## Emissions of long-standing and emergent air pollution in Africa obtained with satellite observations and models

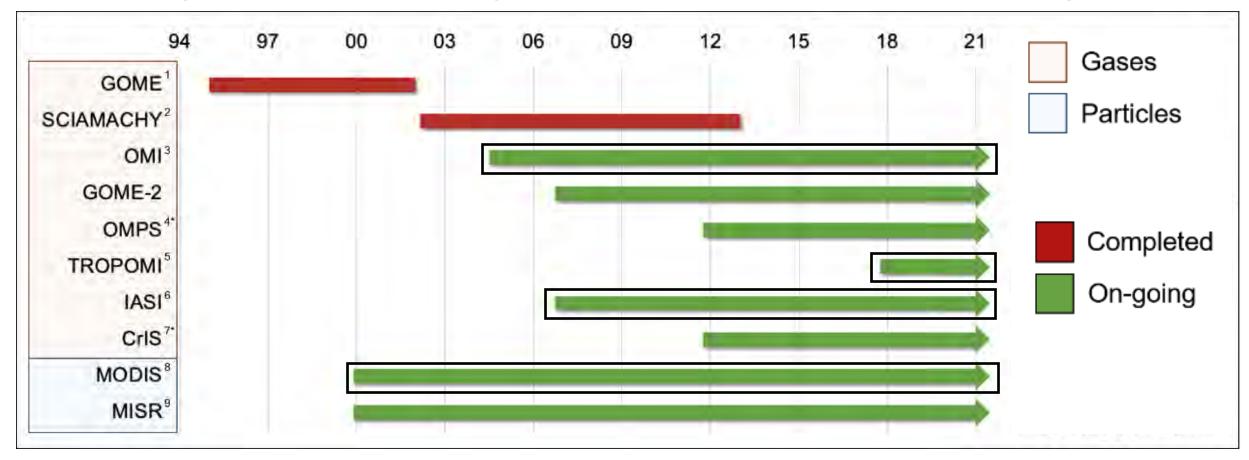




Eloise Marais (<a href="https://maraisresearchgroup.co.uk/">https://maraisresearchgroup.co.uk/</a>)
with many contributors from my research group and the satellite
retrieval community

University College London

# Long and consistent record of air pollution from space (low-Earth orbiting instruments that sample Africa)



Space-based constraints on air pollution:

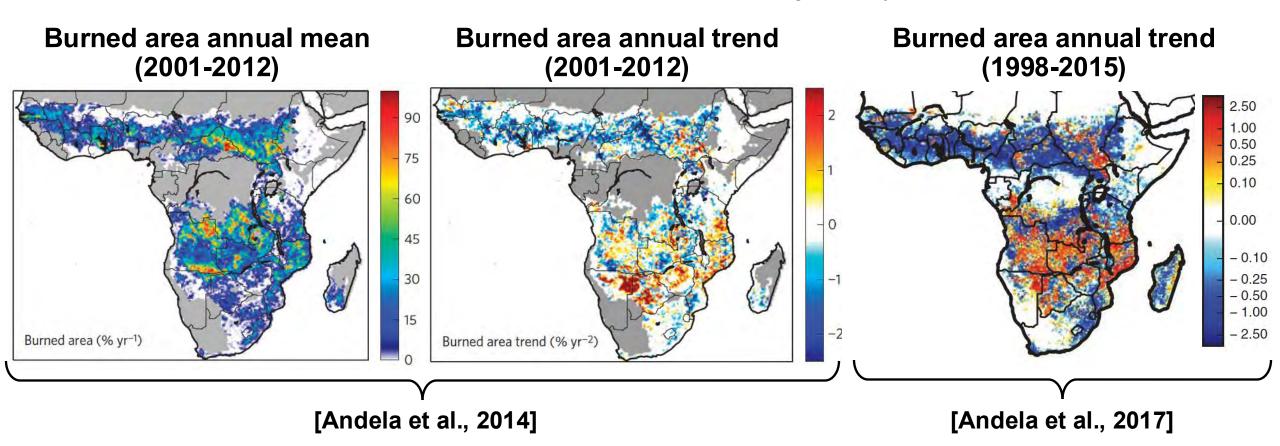
OMI/TROPOMI:  $NO_2$  ( $NO_x$ ), HCHO (NMVOCs)

IASI: NH<sub>3</sub>

MODIS: AOD (PM<sub>2.5</sub>)

