

# Inverse modelling of CO<sub>2</sub> , CH<sub>4</sub> and N<sub>2</sub>O using JAMSTEC's MIROC4-ACTM

Prabir K Patra and colleagues

25 October 2018

Kyoto, Japan

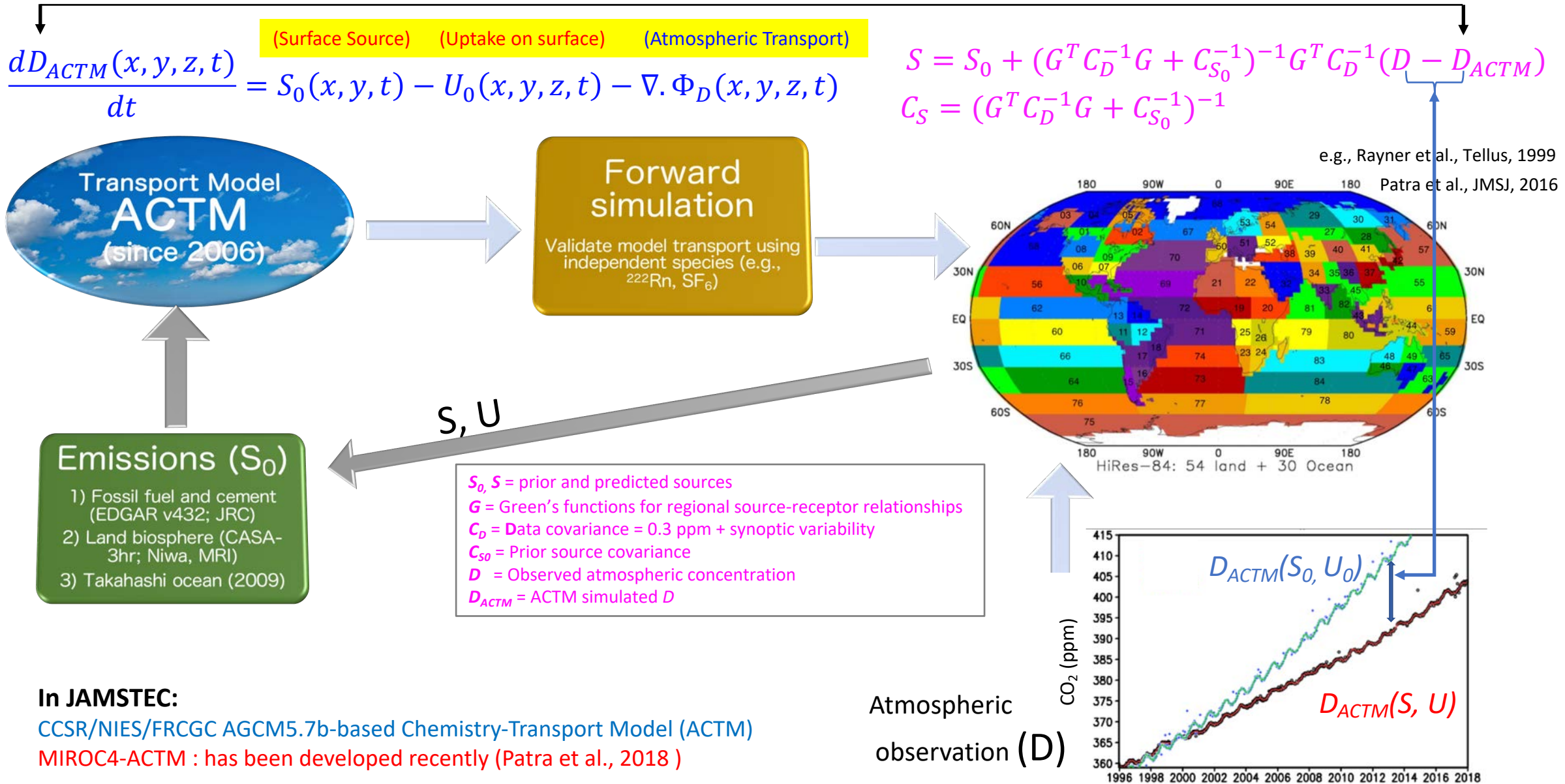


MoE  
Suishin-hi

# Introduction

- Global stocktaking of greenhouse gases emissions is scheduled for the early 2020s
  - Each country will report their progress towards the Nationally Determined Contributions
  - Independent estimation is likely to come from the regional and global inversion of atmospheric observations
- Inverse modelling of CO<sub>2</sub> using MIROC4-ACTM (1998-2017)
  - Comparisons with some other results, as our inversion is almost entirely data driven
  - Contribution to Global Carbon Budget (LeQuere et al., 2018, ESSD, in review)
  - Contribution to TransCom-HIPPO (Gaubert et al., in review)
- Inverse modelling of CH<sub>4</sub> and N<sub>2</sub>O using MIROC4-ACTM
  - Explanation of the CH<sub>4</sub> growth rate anomaly in the past 3 decades
  - Attribution of emissions to anthropogenic and natural emission processes
- Use of satellite remote sensing data of atmospheric column CO<sub>2</sub> and CH<sub>4</sub>
  - Rapid progress in the recent years
  - Extremely promising for refining sources and sinks estimate by the surface network

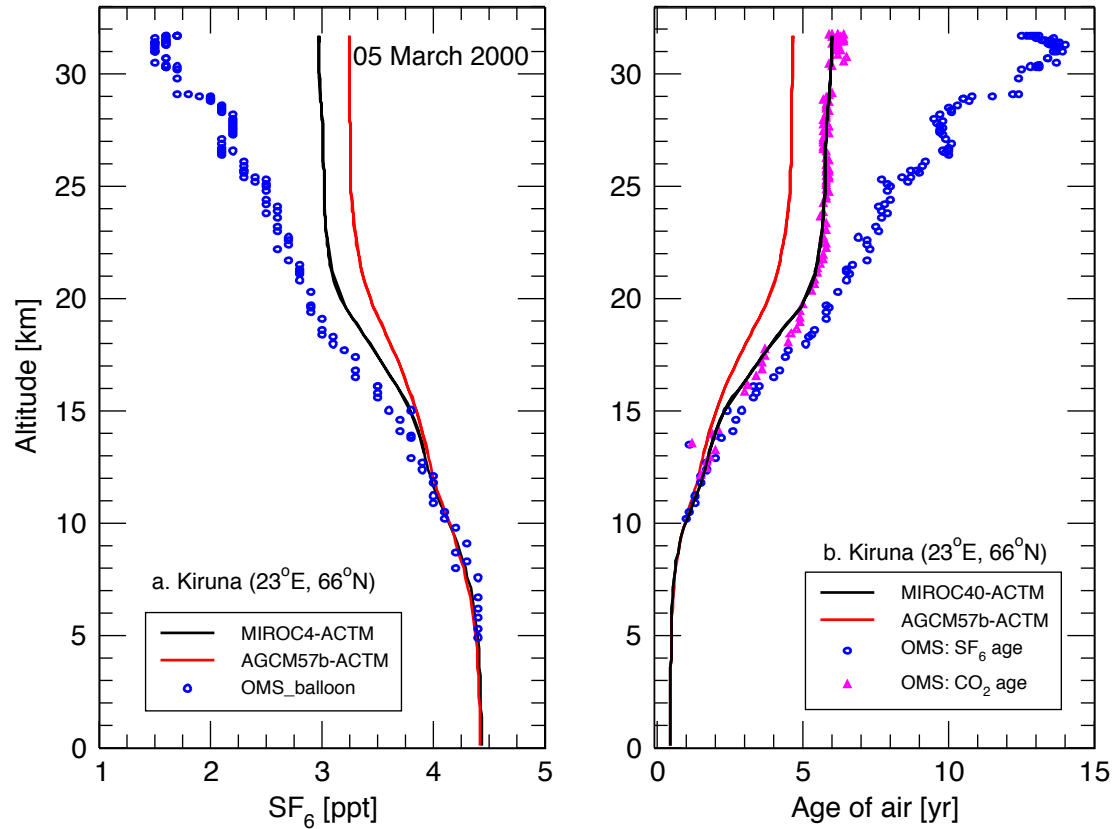
# Inverse modelling of CO<sub>2</sub>: TransCom experiment and modification



# Development of MIROC4-ACTM: transport validation using age of air and SF<sub>6</sub>

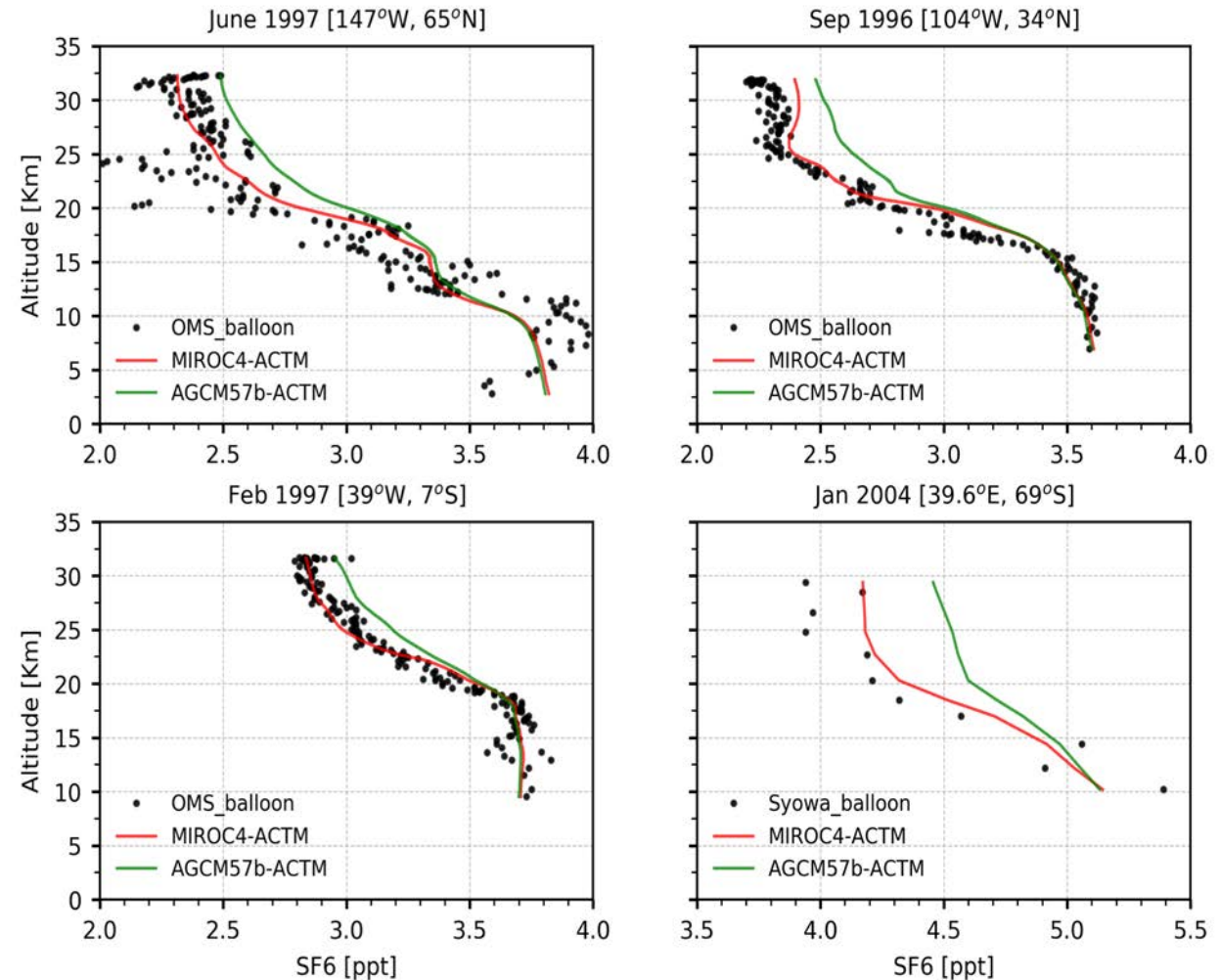
(SF<sub>6</sub> is a dielectric material with no known loss in the troposphere and stratosphere, but some loss in the mesosphere affect polar stratospheric data)

But in the polar stratosphere.....



