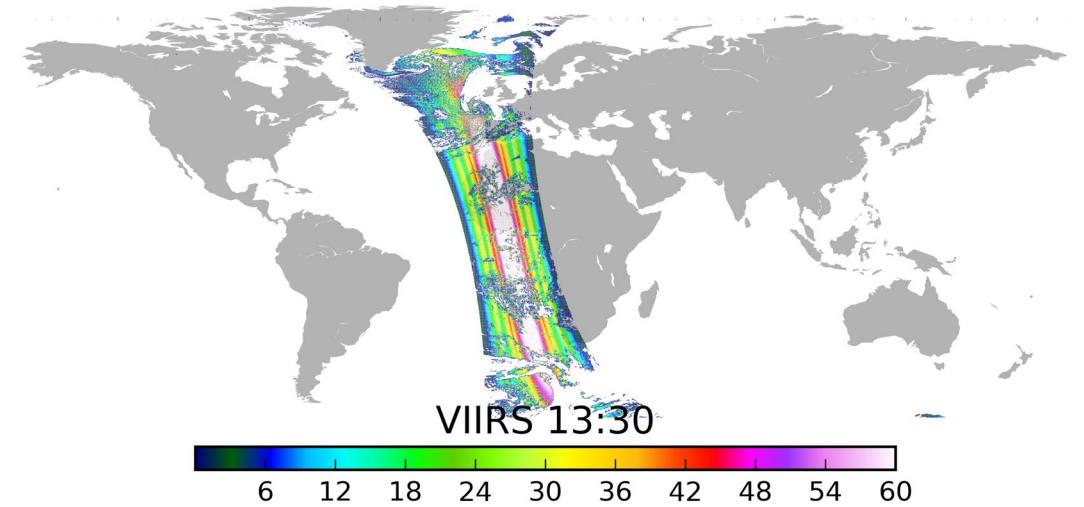
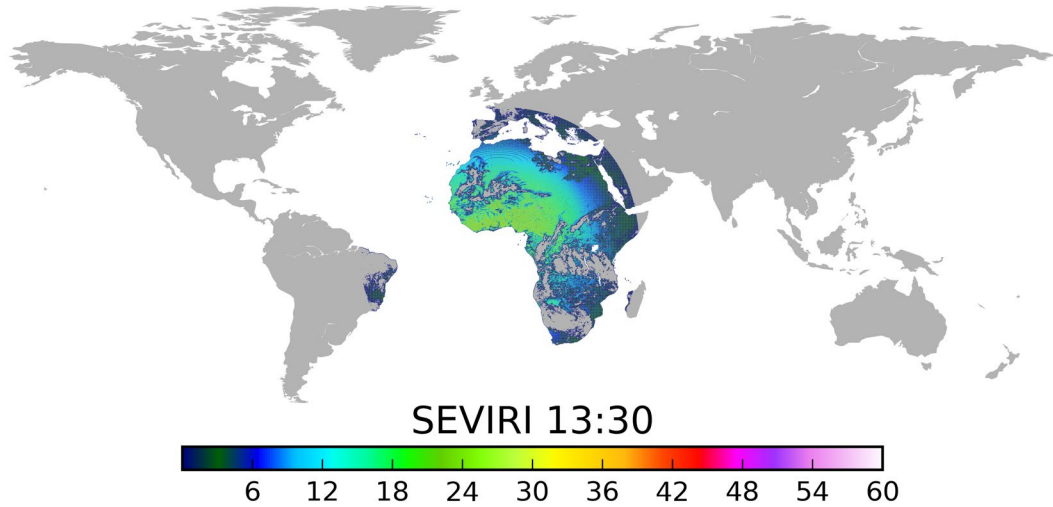
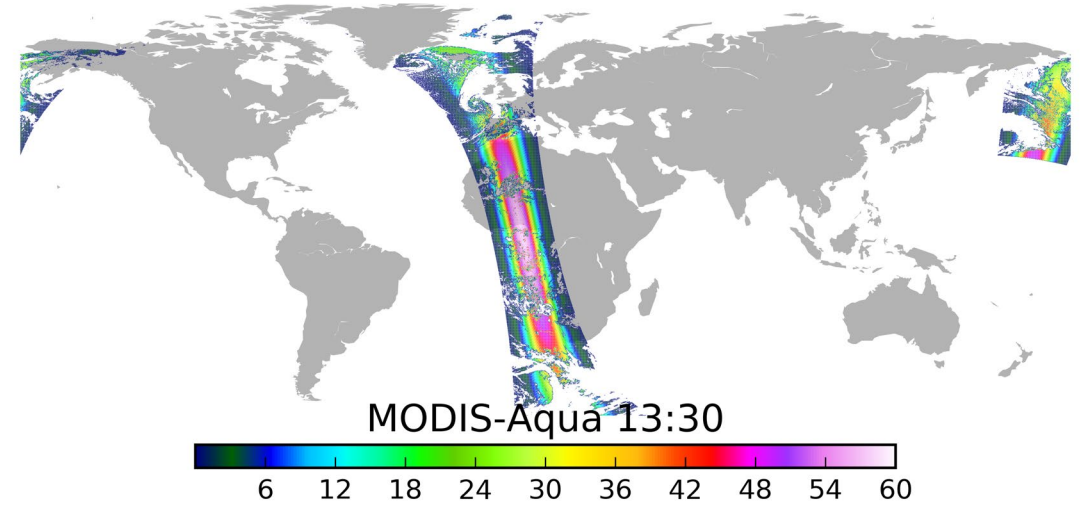
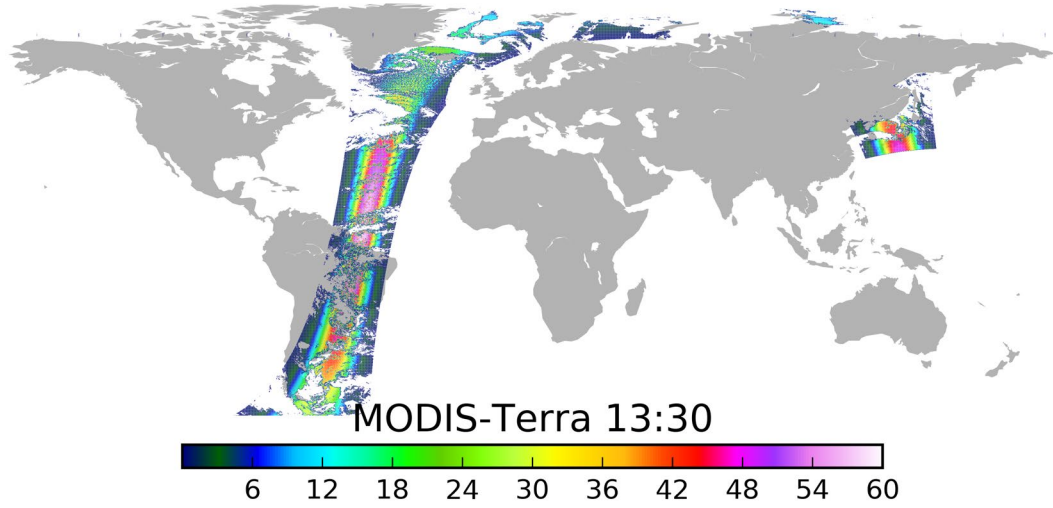
- Burnt Area: Small fires are often below detection threshold.
- Fire Radiative Power: Sampling of transient & stochastic phenomenon is incomplete due to orbits and clouds.
- Emissions: Fuel and fire modelling or empirical parameterisation is required.
  - But every fire is different, depending of fuel type, fuel condition, meteorology humans response etc.
- Little ground truth available.