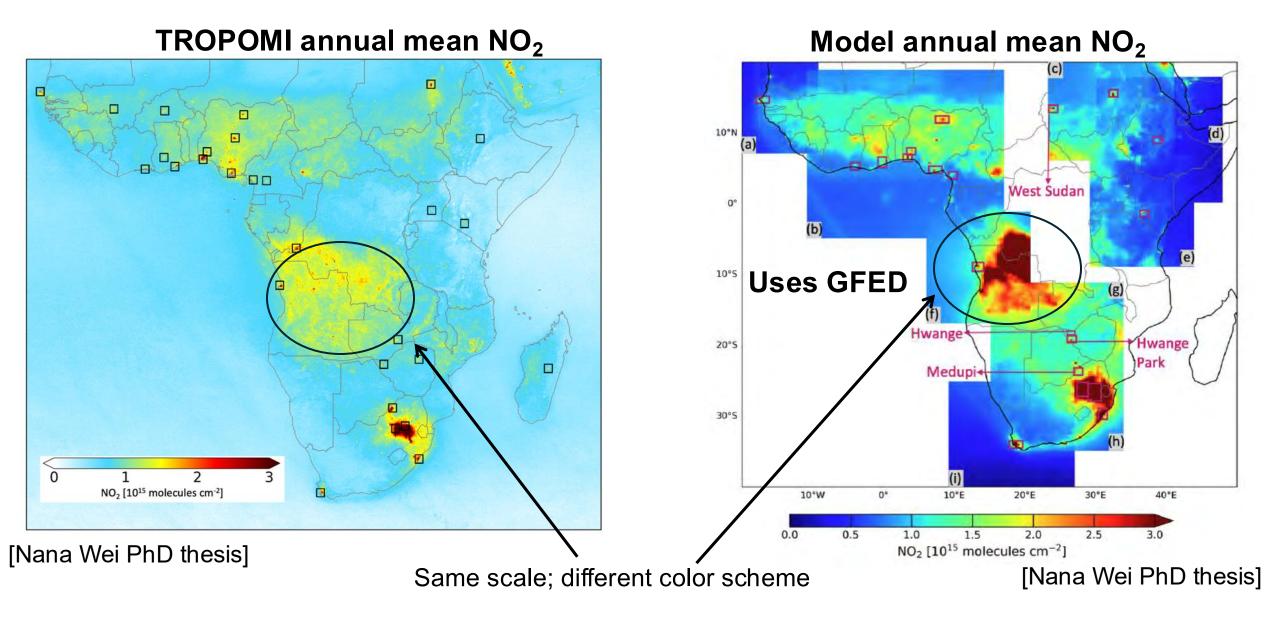
### Air Pollution Sources are Evolving

Overall decline in biomass burning activity



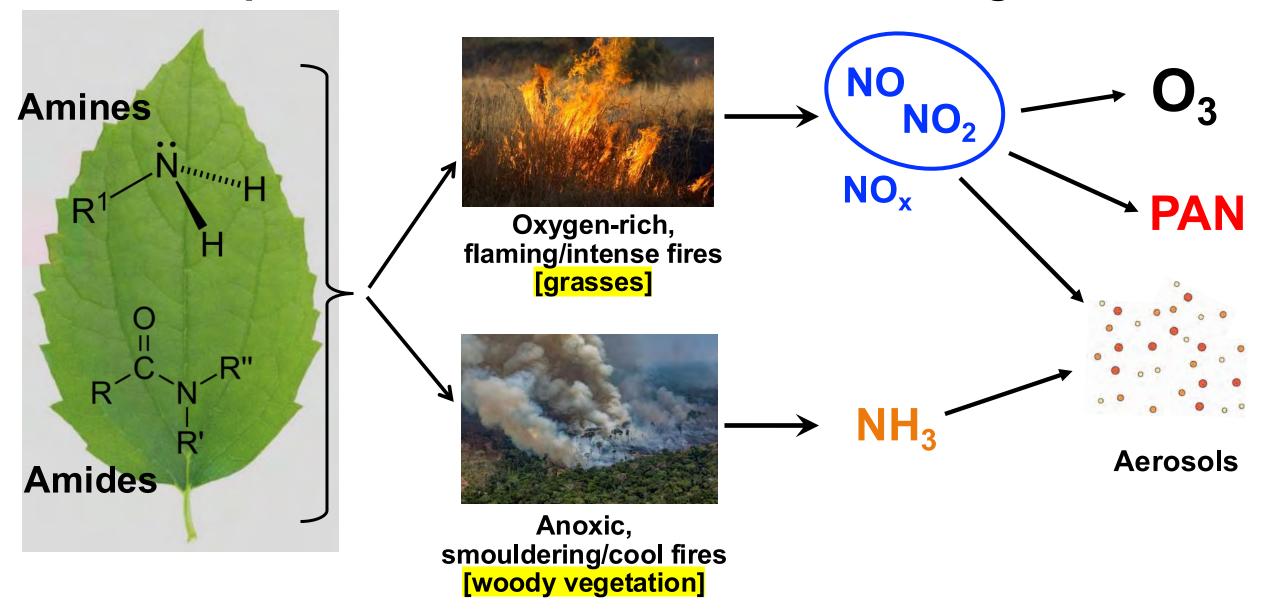
Strong decline north of the Equator due to changes in land cover (transition to agriculture) Mixed trends south of Equator (attributed to decadal rainfall patterns in 2014 paper)

#### How Well do We Know this "Traditional" Source



Mode overpredicts nitrogen dioxide (NO<sub>2</sub>). How well do we know reactive nitrogen emissions?

## **Open Fire Emissions of Reactive Nitrogen**



NO<sub>x</sub> and NH<sub>3</sub> affect local air quality, regional climate, and global atmospheric composition

## **Bottom-Up Biomass Burning Emissions**

#### **Emission = DMB x EF**

**DMB**: dry matter burned

**EF**: emission factor

#### DMB = Area burned x above-ground biomass x combustion completeness

#### 3 prominent inventories:

**GFED**: Global Fire Emissions Database

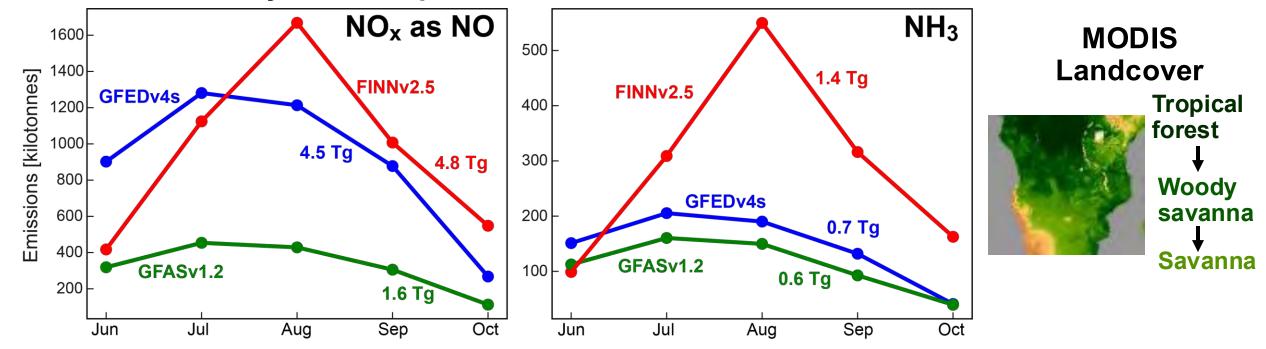
**FINN**: Fire INventory for NCAR

**GFAS**: Global Fire Assimilation System (CAMS)

DMB determined using distinct satellite data products for each inventory

## Reactive Nitrogen Emissions in Southern Africa

Monthly bottom-up June-October 2019 emissions



Mostly savanna fires. Some tropical forest fires.