Ray et al., 2017 (CO<sub>2</sub> age of air); Patra et al., revised, SOLA

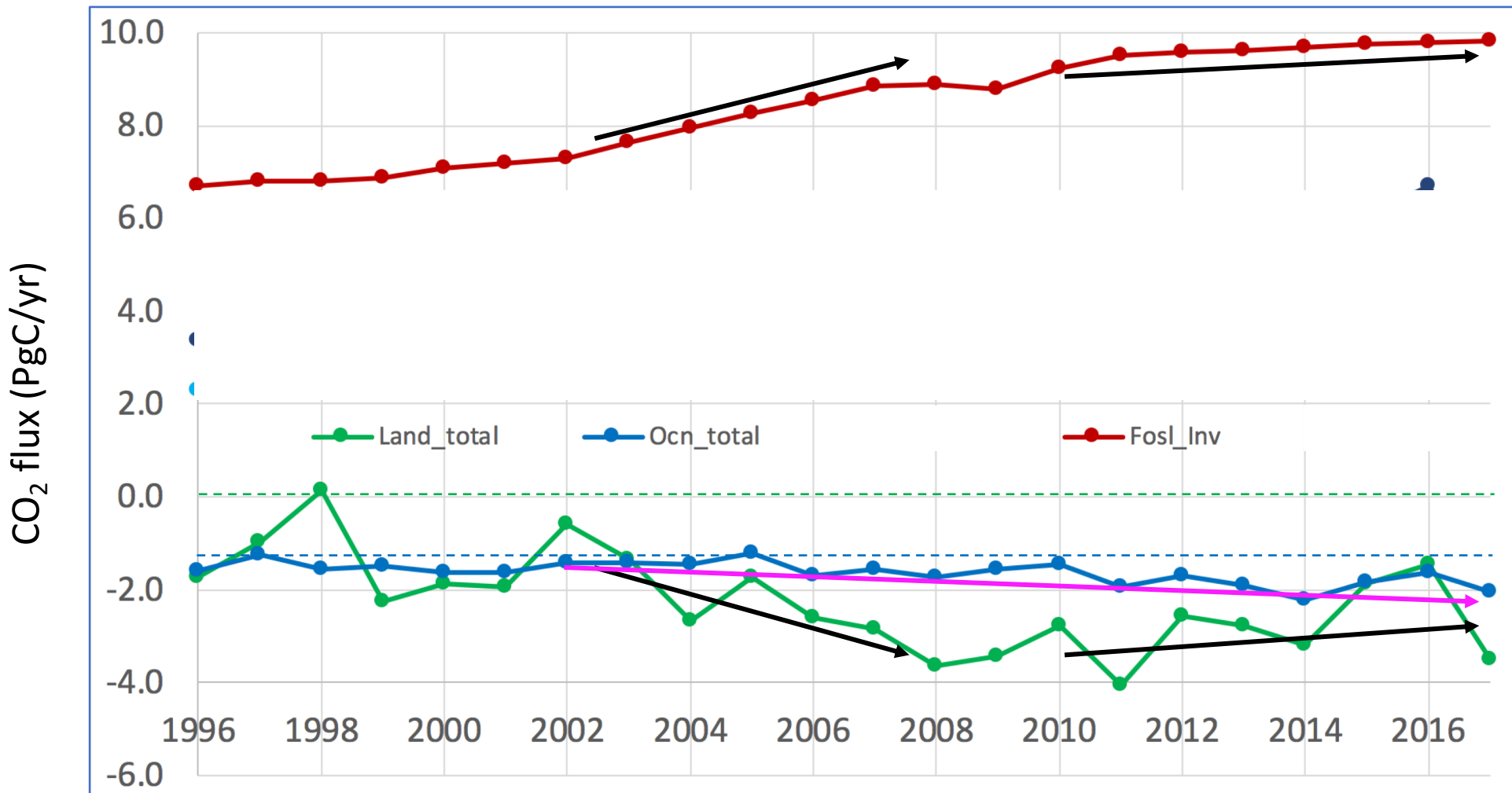
MIROC4-ACTM SF<sub>6</sub> agree quite well with observations, compared to AGCM57b-ACTM



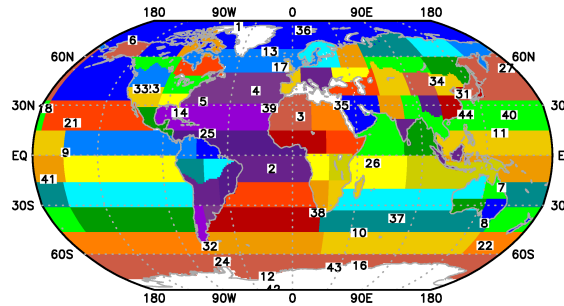
Observations : GMD/NOAA (Daube et al., 2002); NIPR/Tohoku Univ (Goto et al, 2017)

# CO2 INVERSION RESULTS

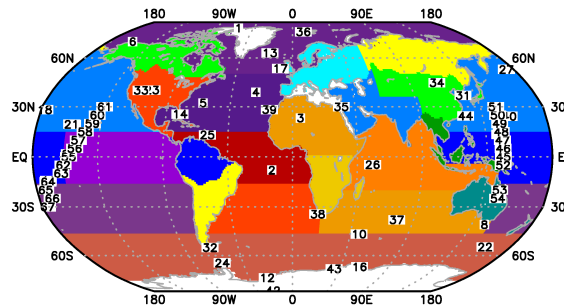
# MIROC4-ACTM inversion (TDI84\_2017) : global totals



HiRes-84: 54 land and 30 ocean regions (44 fixed stations)



Aggregated 23 regions (44 fixed and 23 mobile stations)



Units:

1 Pg = 10<sup>15</sup> g

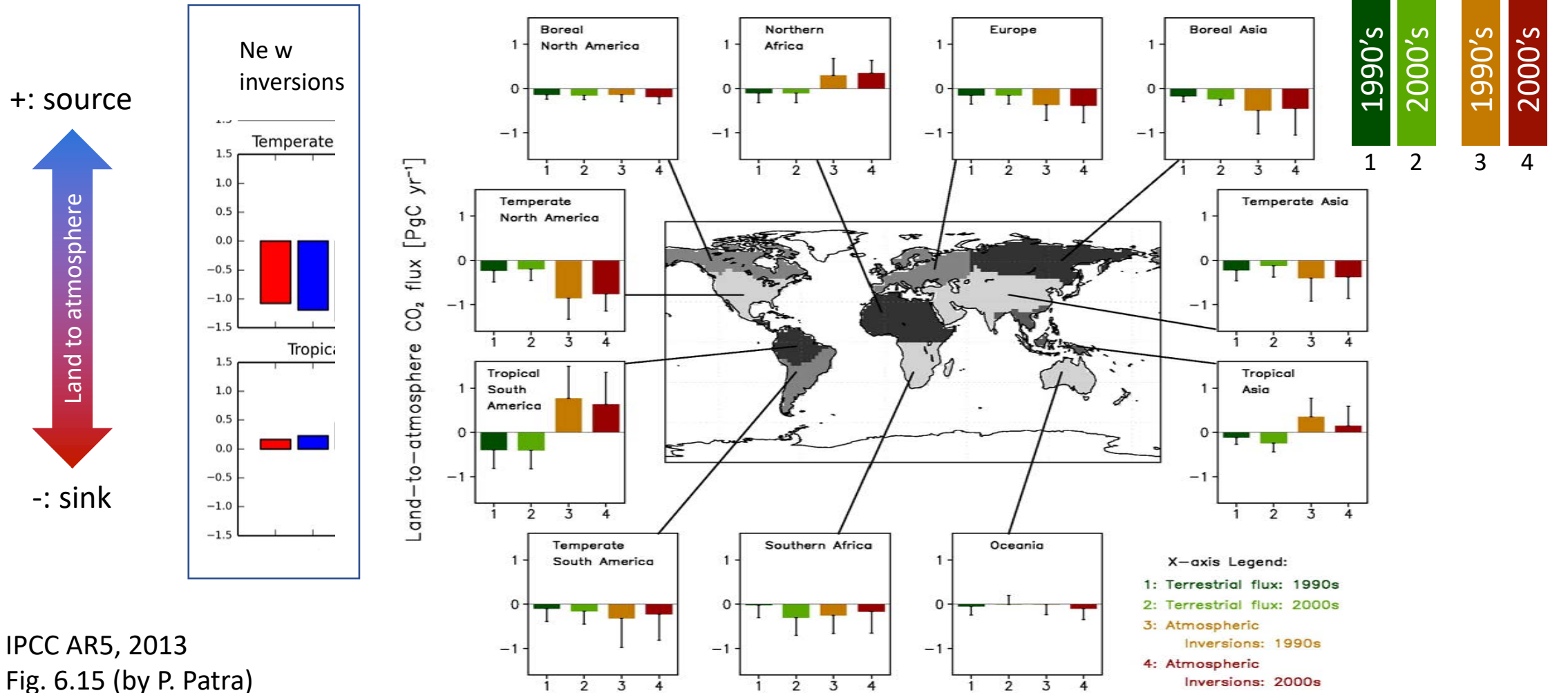
1 Tg = 10<sup>12</sup> g

# Current understanding (IPCC-2013)

## Decadal average CO<sub>2</sub> fluxes for 11 land regions

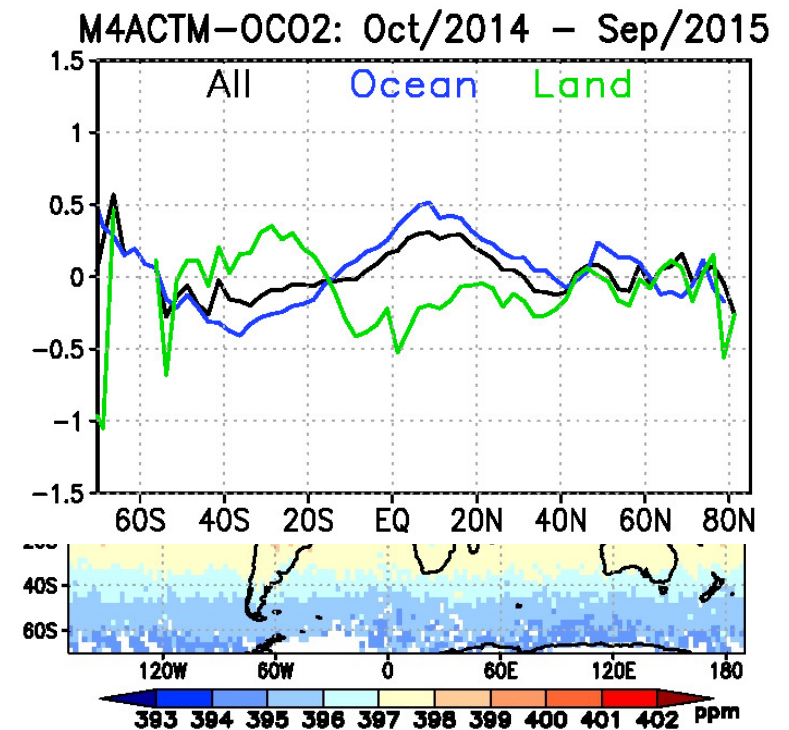
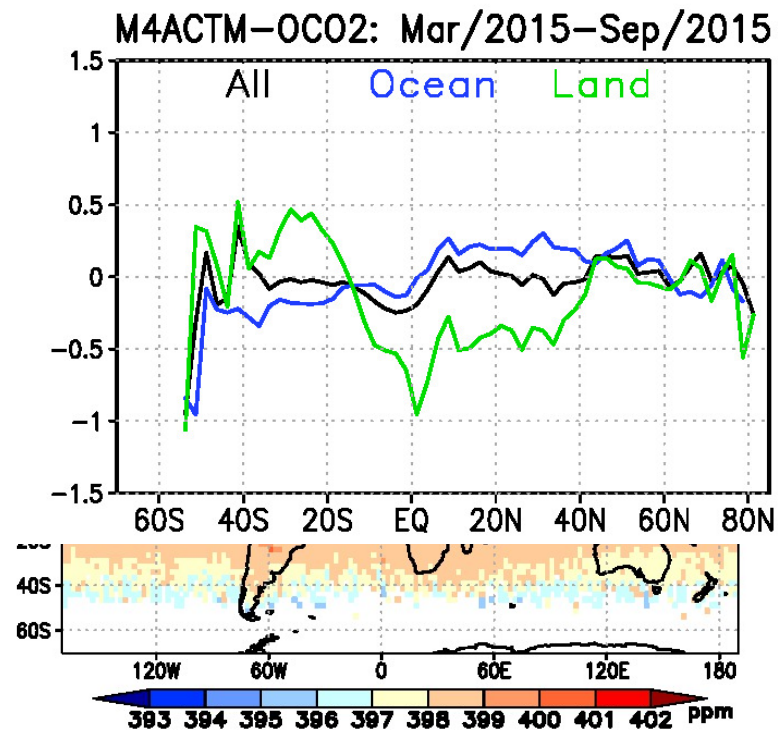
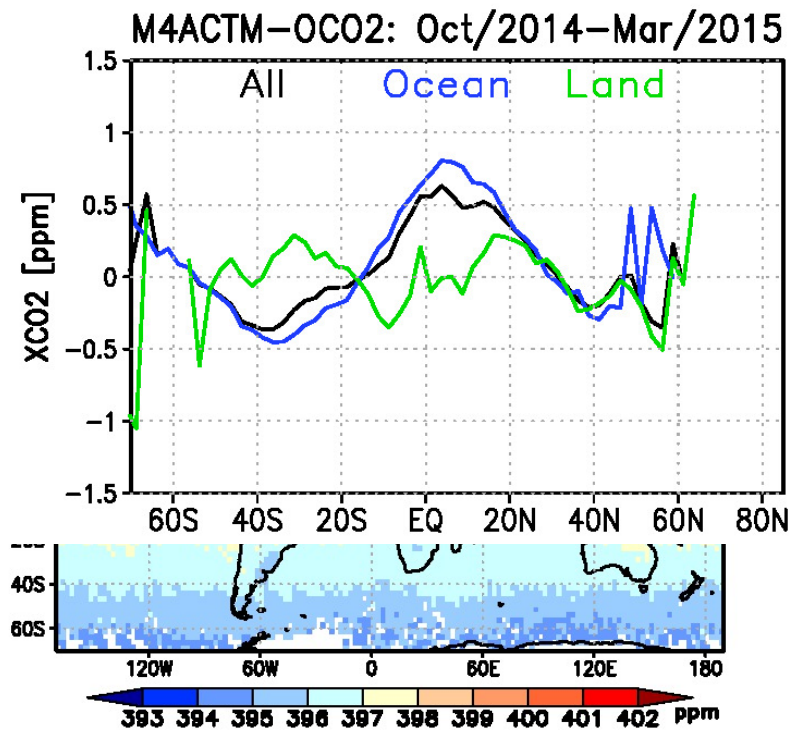
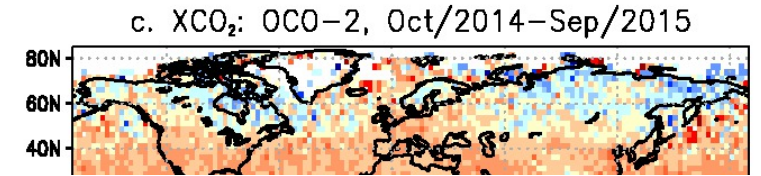
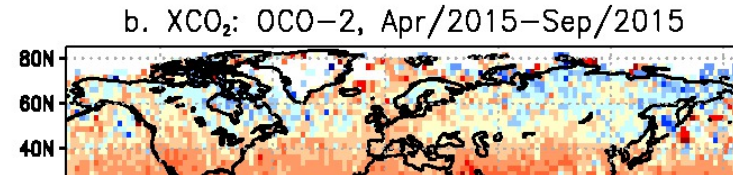
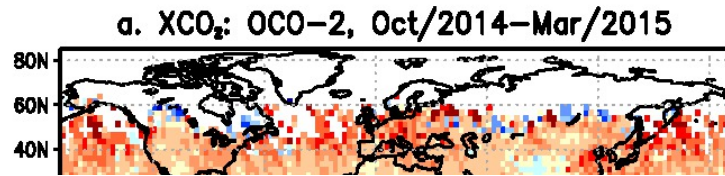
Bottom-up approach : 10 DVGMs (TRENDY)

Top-down approach : 10 atmos. Inversions (TransCom)



IPCC AR5, 2013  
Fig. 6.15 (by P. Patra)

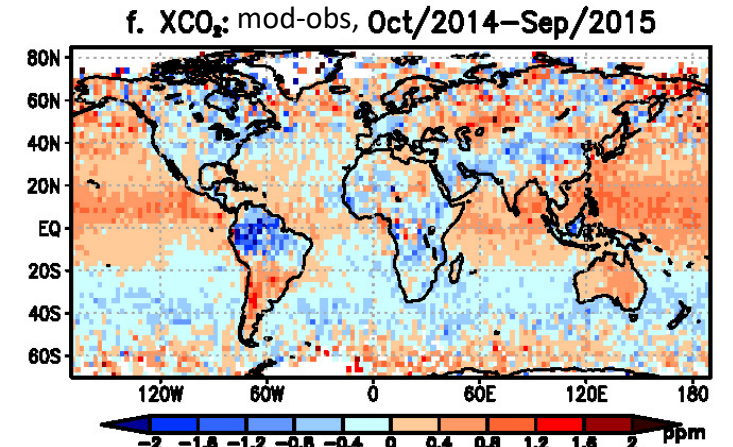
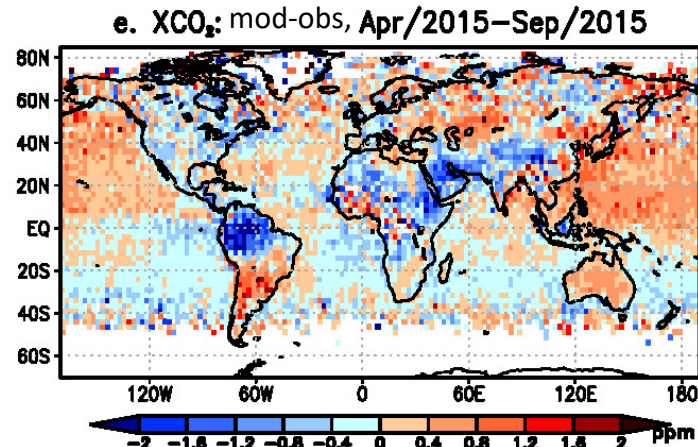
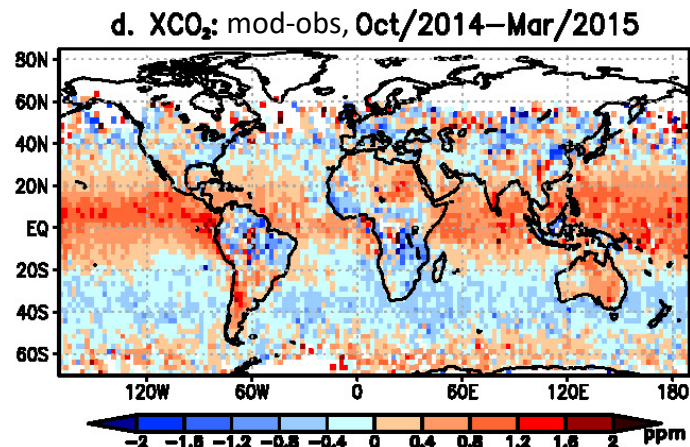
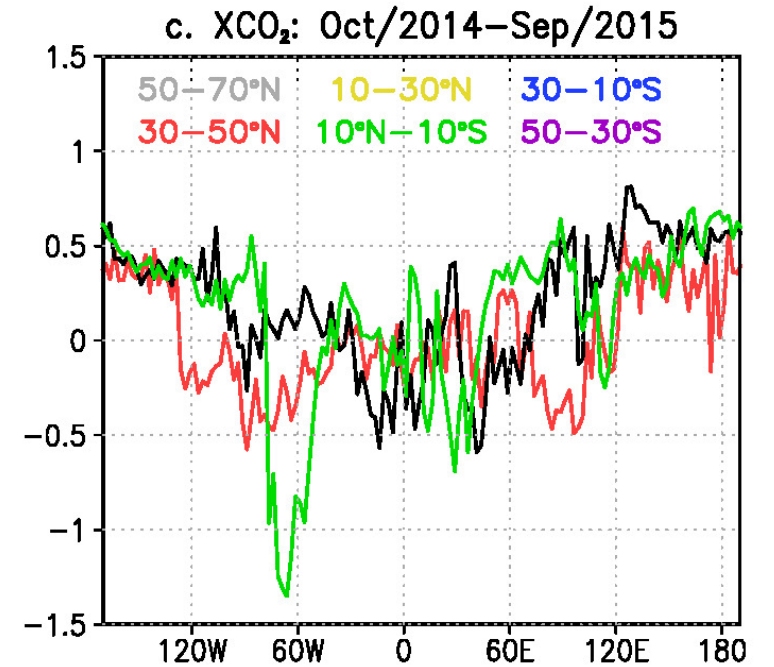
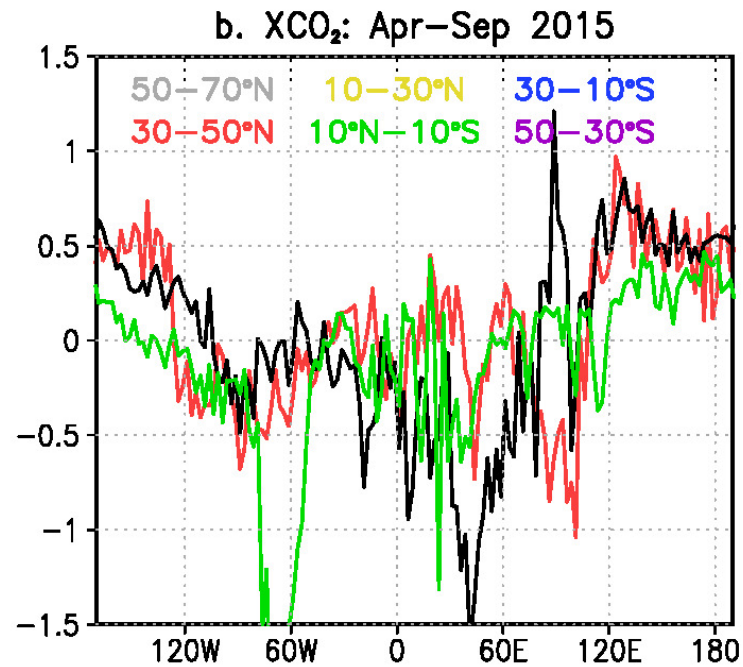
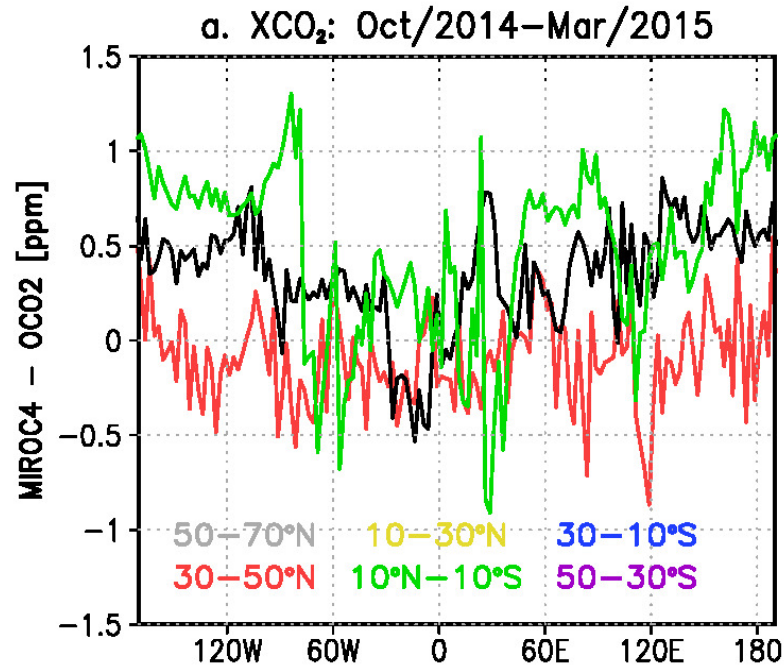
# Large increase in data coverage in satellite remote sensing era



We also achieved improved simulations of XCO<sub>2</sub> within 1 ppm by global (and regional) chemistry-transport models ....