[van der Werf et al. 2017]

1-hour merged inverse variance for FRP observations in  $m^4W^{-2}$

2016-01-01

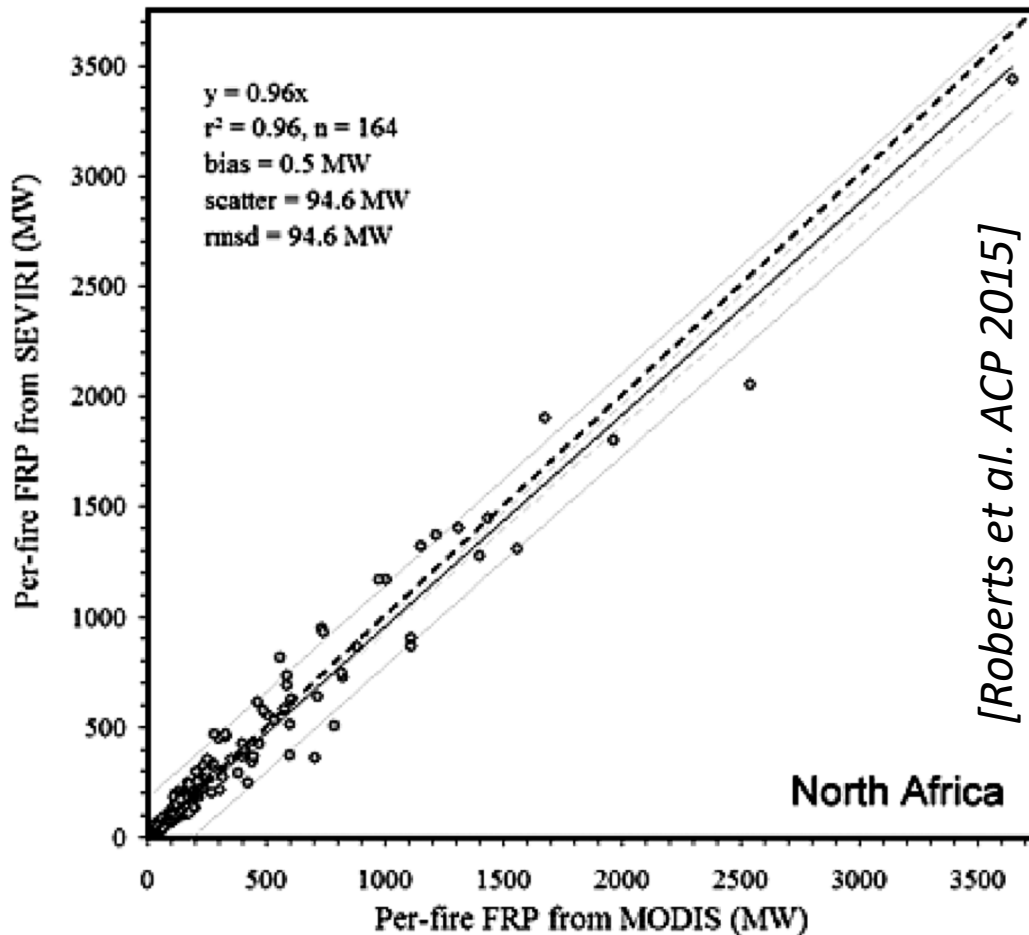


[Hüser et al. CAMS 2018]

# FRP observation bias: SEVIRI w.r.t. MODIS

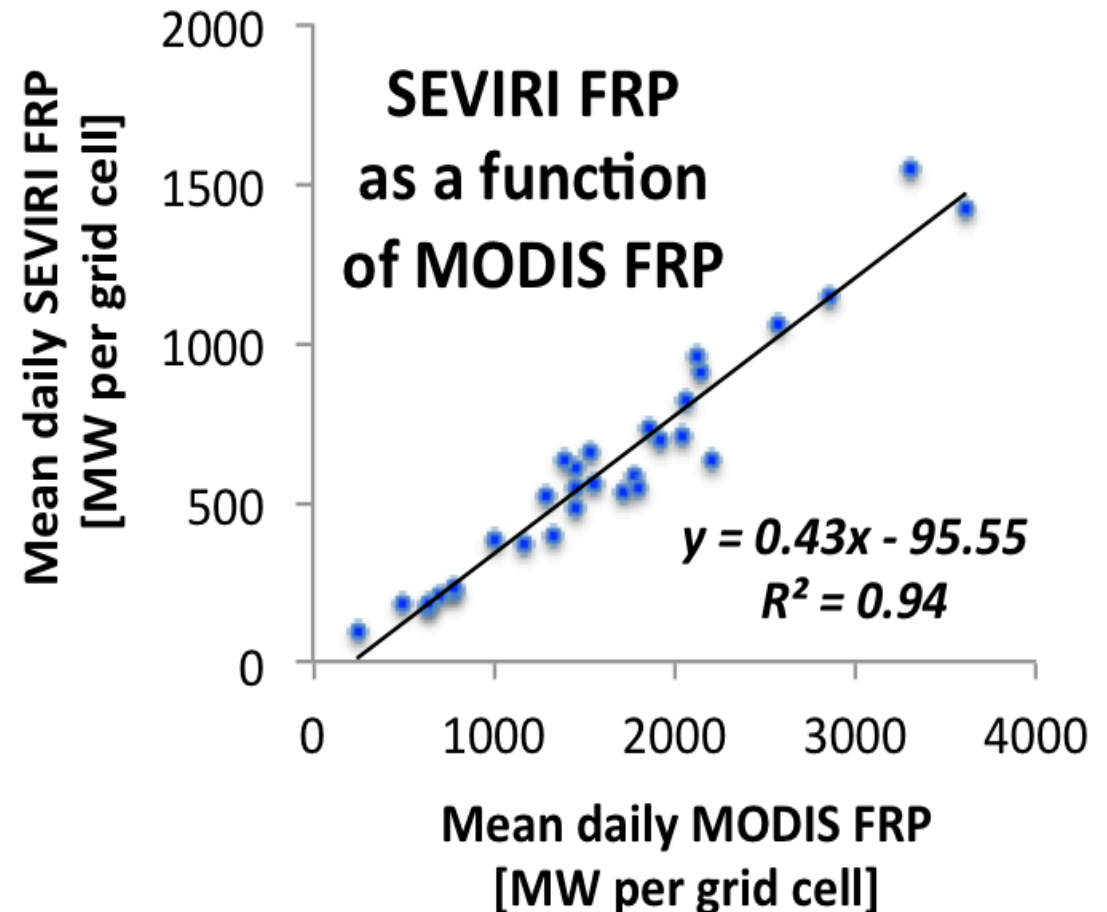
## instantaneous fire clusters:

- **4% underestimation**

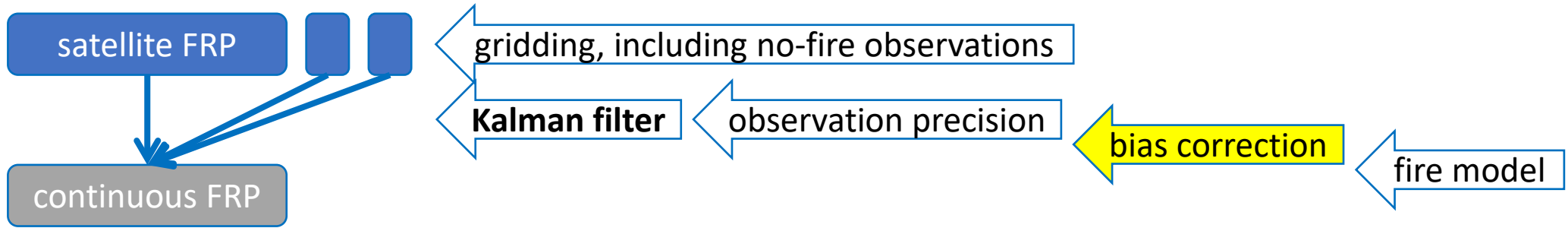


## monthly 2°x2° grid cells:

- **57% underestimation**



# GFAS algorithm overview

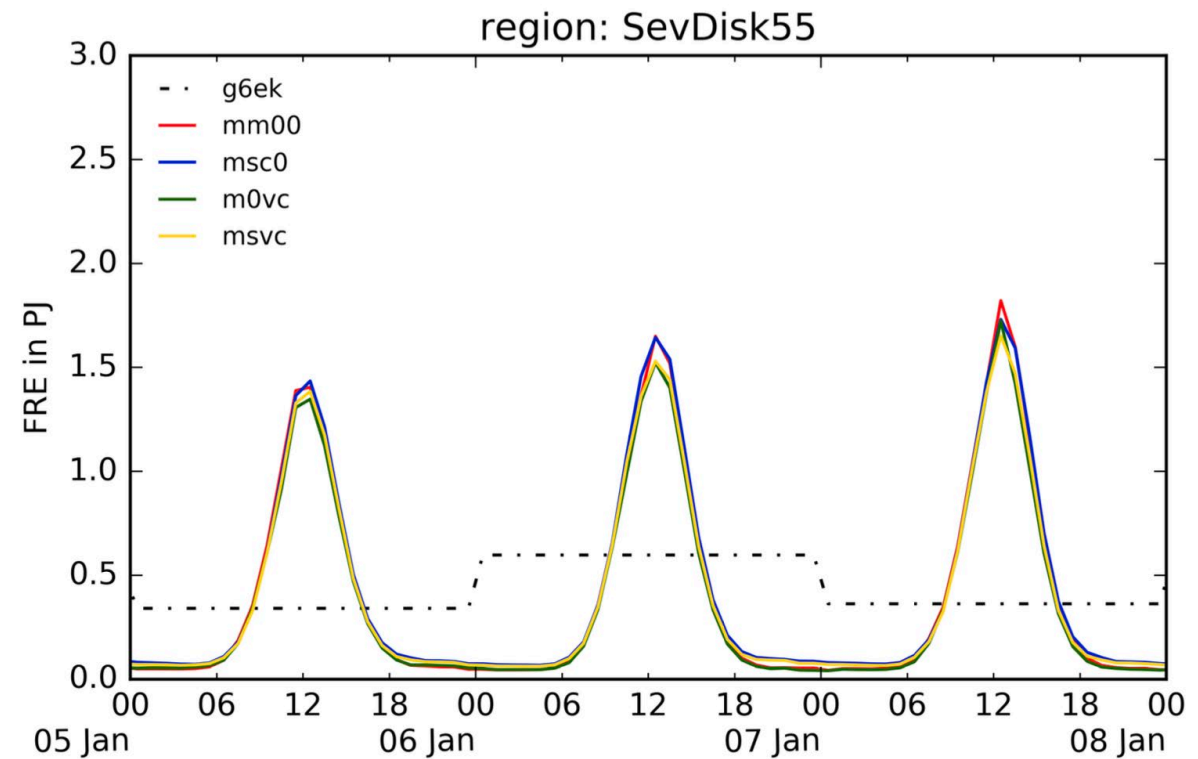


# Basic bias correction works on continental scale.

Bias correction factors calculated to keep the global annual assimilated FRP budgets from different instruments un-biased:

Instrument	Bias correction factors	
	Daytime	Night-time
MODIS-Terra	1.87	1.20
MODIS-Aqua	0.73	1.67
VIIRS-NPP	0.79	6.27
SEVIRI	1.8	1.8
GOES-E	3.2	3.8
GOES-W	2.7	2.4
Himawari-8	3.1	4.1
SLSTR	TBD	TBD

Hourly GFAS FRP over SEVIRI disc using different combinations of bias-corrected **MODIS-, VIIRS- and SEVIRI-FRP**:



[Hüser et al. CAMS 2018, Zhang et al. CAMS 2021, Kaiser et al. 2023]