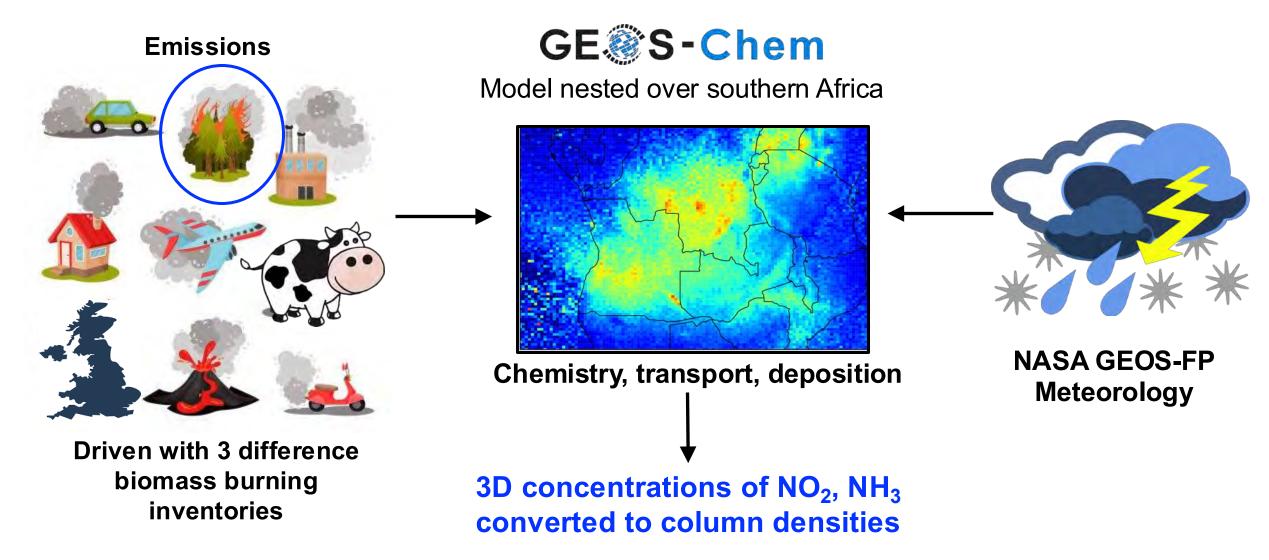
Apply all 3 inventories to **GE** S-Chem to compare to IASI for NH<sub>3</sub> and TROPOMI for NO<sub>2</sub>

Very different ozone production efficiencies (OPEs): GFAS more sensitive to NO<sub>x</sub> than others.

According to **GE** S-Chem, FINN OPE > GFED OPE, as far more VOCs and CO than others:

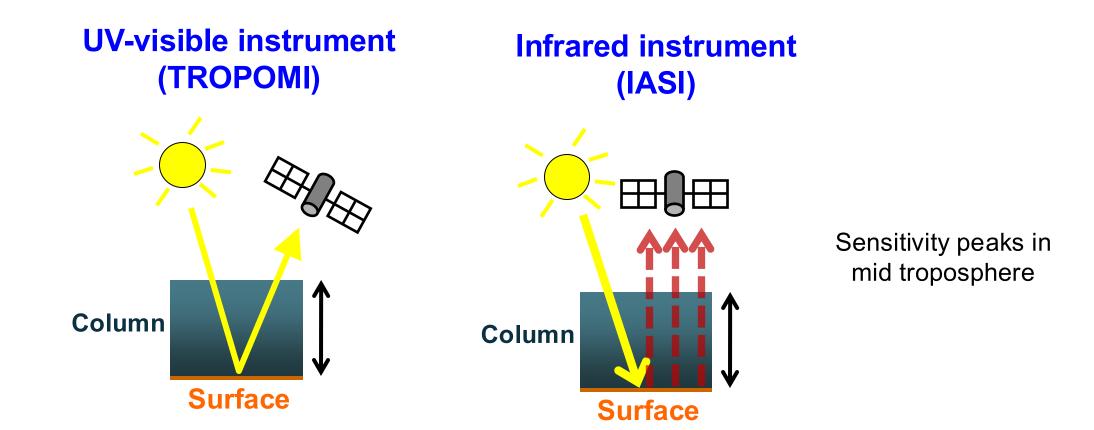
**FINN**: 108 Tg CO and 13 Tg C for 21 NMVOCs **GFED**: 82 Tg CO and 2 Tg C for 13 NMVOCs

#### **Drive GEOS-Chem with all Three Inventories**



Simulate model with each inventory turned on to compare the model to IASI and TROPOMI Sample the model at the same overpass time as the instruments

#### **Account for Instrument Vertical Sensitivities**



#### Different approach for each instrument:

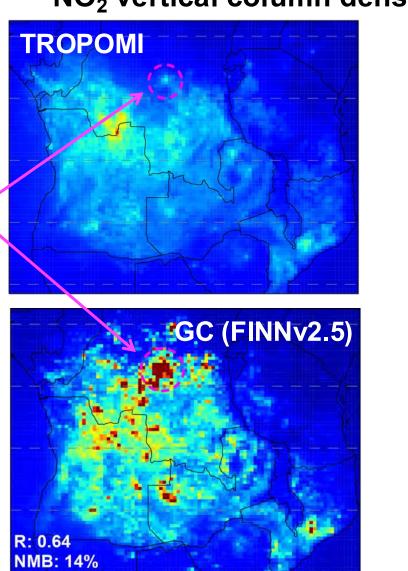
TROPOMI: apply averaging kernels (quantifies vertical sensitivity) to GEOS-Chem