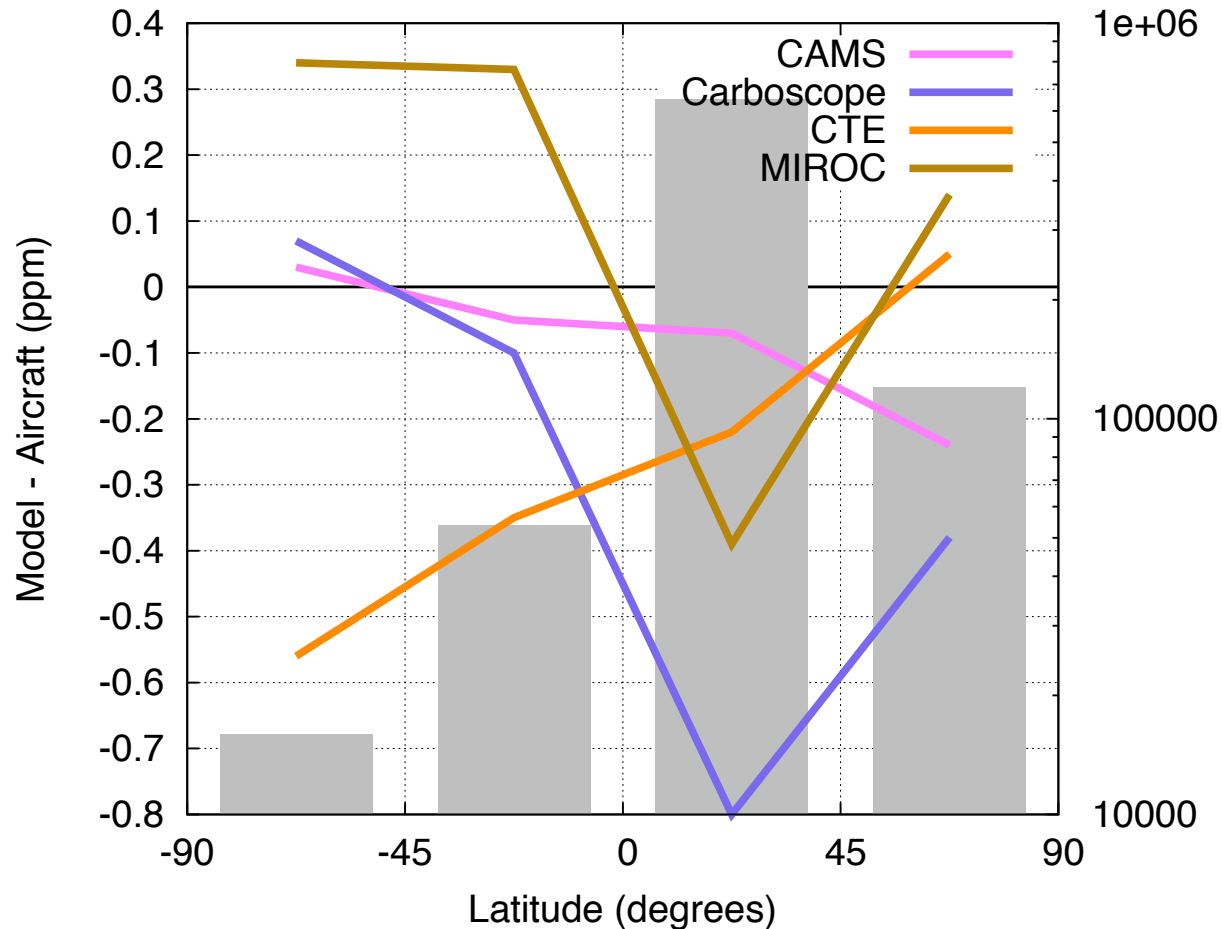


# Zonal gradients for latitude band: Is North America sink overestimated?



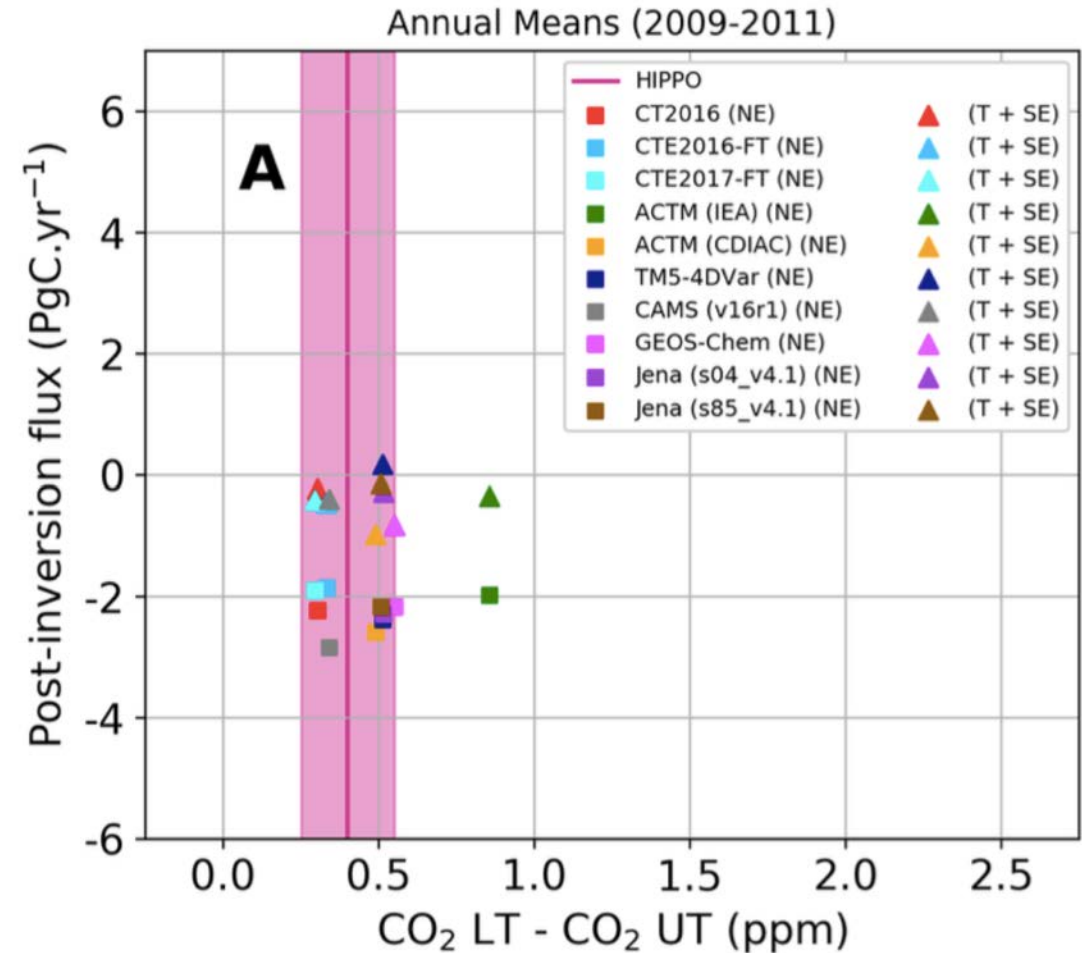
# Evaluation of inversion fluxes using aircraft data

Example for the 2008-2016 period (includes CONTRAIL)



GCB2018, Le Quéré et al., ESSD, in review, 2018

Example using HIPPO  
(Key results from Saeki & Patra, 2017 are endorsed)

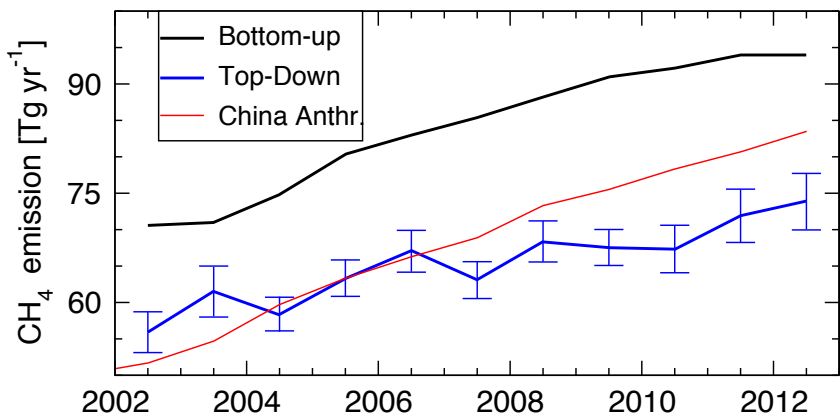


TransCom like, Gaubert et al. BG, in review, 2018

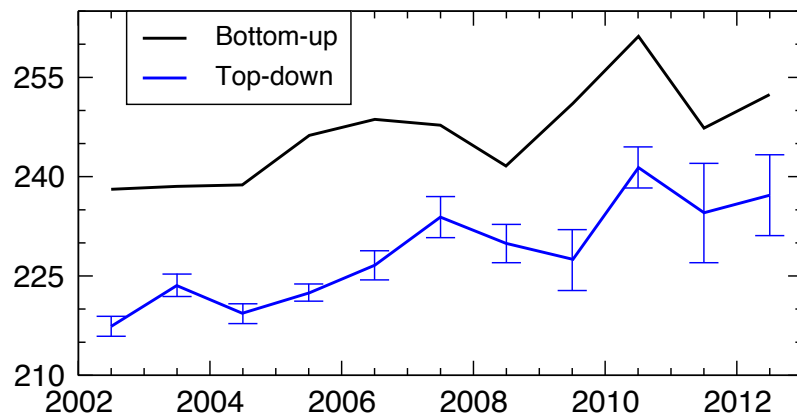
# CH<sub>4</sub> INVERSION RESULTS

# CH<sub>4</sub> emission trends and variability: Validation using Tohoku Univ. data over Sendai

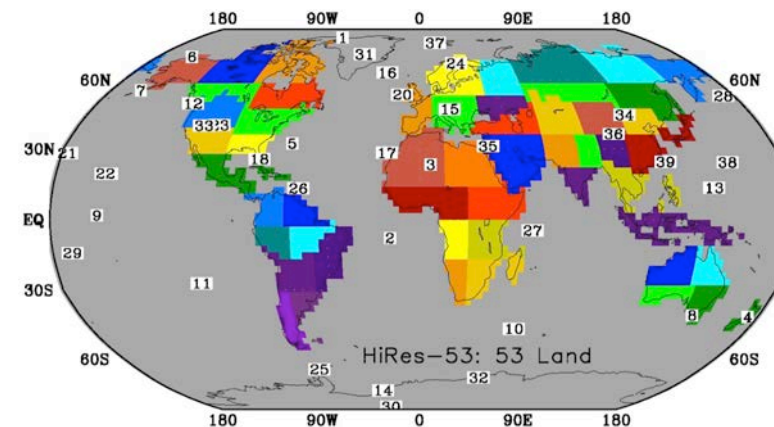
East Asia (China, Japan, Korea)



Tropical Land (Africa, America, Asia)