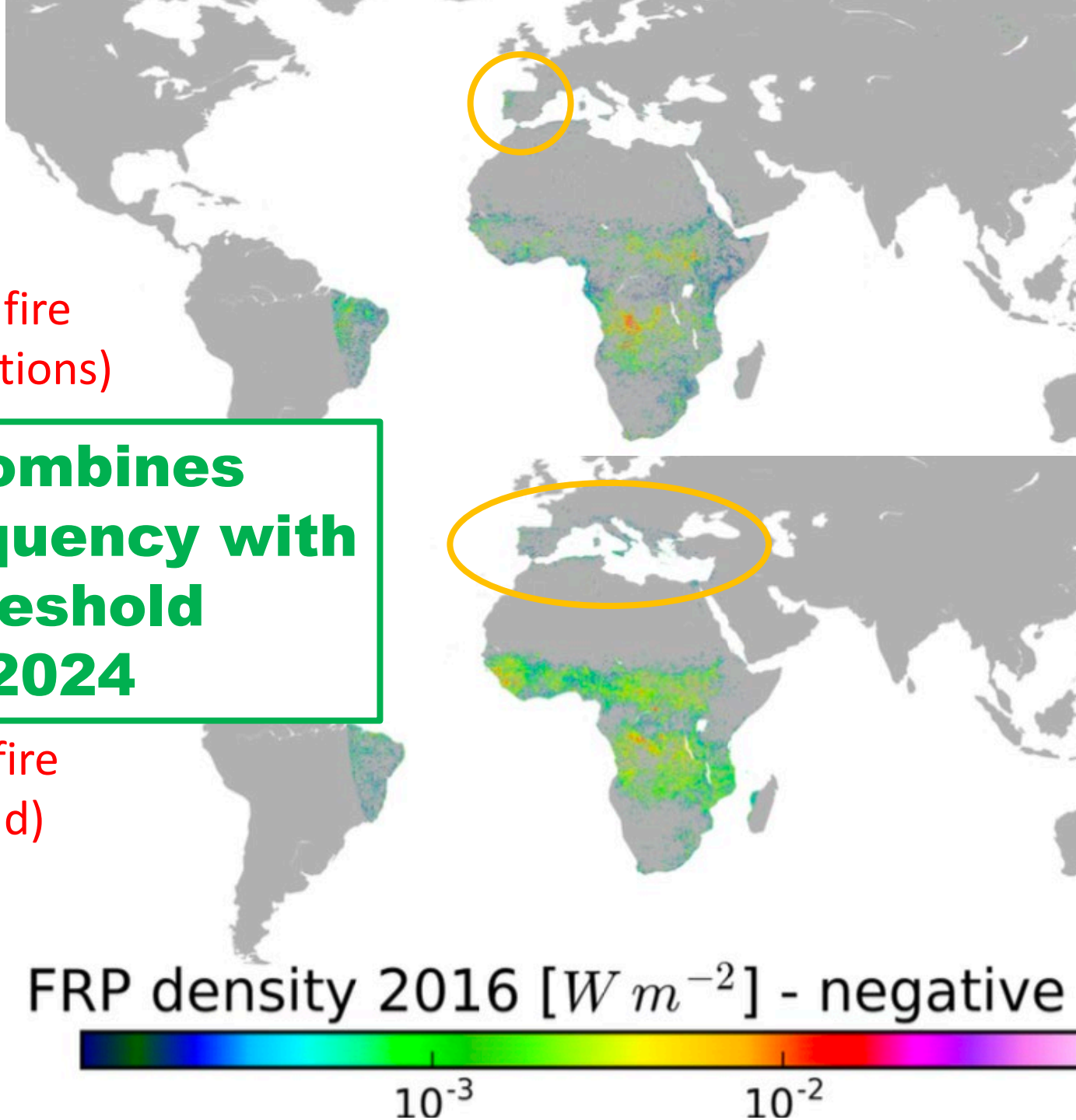


# SEVIRI w.r.t. MODIS on finer scale

where SEVIRI saw more fire  
(more frequent observations)

**FCI aboard MTG combines  
high observations frequency with  
low detection threshold  
-> available in 2024**

where MODIS saw more fire  
(lower detection threshold)