**IASI**: reprocess (re-retrieve) IASI NH<sub>3</sub> with local GEOS-Chem a priori profiles

#### **Evaluation of Inventories with Satellite Observations**

NMB: -21%

NO<sub>2</sub> vertical column densities for Jun-Oct 2019

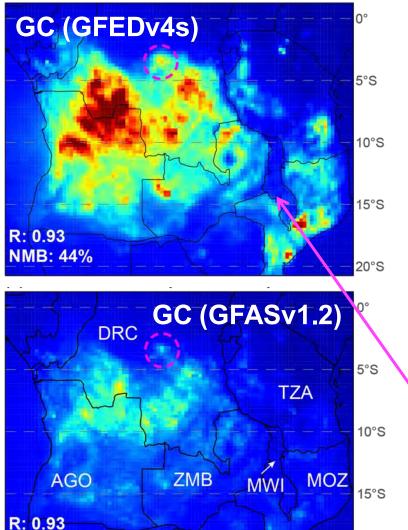


Far more NO<sub>x</sub>

forests in FINN

from tropical

(fuel load)



[10<sup>15</sup> molecules cm<sup>-2</sup>]

GC: GEOS-Chem



GFED and GFAS NO<sub>2</sub> spatially similar, but >50% difference due to emission factors

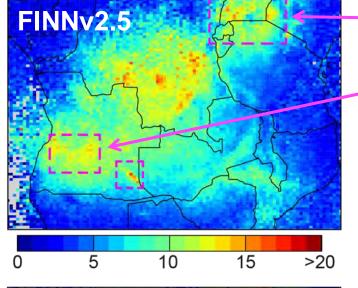
Low emissions in Malawi, as spread of fire suppressed by dense population

20°S

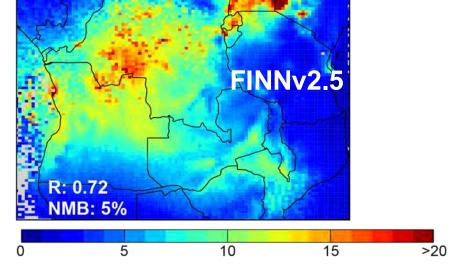
#### **Evaluation of Inventories with Satellite Observations**

NH<sub>3</sub> vertical column densities for Jul-Oct 2019 [10<sup>15</sup> molecules cm<sup>-2</sup>]

IASI with **GEOS-Chem** prior:

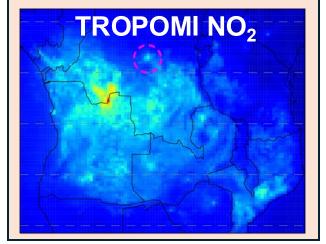


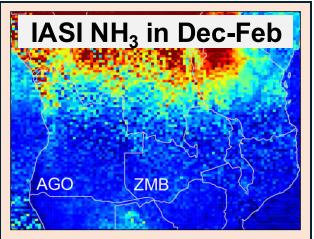
**GEOS-Chem:** 



Anthropogenic NH<sub>3</sub> in the Lake Ukerewe Basin

Fire NH<sub>3</sub> in Angola that no inventory reproduces



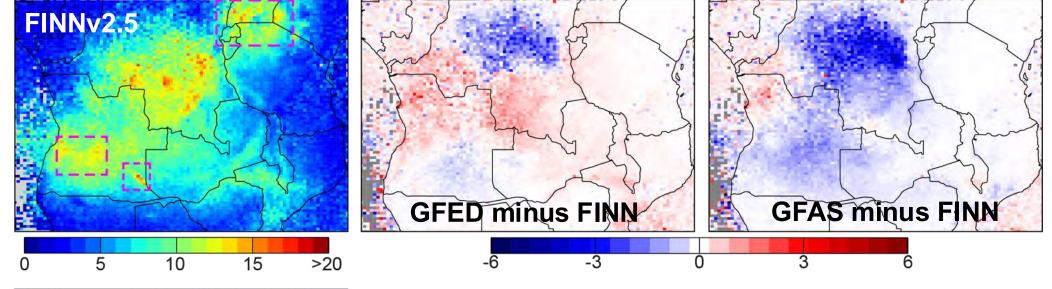


June excluded, as no inventories consistent with IASI observations (R < 0.5)

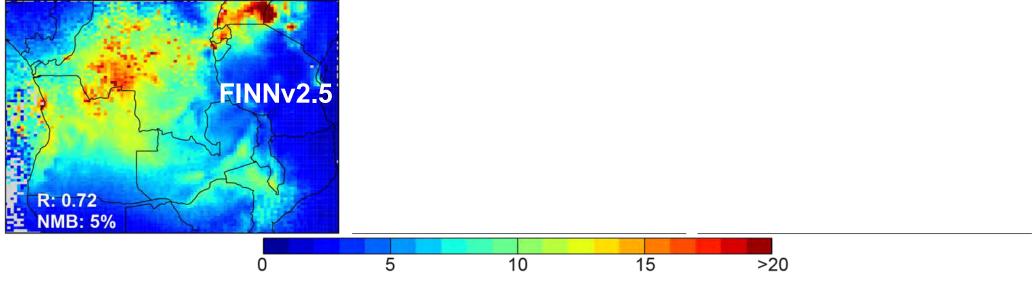
#### **Evaluation of Inventories with Satellite Observations**

NH<sub>3</sub> vertical column densities for Jul-Oct 2019 [10<sup>15</sup> molecules cm<sup>-2</sup>]

IASI with GEOS-Chem prior:



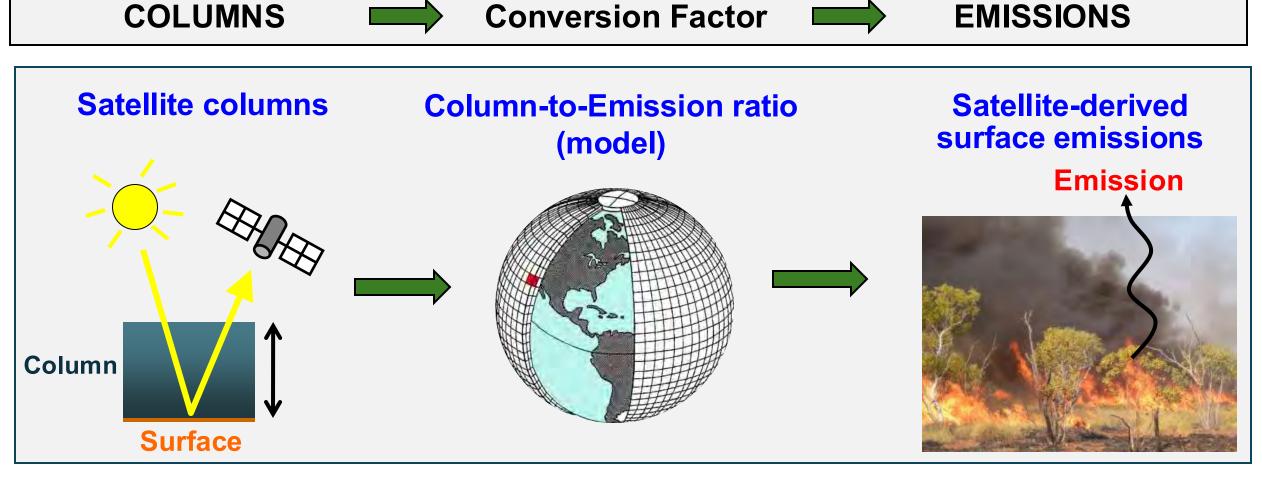
**GEOS-Chem:** 



June excluded, as no inventories consistent with IASI observations (R < 0.5)

### **Top-down emissions estimate**

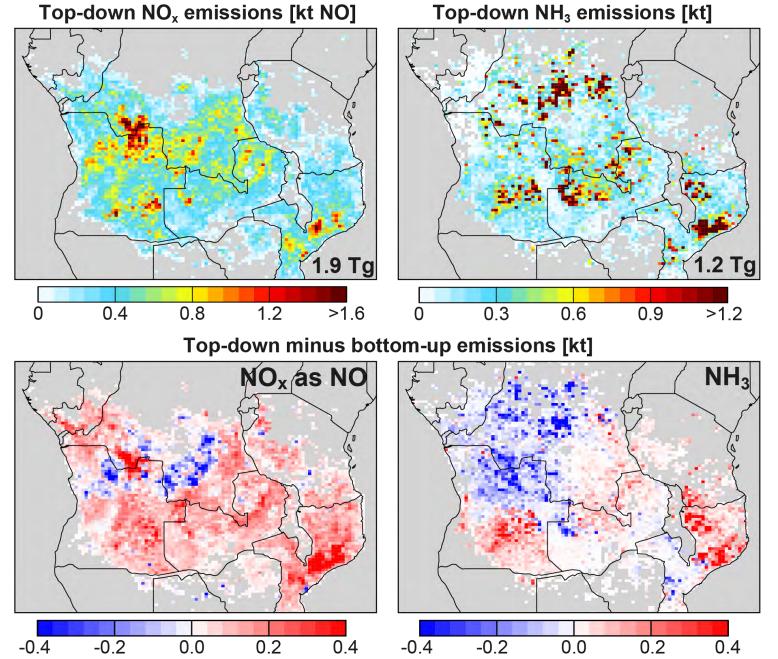
Convert atmospheric column concentrations to surface emissions using a model



Simple mass balance approach, as it's a first order problem (very large errors)

Use best-performing inventory (**GFAS** for  $NO_x$ , **FINN** for  $NH_3$ ) for gridsquares where open fires > 50% total emissions

## **Top-down Emissions with Best Performing Inventories**



Mass-balance approach: convert satellite columns to 24-h monthly emissions using **GE** S-Chem

Uses GFAS for  $NO_x$ , FINN for  $NH_3$  if biomass burning > 50% total

Distribution normal for NO<sub>x</sub>, long-tailed for NH<sub>3</sub>

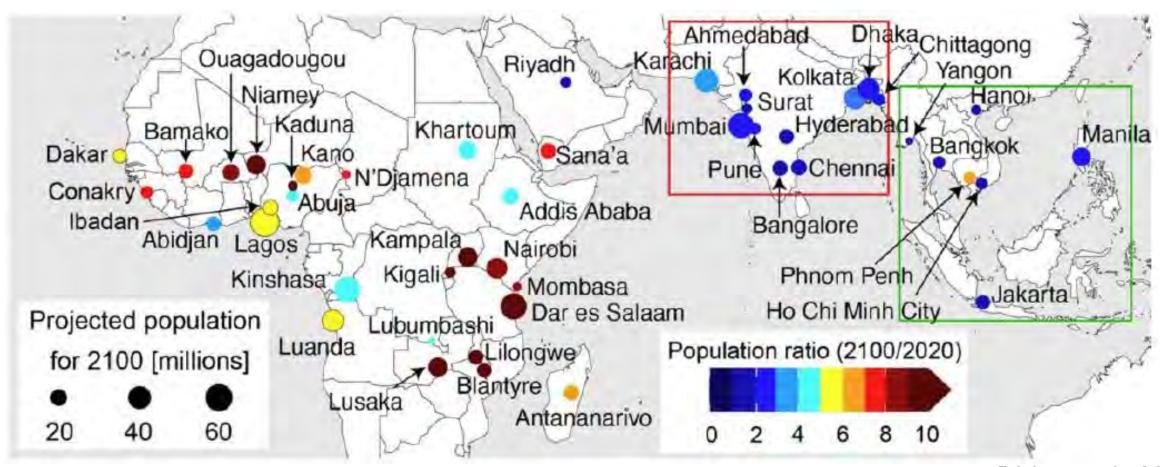
Individual inventories correlate  $NO_x$  and  $NH_3$  (R > 0.8), but top-down is not (R < 0.4)

Emissions peak in similar month to bottom-up: July and August for NO<sub>x</sub> and August in NH<sub>3</sub>

Observationally constrained OPE of 13  $Tg O_3 per Tg NO$ 

## Fastest-growing cities are in the tropics

Air quality trends in the 46 fastest-growing cities in tropical Africa, Asia and the Middle East