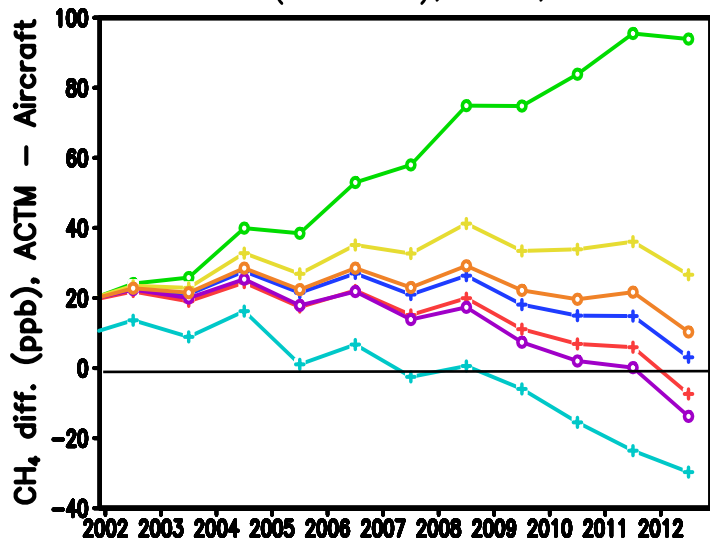


Patra et al., JMSJ, 2016

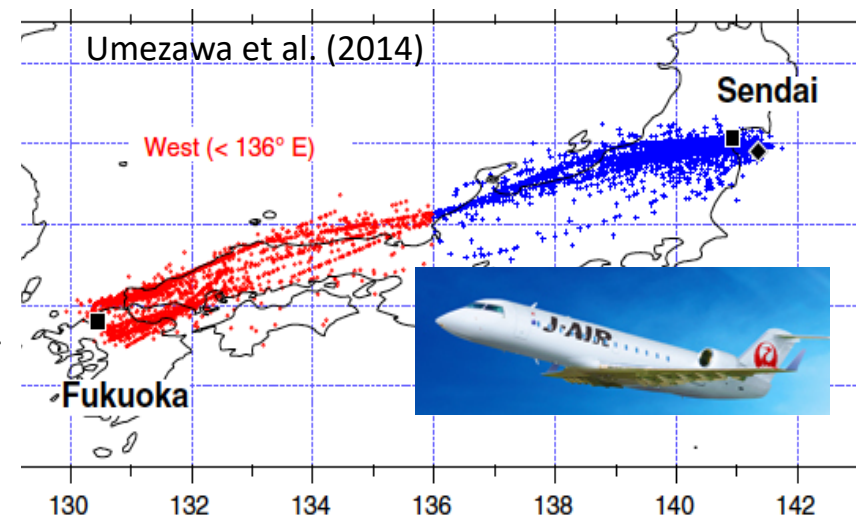
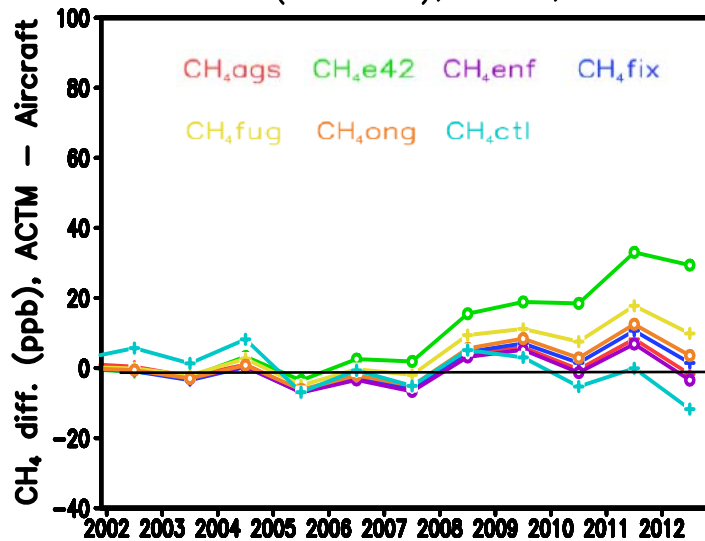


3-5%/yr increase in CH<sub>4</sub> emission of East Asian emission; about half of the prior

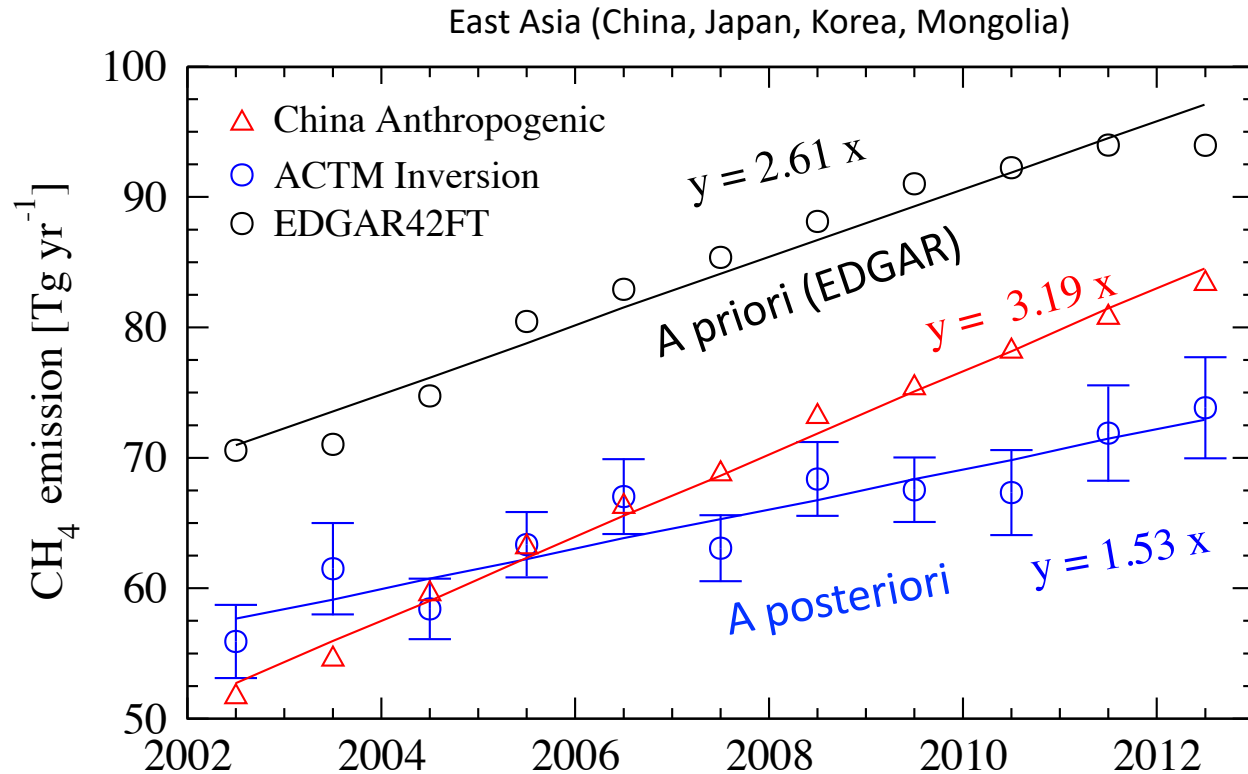
a. Sendai (0–2 km); Prior; Ann mean



b. Sendai (0–2 km); Poste; Ann mean



# CH<sub>4</sub> inversion: application to anthropogenic CO<sub>2</sub> emission



**China** alone drives the East Asian emission increase. Mostly from coal industry.

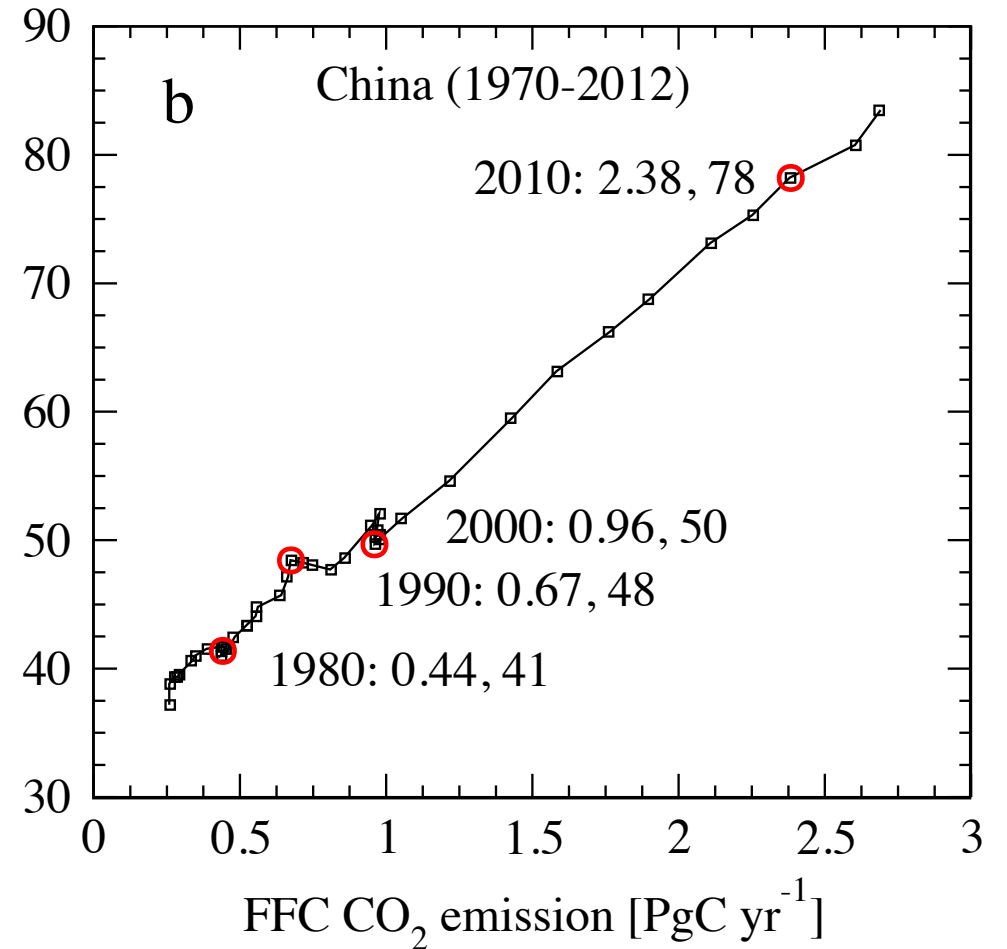
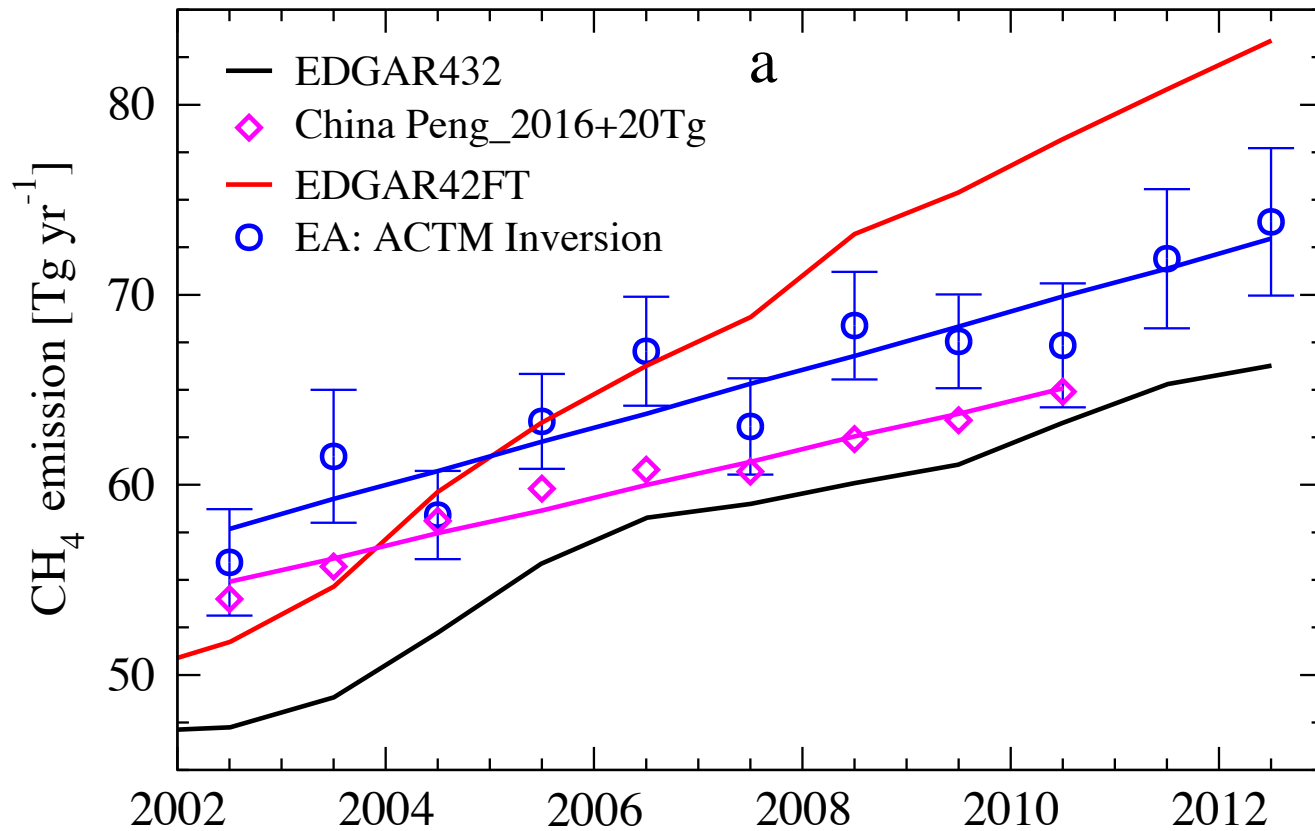
Increase rate of **inverted CH<sub>4</sub> emissions** are 22% (9 Tg) lower than that of **EDGAR2012FT inventory**

**Ratio of slopes**  
**1.53/2.61 = 0.59**

We estimated a scaling factor of **0.59** to FFC CO<sub>2</sub> emission “increase rate” for the period 2003-2014, relative to the emissions for 2002 from the inventory emissions.