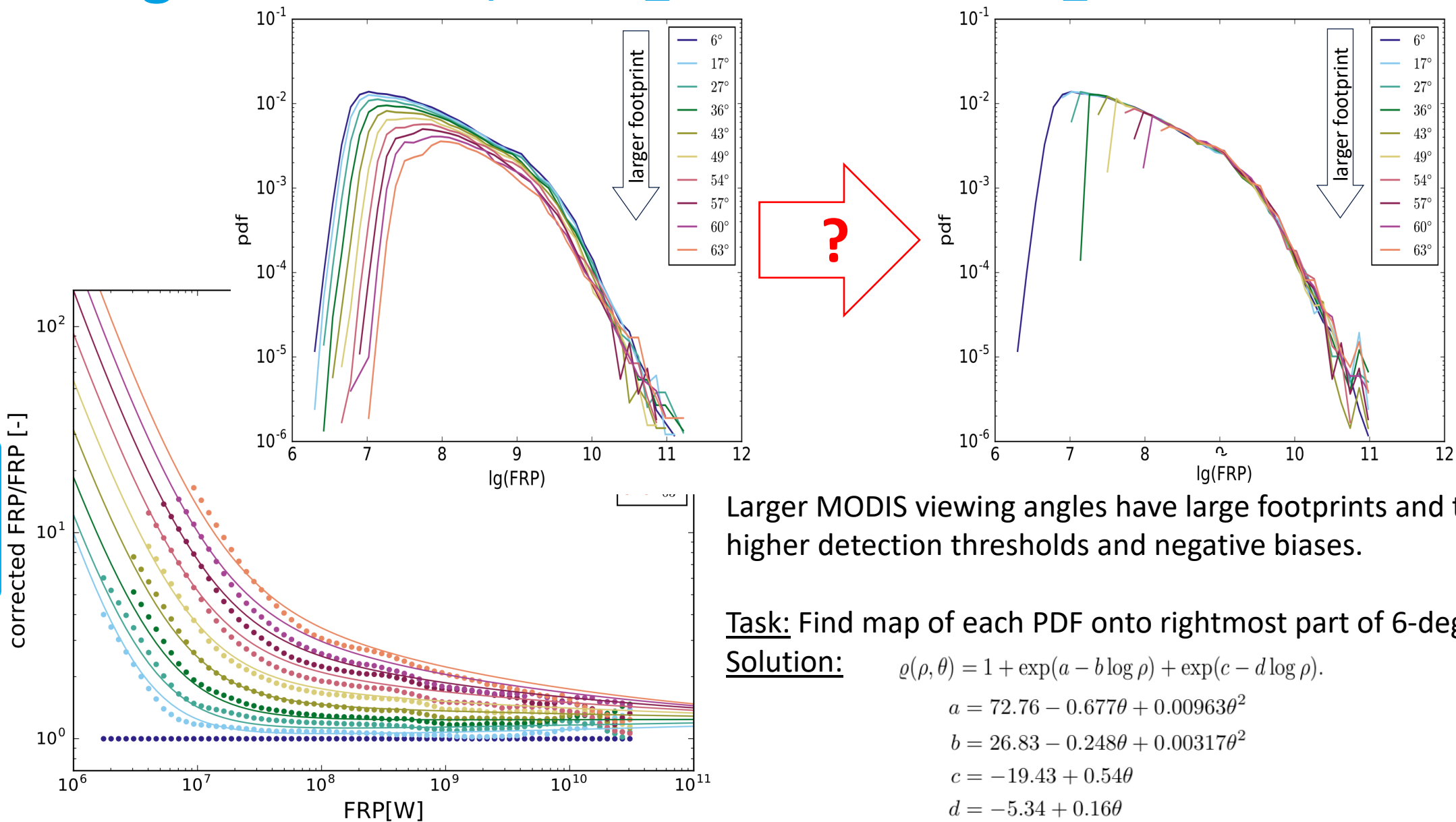
# Summary

1. Fire Radiative Power observations from **Meteosat Third Generation** provide a unique opportunity to significantly reduce the major error sources in fire observations over Europe
2. **Bottom-up and top-down** emission estimates
  - integration paths can be identified
3. key elements of initial **improved European service**:
  - **FRP** from **MTG**
  - **calibrated** with atmospheric CO observations -> S5P, S5, S4, Metop
  - HCHO, CH4, NO2, aerosols, ... optimised individually -> S5P, S5, S4, Metop
  - track flaming / smoldering
  - compatibility with CAMS-GFAS and integrated assimilation

# Outline, extended

1. Perspective for better fire observation
2. Perspectives for integration of top-down and bottom-up
3. **Other aspects**

# Bias correction for individual FRP products feasible at 1 deg resolution, using PDF matching.



Larger MODIS viewing angles have large footprints and thus higher detection thresholds and negative biases.

**Task:** Find map of each PDF onto rightmost part of 6-deg one.

**Solution:**

$$q(\rho, \theta) = 1 + \exp(a - b \log \rho) + \exp(c - d \log \rho)$$

$$a = 72.76 - 0.677\theta + 0.00963\theta^2$$

$$b = 26.83 - 0.248\theta + 0.00317\theta^2$$

$$c = -19.43 + 0.54\theta$$

$$d = -5.34 + 0.16\theta$$

[Kaur et al. RSE 2019]



# FRP modelling using NWP input

Machine learning provides better forecasting and gap filling than persistence.

## Code for Earth 2023 Fire Forecasting

Participants: Robert Maiwald, Timo Metz, Eva-Marie Metz,  
Christopher Lücken-Winkels

Mentors: Johannes Kaiser, Mark Parrington, Miha Razinger,  
Mihai Alexe, Siham El Garroussi

**CODE FOR EARTH**  
Innovation · Collaboration · Open Source Coding

Final presentation video:  
<https://codeforearth.ecmwf.int>



	Mean Average Error [W/m <sup>2</sup> ]	Root Mean Squared Error [W/m <sup>2</sup> ]	Correlation
Persistence	0.1660	0.2491	0.6374
Linear regr.	0.1939	0.2054	0.7383
Regr. Tree	0.2220	0.2356	0.6274
NN ensemble	0.0991	0.1795	0.8156



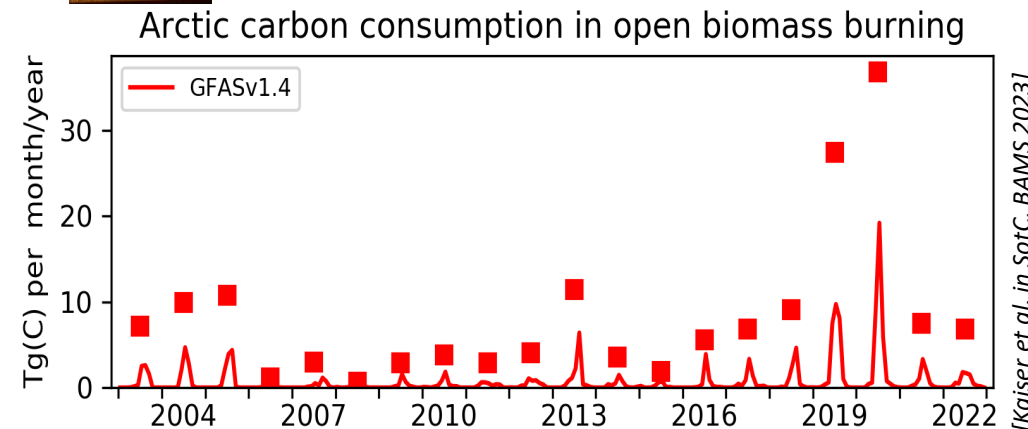
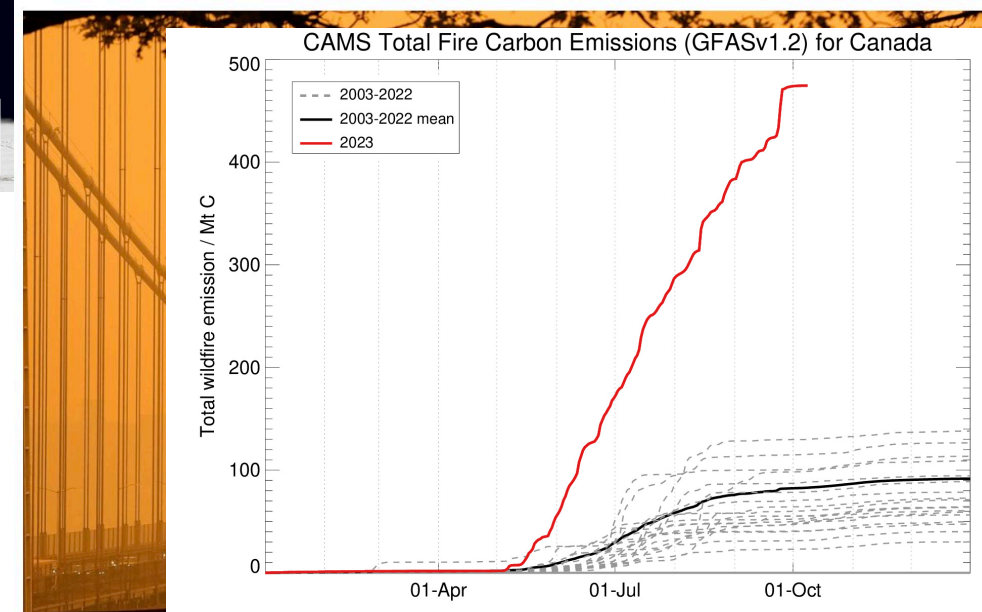
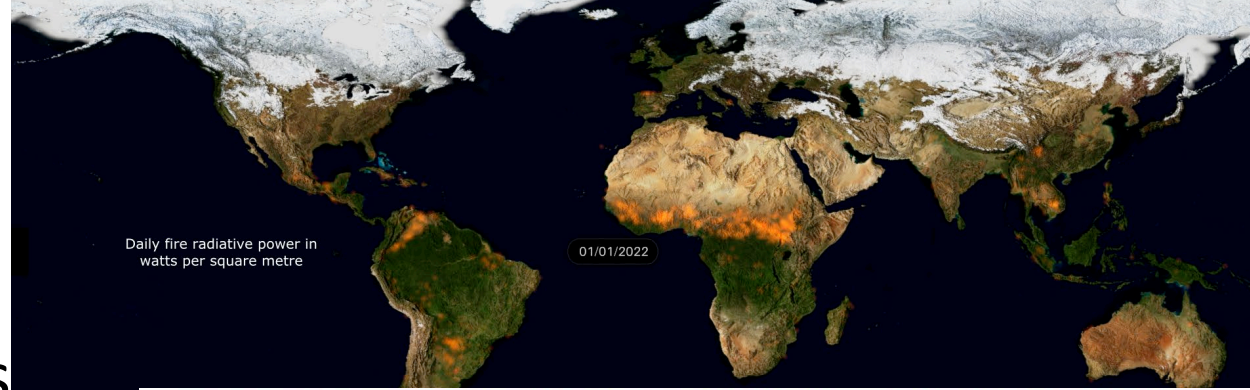
# Collaborate with