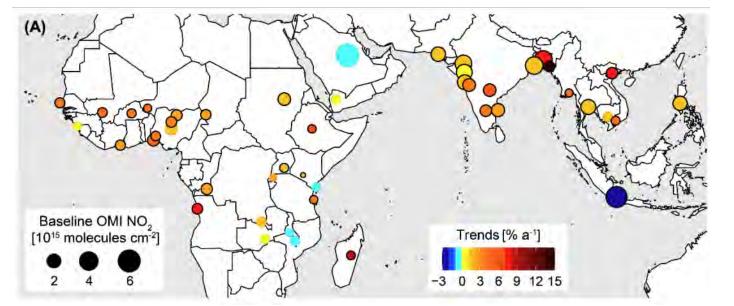


[Vohra et al,. 2022]

Regional annual projected population growth rates for 2020-2100 [Hoornweg & Pope, 2017]: 3-31% for Africa, 0.8-3% for South Asia, 0.5-7% for Southeast Asia

## Trends in nitrogen oxides ( $NO_x$ ) and fine particles ( $PM_{2.5}$ )

 $NO_2$  trends (proxy for  $NO_x$ ) [2005-2018]



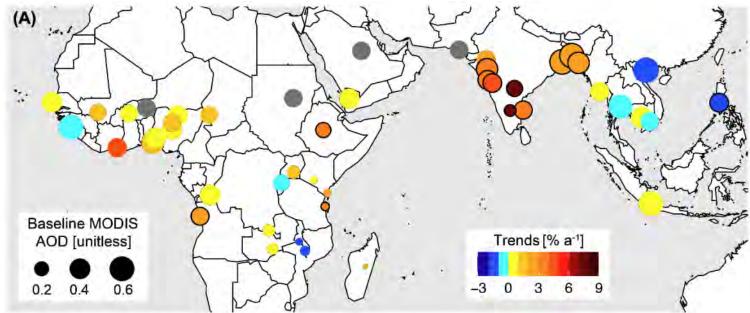
**Circle size:** starting point

Circle color: trend

**Circle outline:** significant

 $NO_x$  increase: up to 14% a<sup>-1</sup>

**AOD** trends (proxy for **PM**<sub>2.5</sub>) [2005-2018]

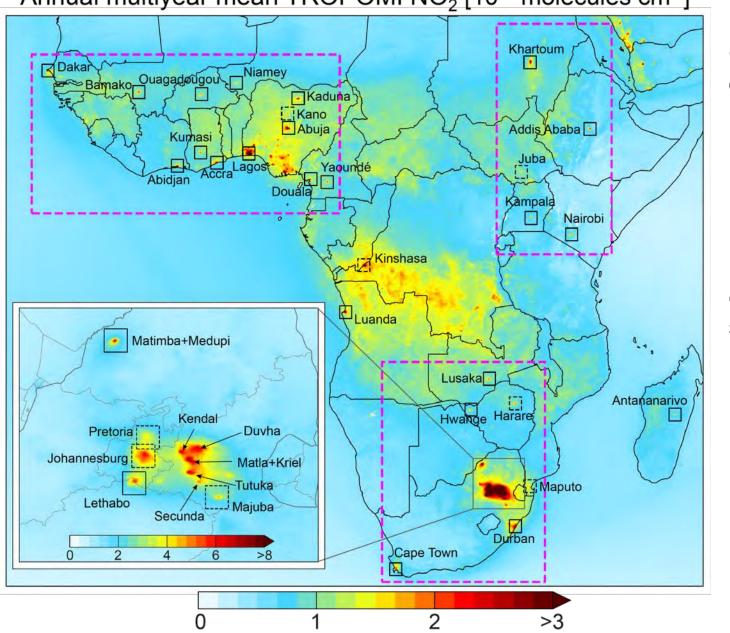


Increases in PM<sub>2.5</sub> precursors SO<sub>2</sub>, NH<sub>3</sub>, NO<sub>x</sub>

[Vohra et al,. 2022]

#### **Urban and Point Sources Resolved with TROPOMI**

Annual multiyear mean TROPOMI NO<sub>2</sub> [10<sup>15</sup> molecules cm<sup>-2</sup>]



Oversample 4 years of TROPOMI data to finer scale (~2 km) than nadir resolution

Identify 32 isolated hotspots: most urban, 4 power plants

Boxes: dashed if attempt to calculate emissions fails; solid if succeeds

## Hotspot NO<sub>x</sub> Emissions in Sub-Saharan Africa

The largest anthropogenic point source emissions of NO<sub>x</sub> are in Sub-Saharan Africa (South Africa)