# Updates in China CH<sub>4</sub> emission: perspective for FF CO<sub>2</sub> emission

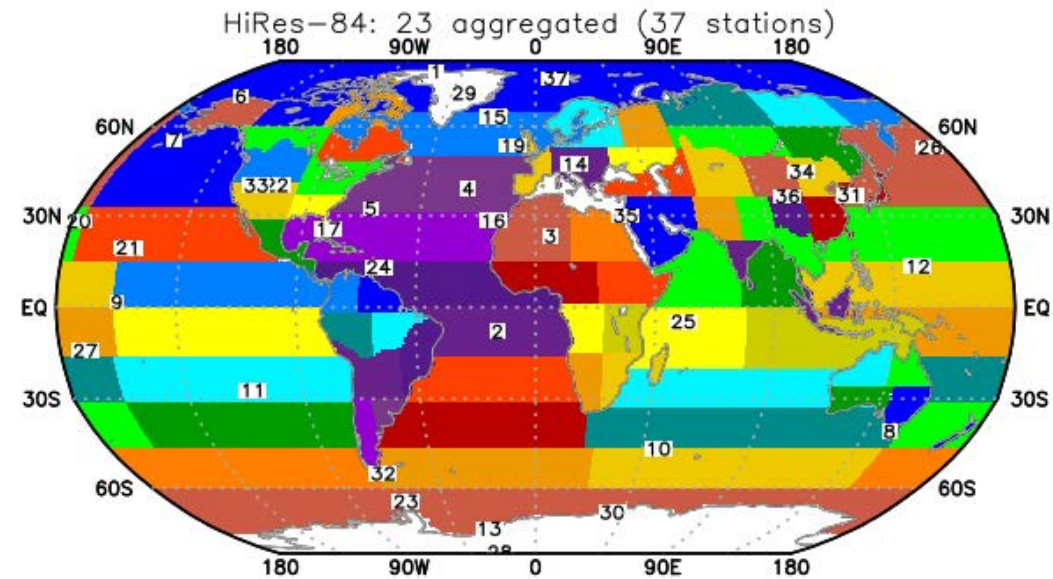
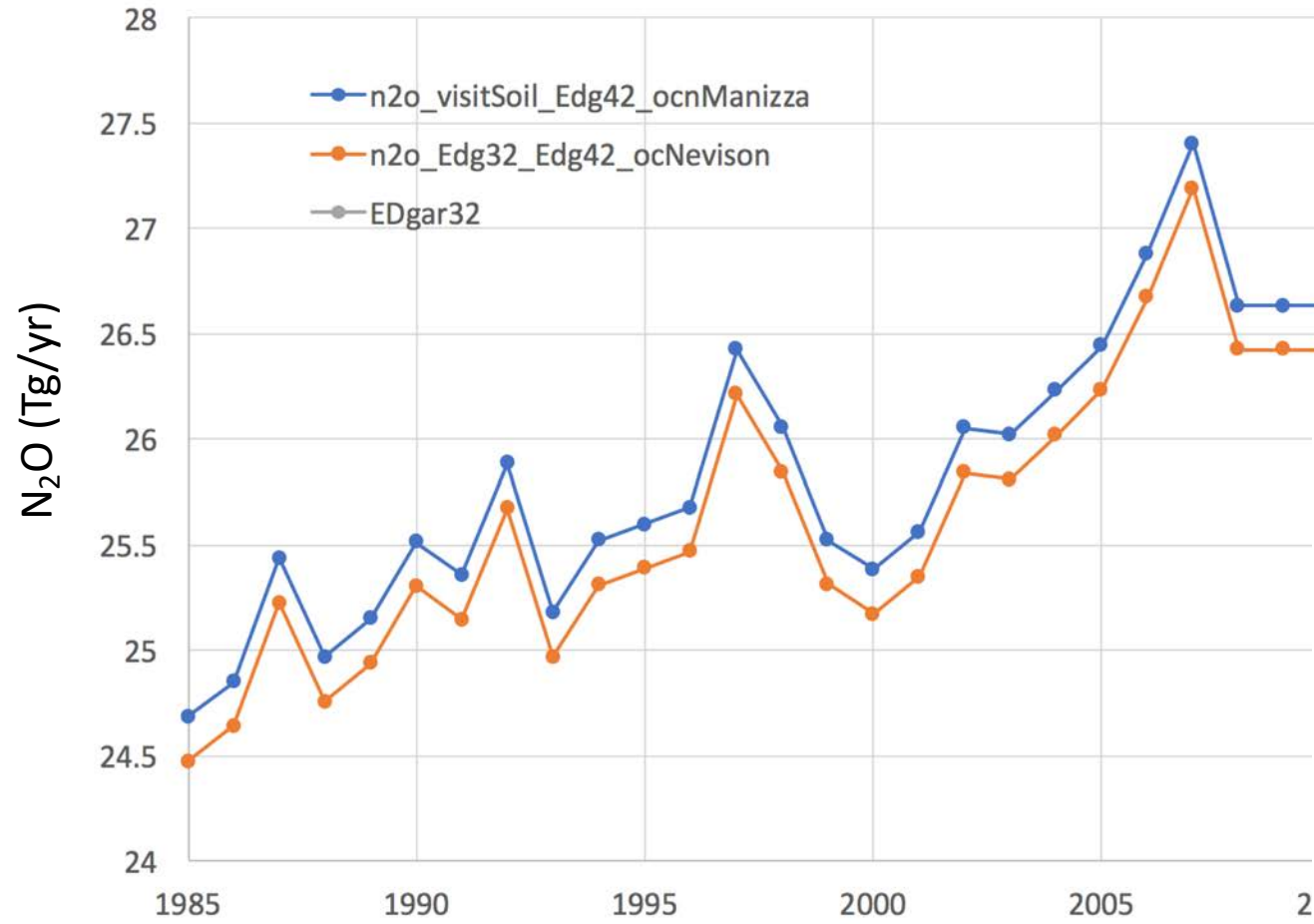
Patra et al., 2016; Peng et al., 2016; Janssen-Maenhout et al., 2017



We recommend a scaling factor to FFC CO<sub>2</sub> emission “increase rate”, based on CH<sub>4</sub> inversion results

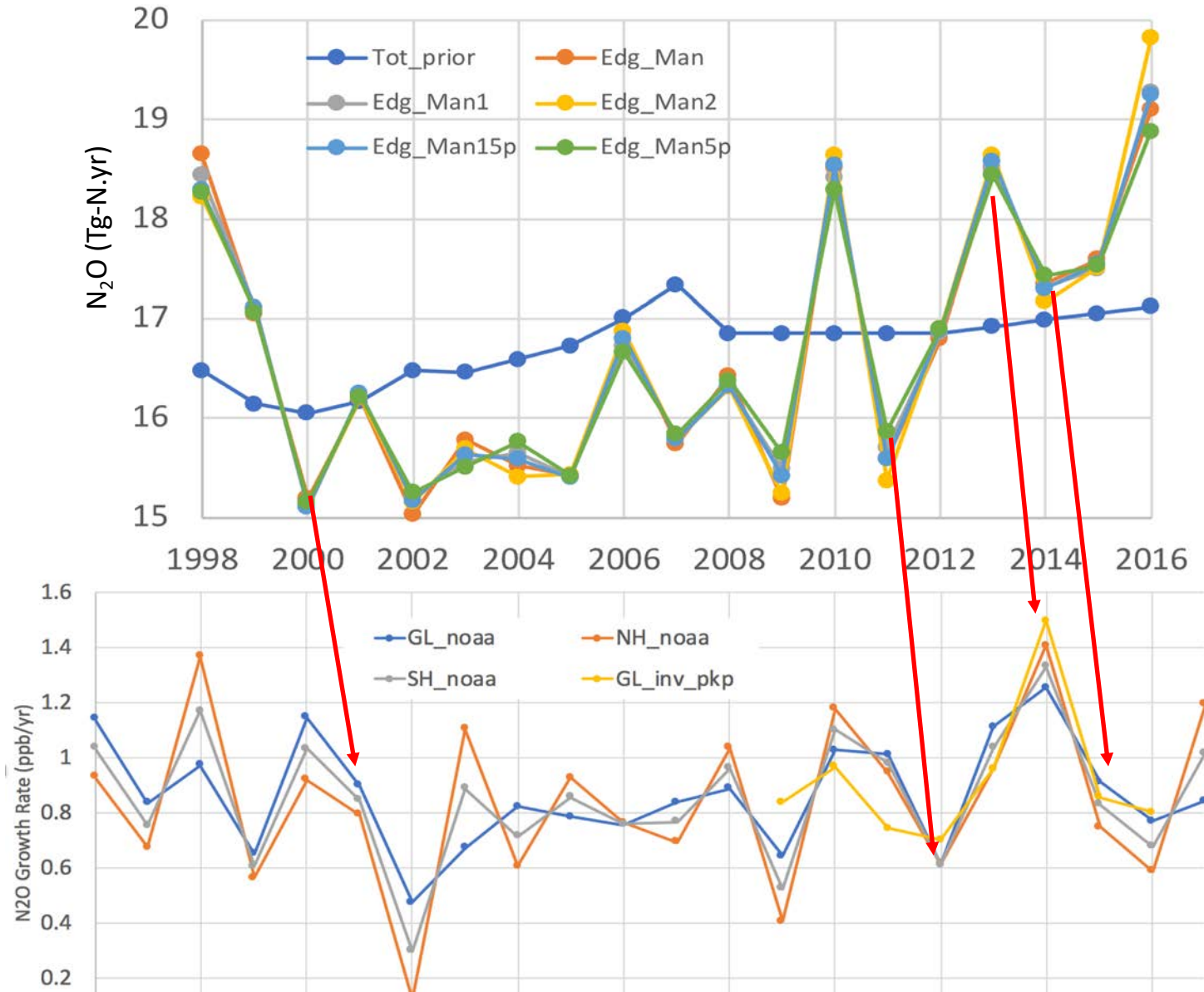
# N2O INVERSION RESULTS

# Modelling N<sub>2</sub>O: emissions using EDGARv42FT, Soil (2), Ocean (2)





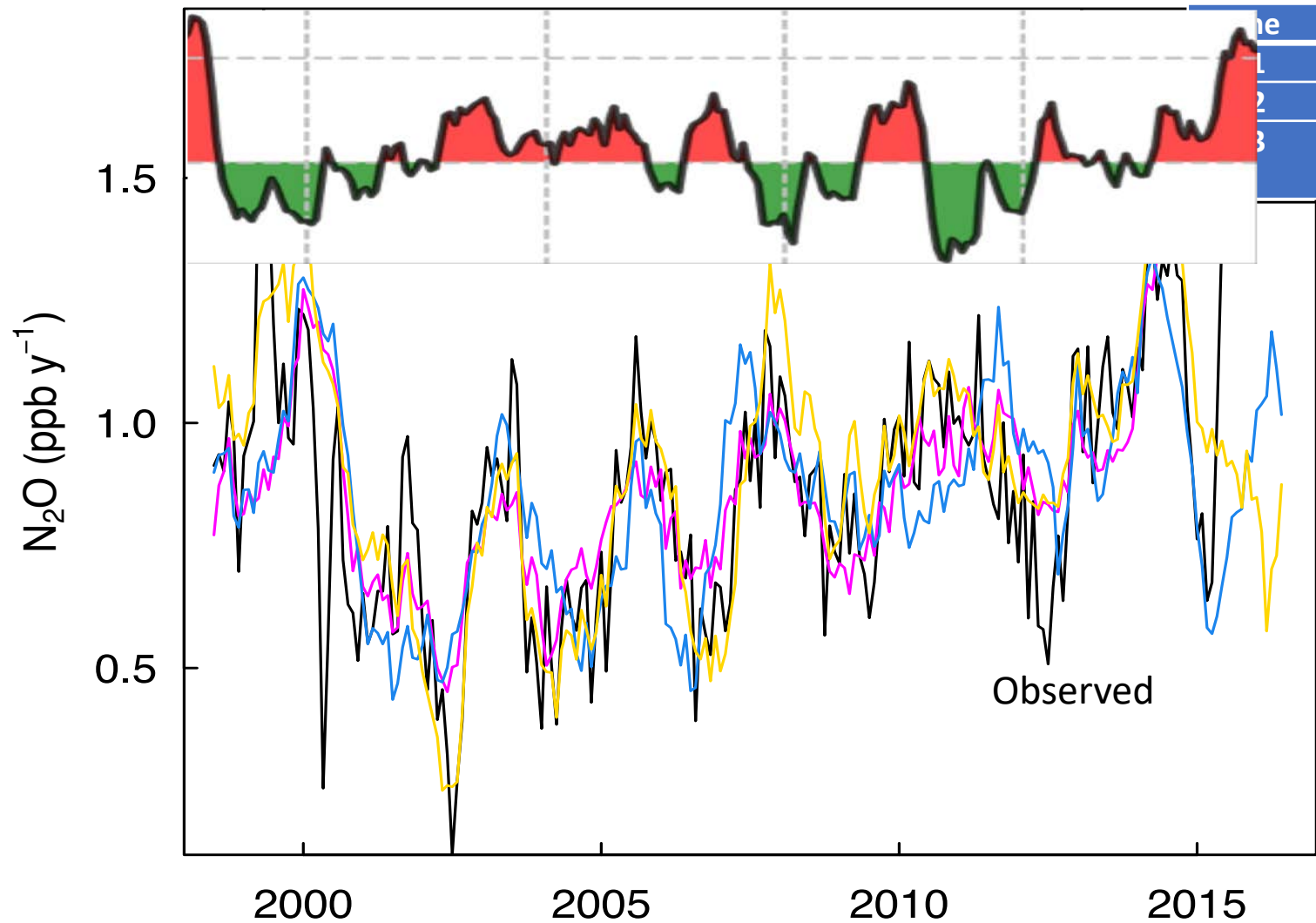
# N<sub>2</sub>O inversion fluxes (RGO) in comparison with the prior (blue)