- Copernicus Emergency Service
  - fire weather
- Copernicus Land Service
  - vegetation state, burnt area
- ESA Sense4Fires for variability in emission and conversion factors
- ECMWF for land and fire modelling
- U Wageningen for GFED modelling

Thank you for your attention!

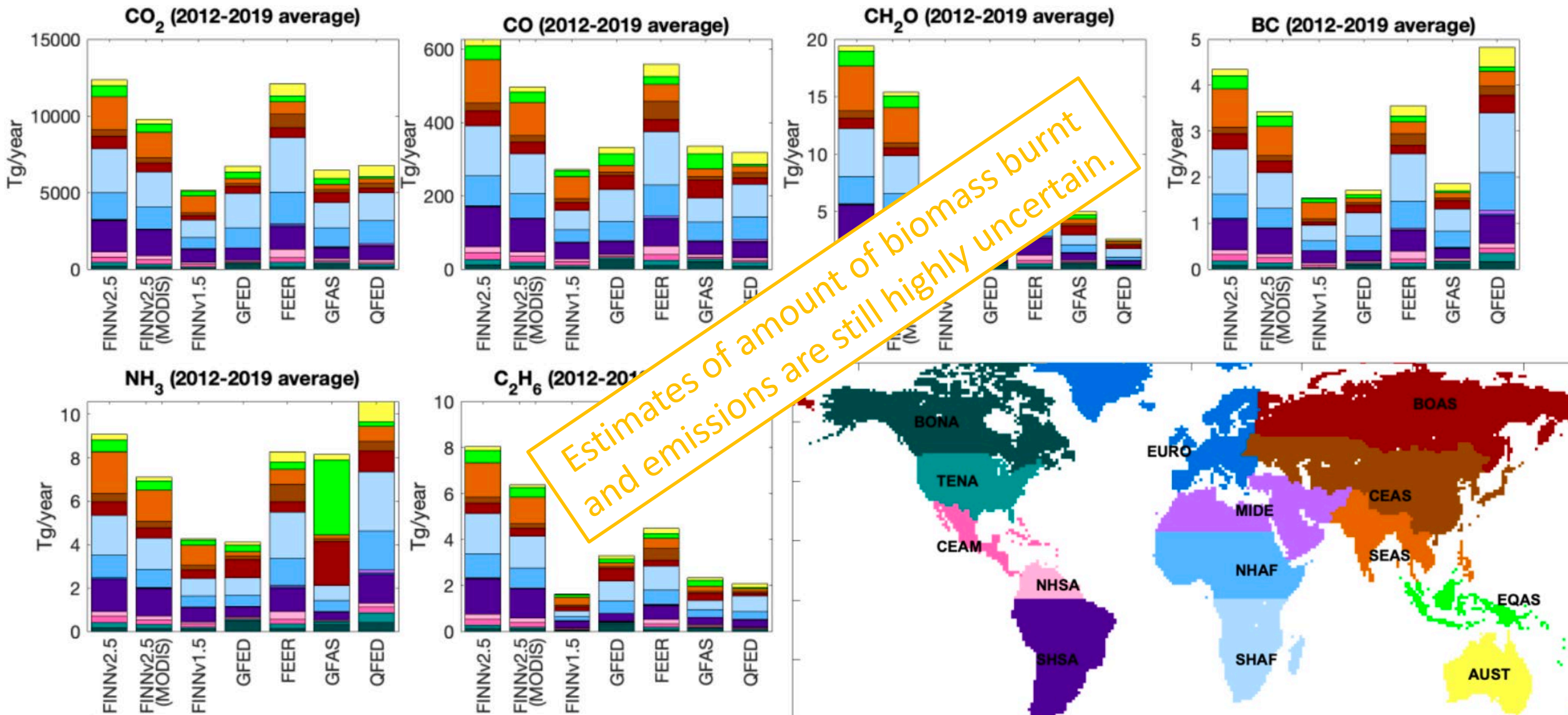
# Vegetation fires

- natural part of many ecosystems
- peat, soils and deforestation fires are net sources of CO<sub>2</sub>
- affect atmosphere & air quality
- global trend negative
  - savanna -> agriculture
- increase in high latitudes
- increased intensity and frequency change land cover





# Comparison of inventories



[Wiedinmyer et al. EGUsphere 2023]

# Copernicus atmosphere Monitoring Service (CAMS)

CAMS is one of six thematic information services provided by the Copernicus Earth Observation Programme of the European Union.