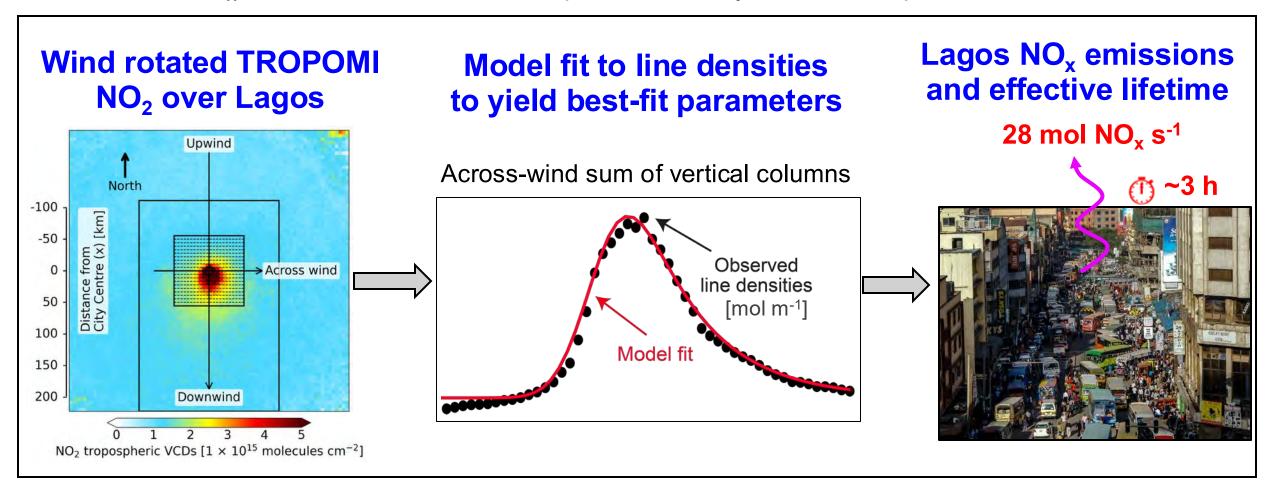
| Rank | Lat [° N] | Long [° E] | Emissions [kg s <sup>-1</sup> ] | Error [kg s $^{-1}$ ] | Power plants (GPPD) <sup>1</sup> | Cities (WCD) <sup>1</sup> | Comment <sup>2</sup>             |
|------|-----------|------------|---------------------------------|-----------------------|----------------------------------|---------------------------|----------------------------------|
| 1    | -26.2875  | 29.1625    | 2.76                            | 0.47                  | Matla; Kriel                     |                           |                                  |
| 2    | -26.5625  | 29.1625    | 2.47                            | 0.39                  |                                  |                           | Secunda CTL <sup>3</sup>         |
| 3    | -23.6875  | 27.5875    | 2.47                            | 0.56                  | Matimba                          |                           | also Medupi (not listed in GPPD) |
| 4    | -26.7375  | 27.9875    | 2.03                            | 0.44                  | Lethabo                          | Vereeniging               |                                  |
| 5    | -27.1125  | 29.7875    | 2.03                            | 0.31                  | Majuba                           |                           |                                  |
| 6    | 22.3875   | 82.6875    | 2.01                            | 0.59                  | Korba                            |                           |                                  |
| 7    | 40.6375   | 109.7375   | 1.81                            | 0.57                  | Baotou                           | Baotou                    |                                  |
| 8    | 21.0125   | 107.1375   | 1.80                            | 0.42                  | Quang Ninh                       | Ha Long; Cam Pha          |                                  |
| 9    | -26.0875  | 28.9875    | 1.74                            | 0.32                  | Kendal                           |                           |                                  |
| 10   | -32.4125  | 151.0125   | 1.73                            | 0.30                  | Bayswater; Liddell               |                           | [Beirle et al 2023               |

IDEILIE EL al., 2023

Unregulated coal-fired power plants (Kriel, Matimba, Lethabo, Majuba, Kendal) and a synthetic fuels plant (Secunda)

## Top-down Estimate of Hotspot NO<sub>x</sub> Emissions

Derive NO<sub>x</sub> emissions of isolated hotspots viewed by UV-visible space-based sensors



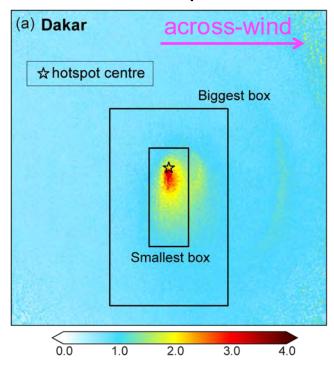
Target hotspots in understudied regions of the world:

Cities in South and Southeast Asia completed [Lu et al., 2025]

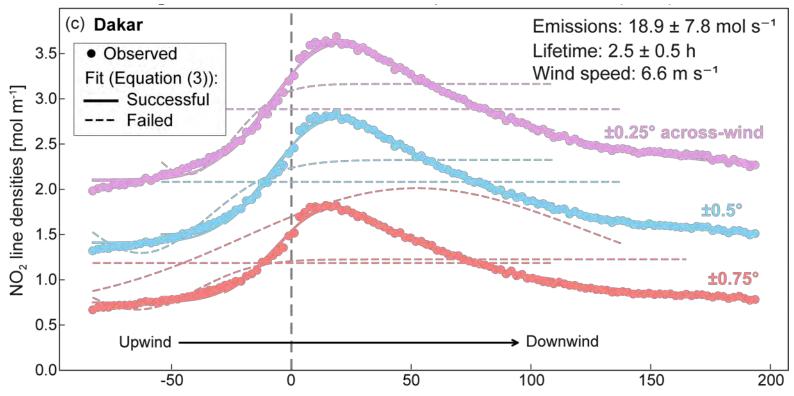
Hotspots in Sub-Saharan Africa in progress [Marais et al., in prep]

## Hotspot NO<sub>x</sub> Emissions Inversion Method

Wind rotate TROPOMI NO<sub>2</sub> about the hotspot centre

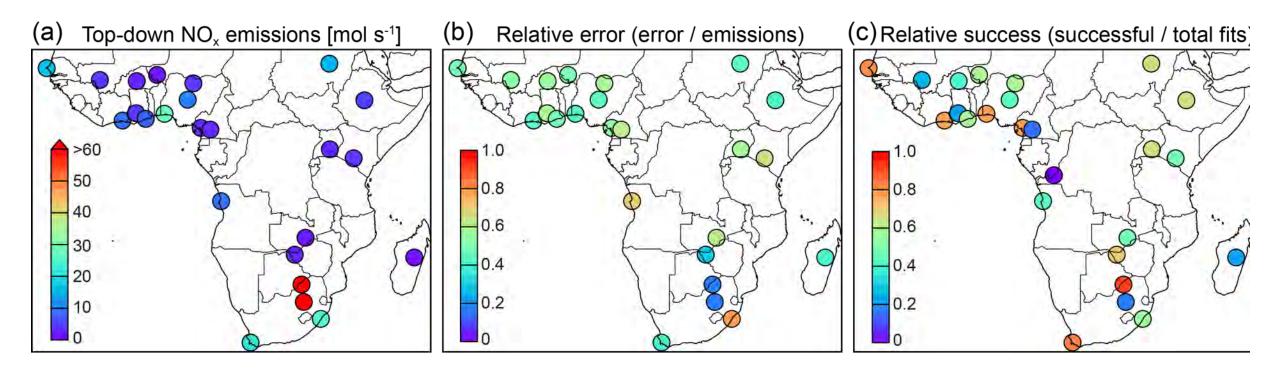


Sum across-wind NO<sub>2</sub> to yield 1D line densities and apply an Exponentially Modified Gaussian (EMG) fit