Interesting differences between emission variabilities and concentration growth rates (due to the effects of transport in troposphere and the stratosphere-troposphere exchange)

N<sub>2</sub>O growth rate plot by:  
Kentaro Ishijima

# Atmospheric N<sub>2</sub>O growth rates, compared between GCP inversions



Model	ACTM	Method	Resolution
1	TOMCAT	4D-Var	5.625°×5.625°
2	LMDz5	4D-Var	3.75°×1.875°
3	MIROC4- ACTM	Bayesian analytical	84 regions

## Key conclusions (1998 – 2017):

- Our inversion using MIROC4-ACTM works well, when compared to other inversions
- The concentration IAVs are apparently linked to ENSO, but in opposite phase as that of CO<sub>2</sub> and CH<sub>4</sub>??
  - High growth rate in the La Nina years
- Role of stratosphere-troposphere exchange (STE) is unclear??

# Conclusions

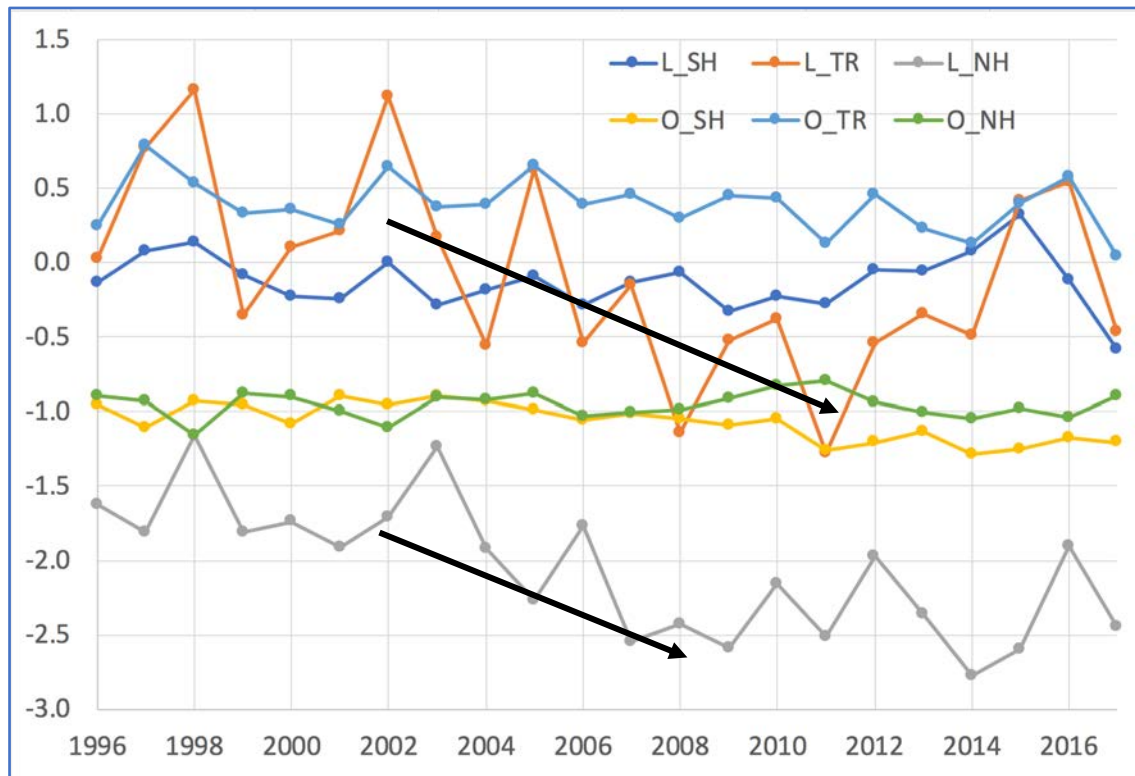
- Investment in developing the model physics is key to interpret the atmospheric concentration measurements
- It is encouraging that the 40+ sites and model can simulate the global XCO<sub>2</sub> data, generally within the observational uncertainty
  - A data-rich era for CO<sub>2</sub> has arrived due to JAL/NIES CONTRAIL, HIPPO, GOSAT, OCO2
- CH<sub>4</sub> inversion clearly identified the problems in the China inventory emissions and a closer agreement is now achieved, but further work is needed
- Emissions of N<sub>2</sub>O from anthropogenic sector continued to increase, but the bottom-up estimations do not fully explain the observed concentration variabilities

Thank you

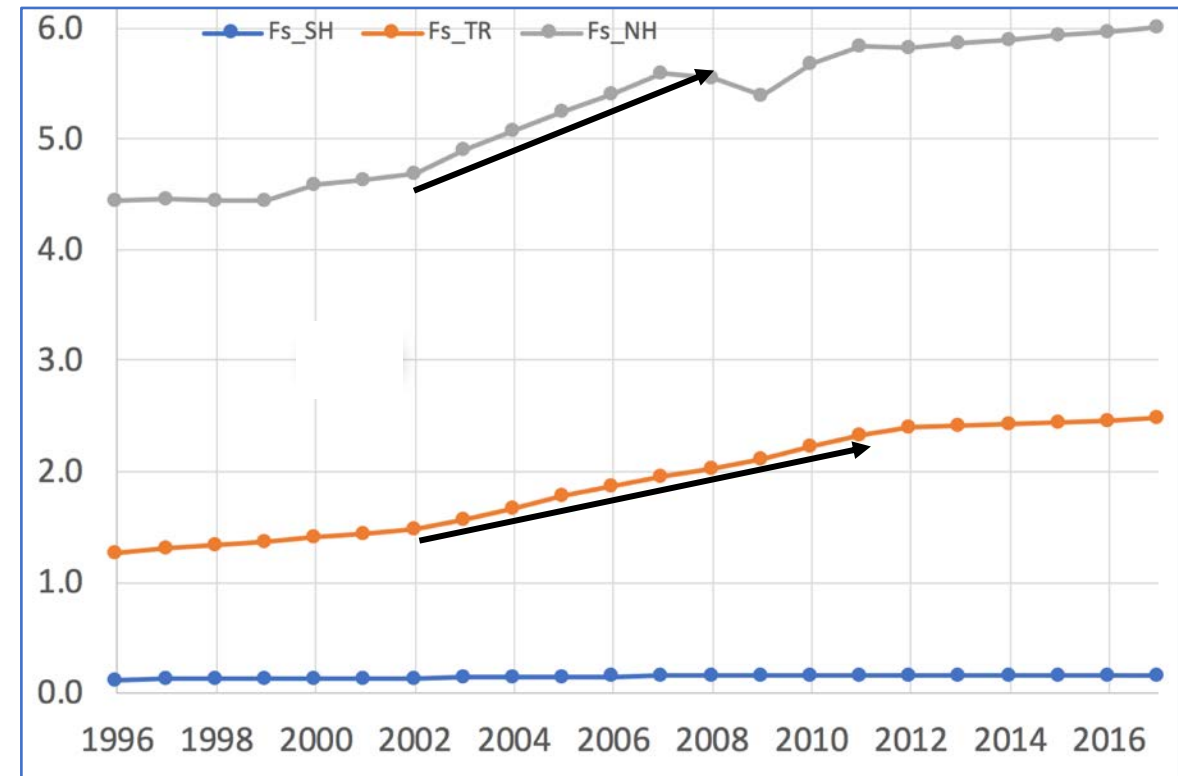
# MIROC4-ACTM inversion (TDI84\_2017) : hemispheric totals