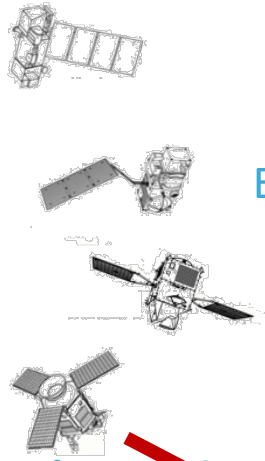
User driven with free and unrestricted access.



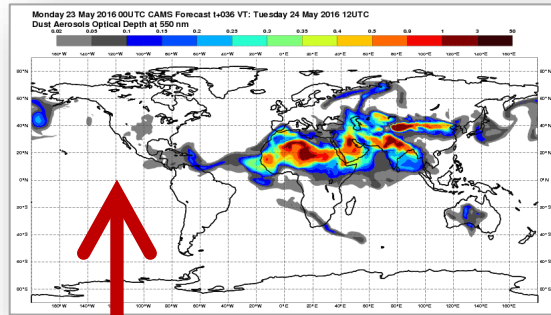
# CAMS workflow: Combining observations with models

CAMS main operational data assimilation and modelling systems

Emissions

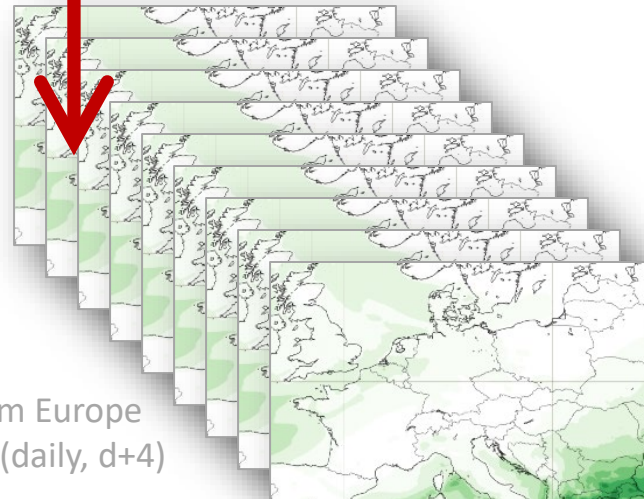


Earth Observation from satellite (>80 instruments) and in-situ (regulatory and research)

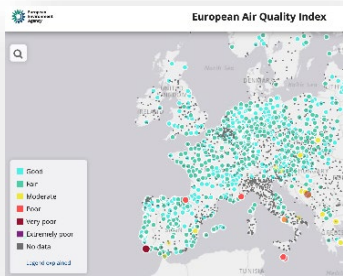


**GFAS**

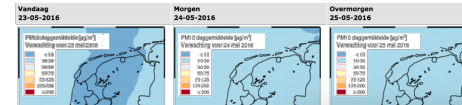
(twice daily, d+5)



10km Europe (daily, d+4)



Routine validation and EQC of products



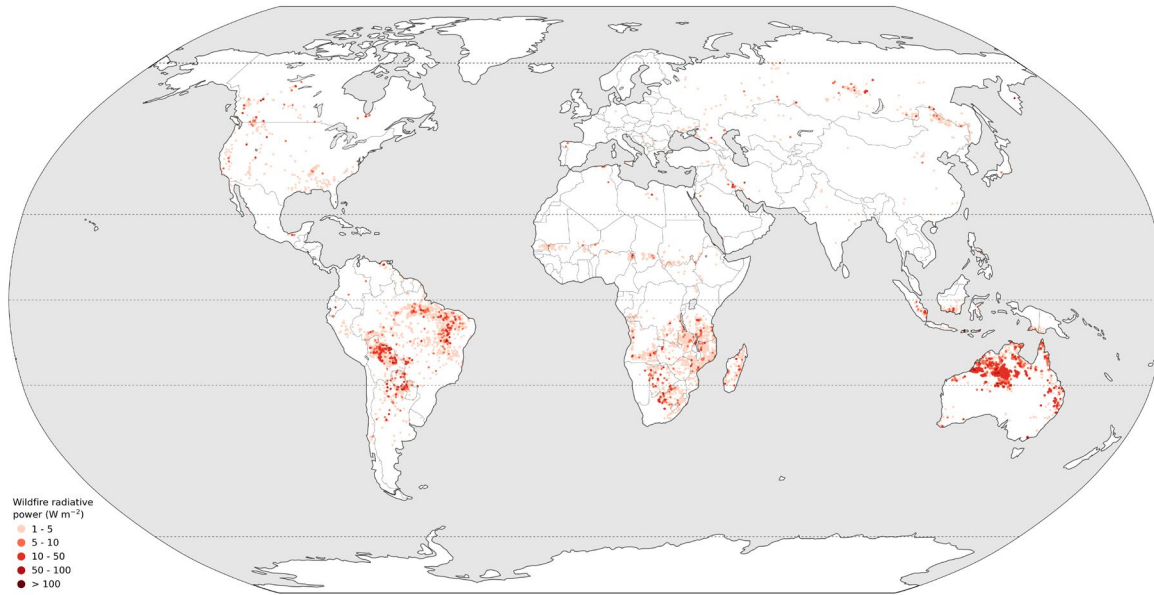

Major multiplication factor (100Mil+)




CAMS users >23500 (>3050 routine)

# CAMS Global Fire Assimilation System v1.4 (GFAS1.4)

GFAS Total Fire Radiative Power - October 2023



Wildfire radiative power ( $W m^{-2}$ )

- 1 - 5
- 5 - 10
- 10 - 50
- 50 - 100
- > 100



## Main uses:

- Input for CAMS global and regional operational systems
- Applied to many other models across the atmospheric chemistry modelling community
- Communication activities (e.g., CAMS communication & press; BAMS & C3S state of the climate reports; presented at workshops for various wildfire-related activities)

- Global Fire Assimilation System (**GFAS**); see <https://ads.atmosphere.copernicus.eu/cdsapp#!/dataset/cams-global-fire-emissions-gfas?tab=overview>

Uses satellite observations of Fire Radiative Power (FRP)