29 out of 36 successful fits for Dakar (Senegal) yielding the following quantities: 18.9±7.8 mol NO<sub>x</sub> emitted s<sup>-1</sup>, 2.5±0.5 h effective lifetime, 6.6 m s<sup>-1</sup> wind speed

## NO<sub>x</sub> Emissions for All Successful Hotspots



Derived emissions for 24 hotspots compared to at most 5 Sub-Saharan hotspots in past studies

Emissions total 207.3 kilotonnes NO

Most hotspots very small (<10 mol s<sup>-1</sup>) sources of  $NO_x$  compared to urban hotspots in Southeast and Southeast Asia (> 60 mol s<sup>-1</sup> for Delhi and Dhaka [Lu et al., 2025])

## **Are Power Plant Hotspot NO<sub>x</sub> Emissions Accurate?**

South Africa power plant emissions measured with Continuous Emissions Monitoring Systems (CEMS) (https://www.eskom.co.za/dataportal/emissions/ael/)

#### **Matimba and Medupi:**

CEMS: 74.1 mol s<sup>-1</sup>

Top-down (this work):  $69.8 \pm 25.7$  mol s<sup>-1</sup>

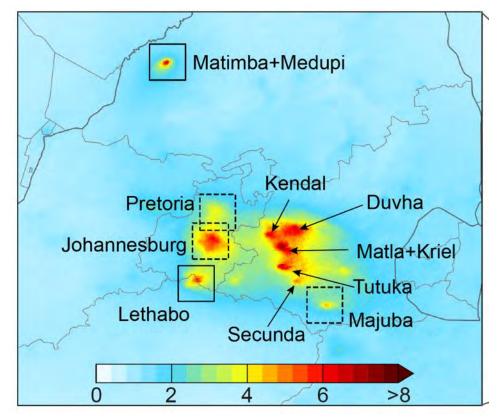
Top-down (Beirle et al., 2023): 82.3 ± 18.7 mol s<sup>-1</sup>

#### **Lethabo:**

CEMS: 65.2 mol s<sup>-1</sup>

Top-down (this work):  $70.4 \pm 23.8 \text{ mol s}^{-1}$ 

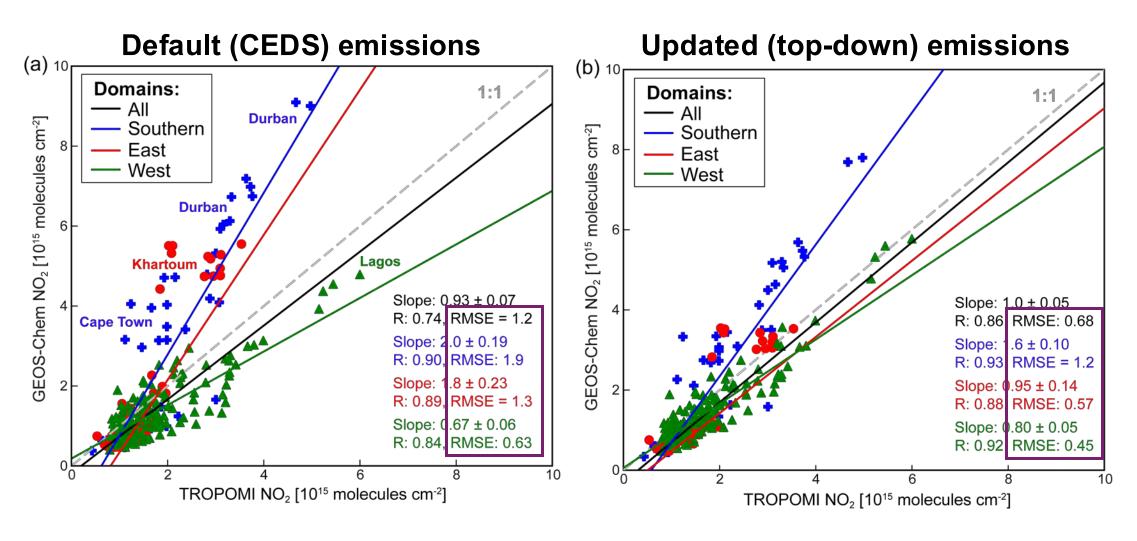
Top-down (Beirle et al., 2023):  $67.7 \pm 14.7 \text{ mol s}^{-1}$ 



Our values are within 18-20% of CEMS and within 4-15% of an alternate top-down approach

## **Are Urban Hotspot NO<sub>x</sub> Emissions Accurate?**

Emissions → GE@S-Chem → NO<sub>2</sub> column densities



Urban CEDS emissions total 159 kilotonnes NO, whereas top-down total 135 kilotonnes NO

### **Concluding Remarks**

Satellites offer tremendous potential to quantify air pollutant precursor source strengths in Africa, especially in the absence of ground-based networks.

Able to derive open fire emissions of most reactive nitrogen compounds using a relatively simple mass balance approach and derive annual  $NO_x$  emissions for 24 isolated hotspots (21 urban, 3 power plants) by applying a Gaussian-type fit to a wind rotated plume.

Biomass burning inventories collocate  $NH_3$  and  $NO_x$  emissions (smouldering and flaming fires), but these are mostly separate in the top-down estimates.

Top-down urban hotspot emissions range from < 2 mol s<sup>-1</sup> for Antananarivo in Madagascar to 27.7 ± 11.7 mol s<sup>-1</sup> for the megacity Lagos in Nigeria.

Top-down values improve agreement between modelled and observed tropospheric NO<sub>2</sub> columns, except for Durban and Cape Town. The cause is unclear.

Critical need for ground-based observations to validate satellite observations and top-down estimates.

Where funding permits, I am always seeking opportunities for Africa-based PhD students and postdocs to train under my supervision!