- Currently Aqua and Terra MODIS FRP observations

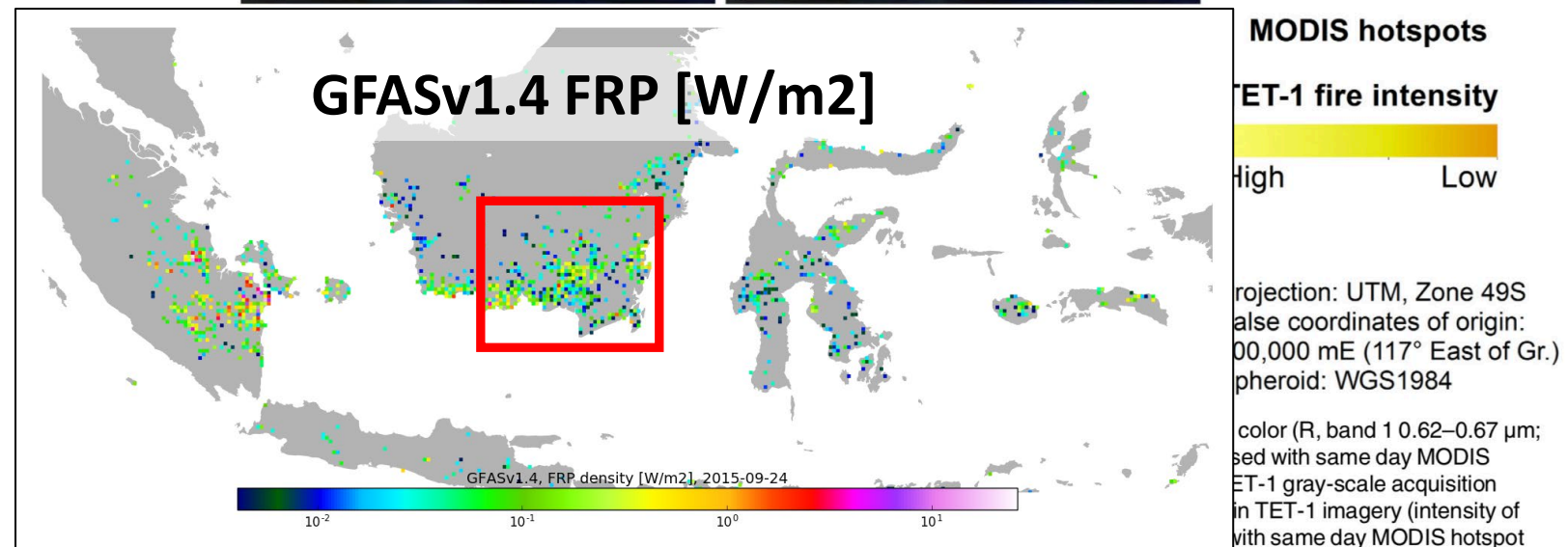
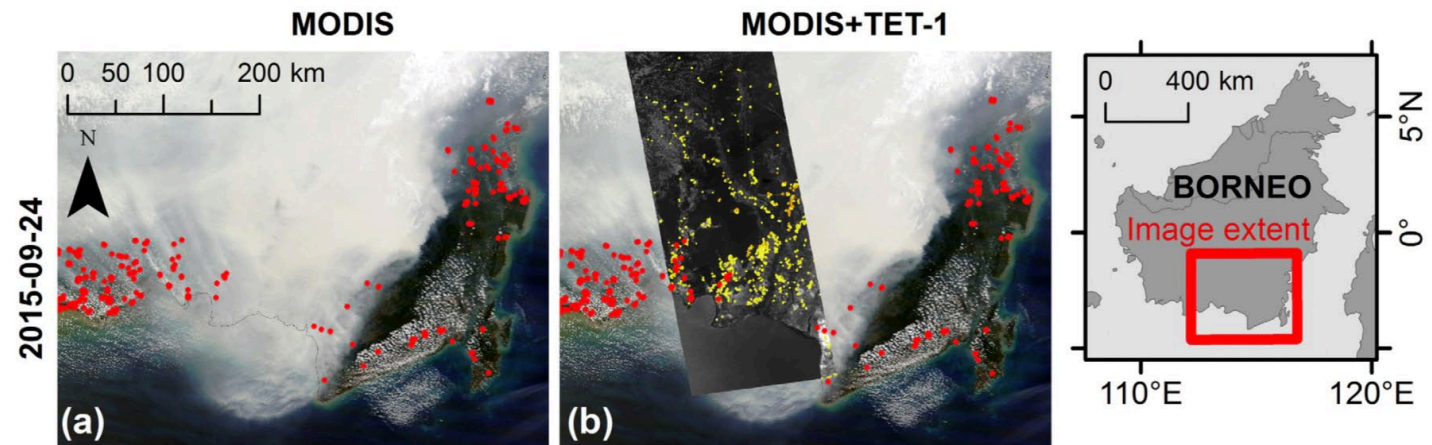
Global Coverage at ~10km Resolution

- Hourly Output (+24-h means): 7-hours behind NRT

- Emissions of aerosols and gases are estimated using factors dependent on vegetation type.
- Injection heights calculated with Plume Rise Model and IS4FIRES

# GFAS observation gap filling

- Kalman filter with **persistence** model
- **FRP > 0** observations ignite fires.
- **FRP = 0** observations extinguish fires.



data. (d) The MODIS image overlaid with TET-1 imagery, which shows MODIS hotspot active fire detection being inhibited by thick smoke and haze.

# Challenges 1/3: Some major scientific interests

- increase in **intensity** of wildfires
- increase in wildfire activity in **boreal and arctic** regions
- 2-way interaction with **land cover change**
  - associated net release of CO<sub>2</sub> into atmosphere
- impact on **air quality & atmospheric composition**

# Challenges 2/3: satellite-based Earth observation

- Fill FRP observation gaps by **merging all available FRP observations & fire modelling** with ML!
- distinguish **flaming vs. smoldering** and above- vs. below-ground fires
  - use diurnal cycle and peak FRP from EO
- calibrate **empirical conversion of FRP to burnt biomass and emissions**
  - use top-down constraints from plume EO
  - dependence on **meteorology & vegetation** -> **"Fire4Sense" by Jos de Laat**
- combined analysis of **FRP and burnt area** observations

# Challenges 3/3: CAMS-GFAS

- continuity **beyond MODIS** era
  - assimilate FRP from **VIIRS** and **SLSTR**
  - **basic bias correction** and **spurious signal map**, to be improved
- also assimilate **geostationary** observations of FRP
  - **SEVIRI**, **GOES-E/-W**, **Himawari-8**, **MTG-FCI**
- **operationalisation** of new developments
  - **bias correction** and **FRP modelling**
- **re-calibrate empirical parameters**: FRP -> burnt biomass -> species
  - against upcoming **GFED5** or
  - **inversion** of CO & AOD plume observations (and others)