Latitude bands: SH > 30S; 30S > TR < 30N; NH > 30N

### Land and ocean fluxes (Pg/C) for NH, TR and SH

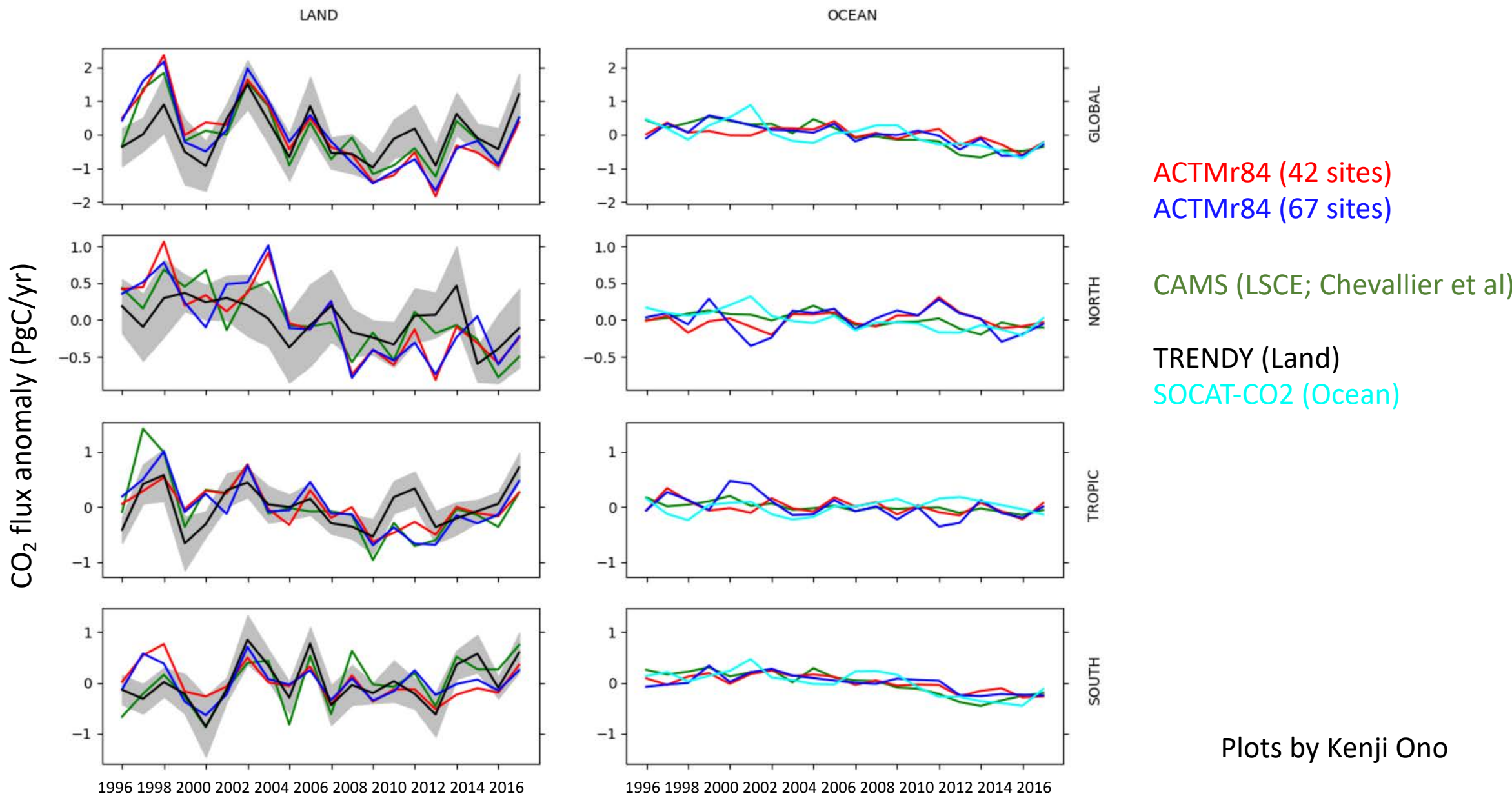


### Fossil-fuel emissions (Pg/C) for NH, TR and SH



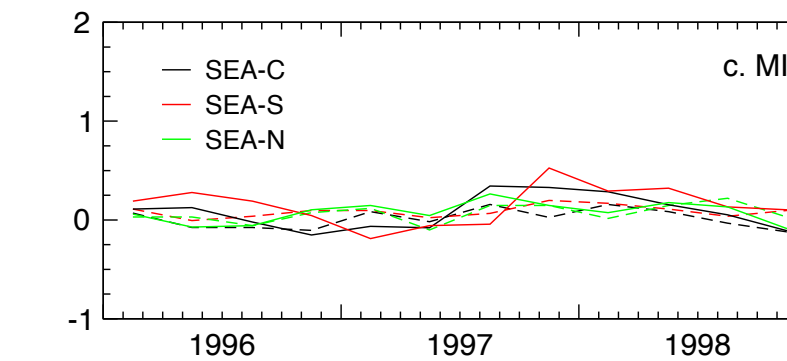
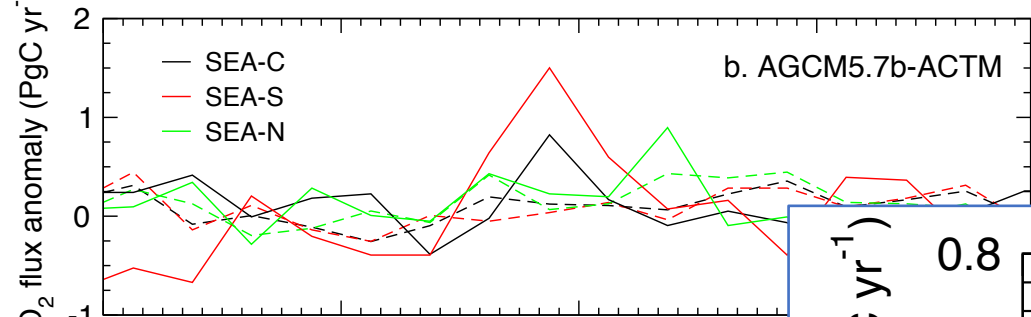
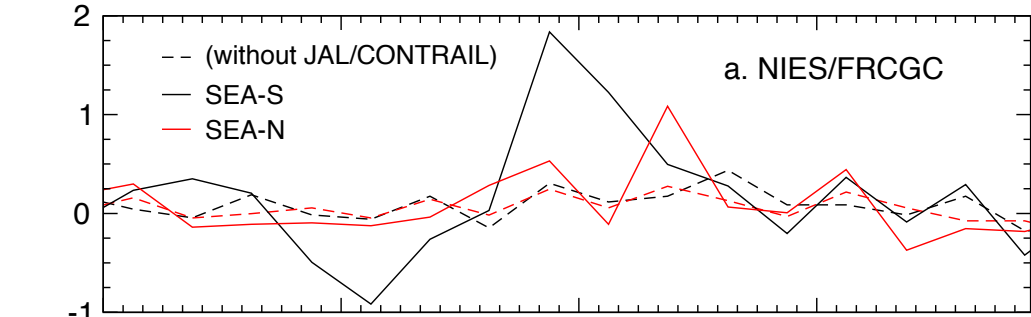
To be further analysed by GCP-CO<sub>2</sub>, Budget 2018

# MIROC4-ACTM inversion (TDI84\_2017) : hemispheric totals

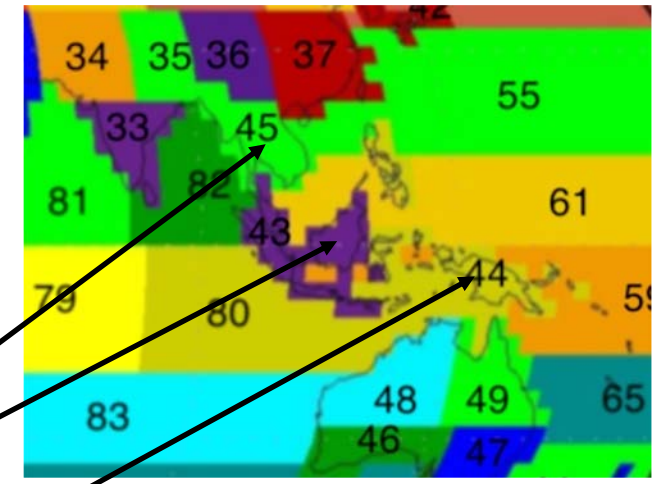


Plots by Kenji Ono

# Evolution of JAMSTEC's inversion (2003-2018) : the cases of El Ninos



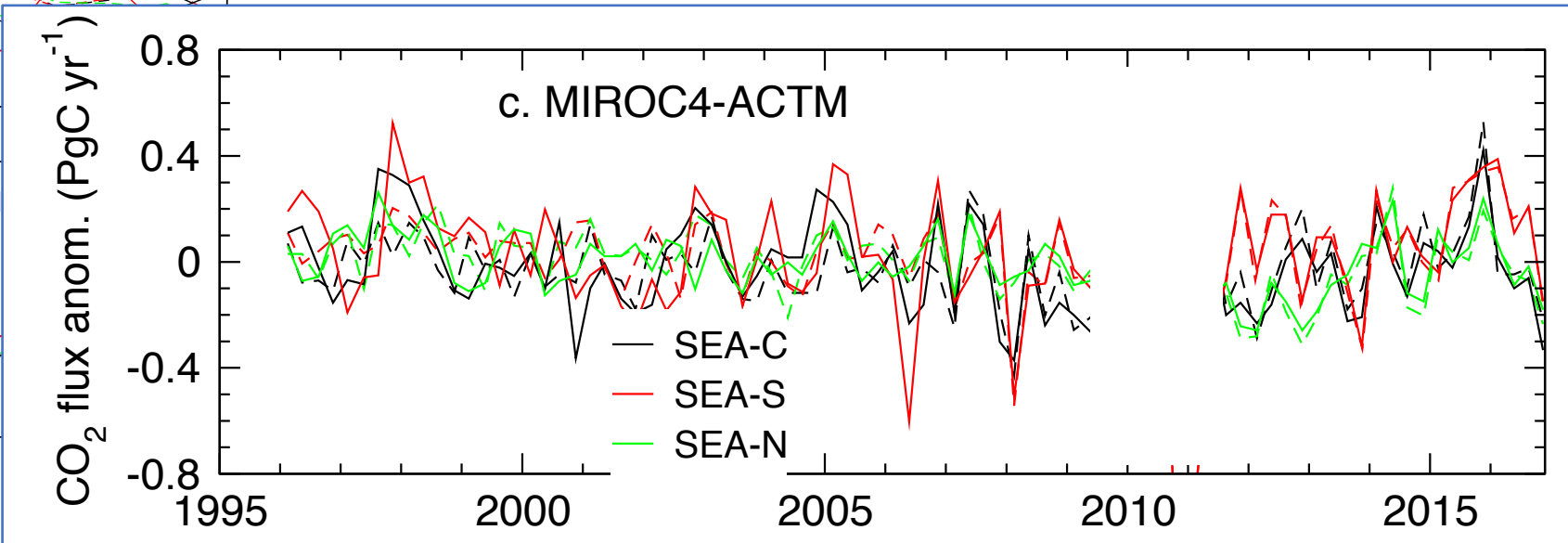
Broken line (surface only)  
Solid line (Surface+CONTRAIL)



**SEA-N : #45 (Continental)**

**SEA-C : #43 (Polynesian)**

**SEA-S : #44 (Papua New Guinea)**



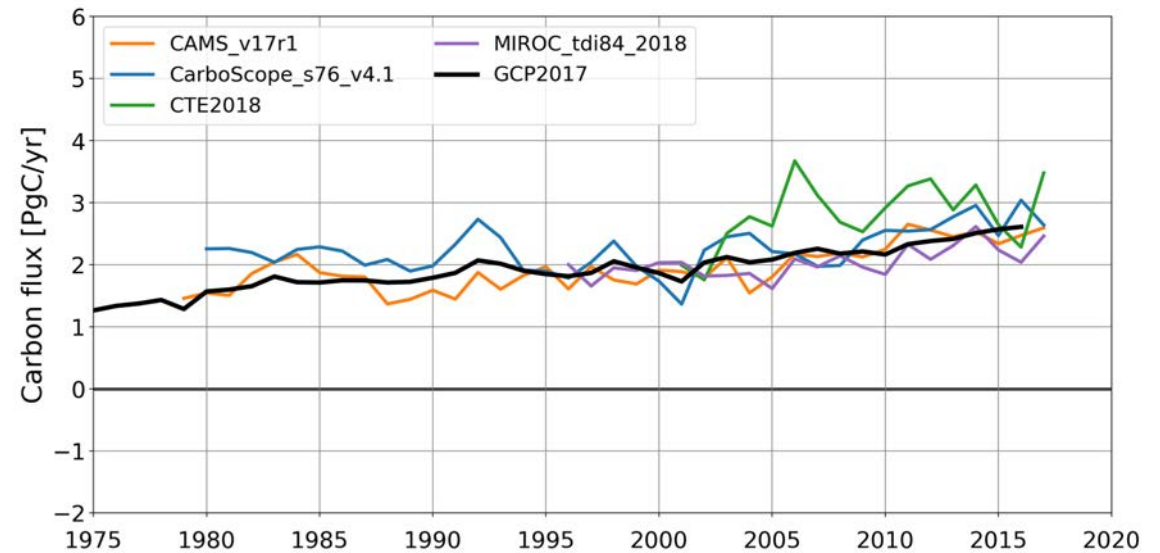
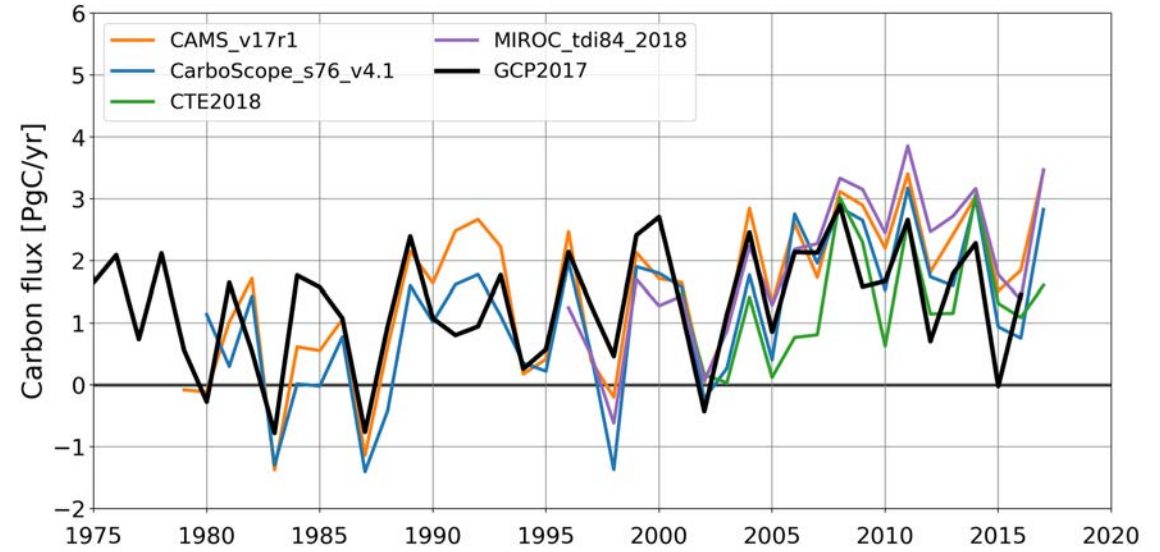
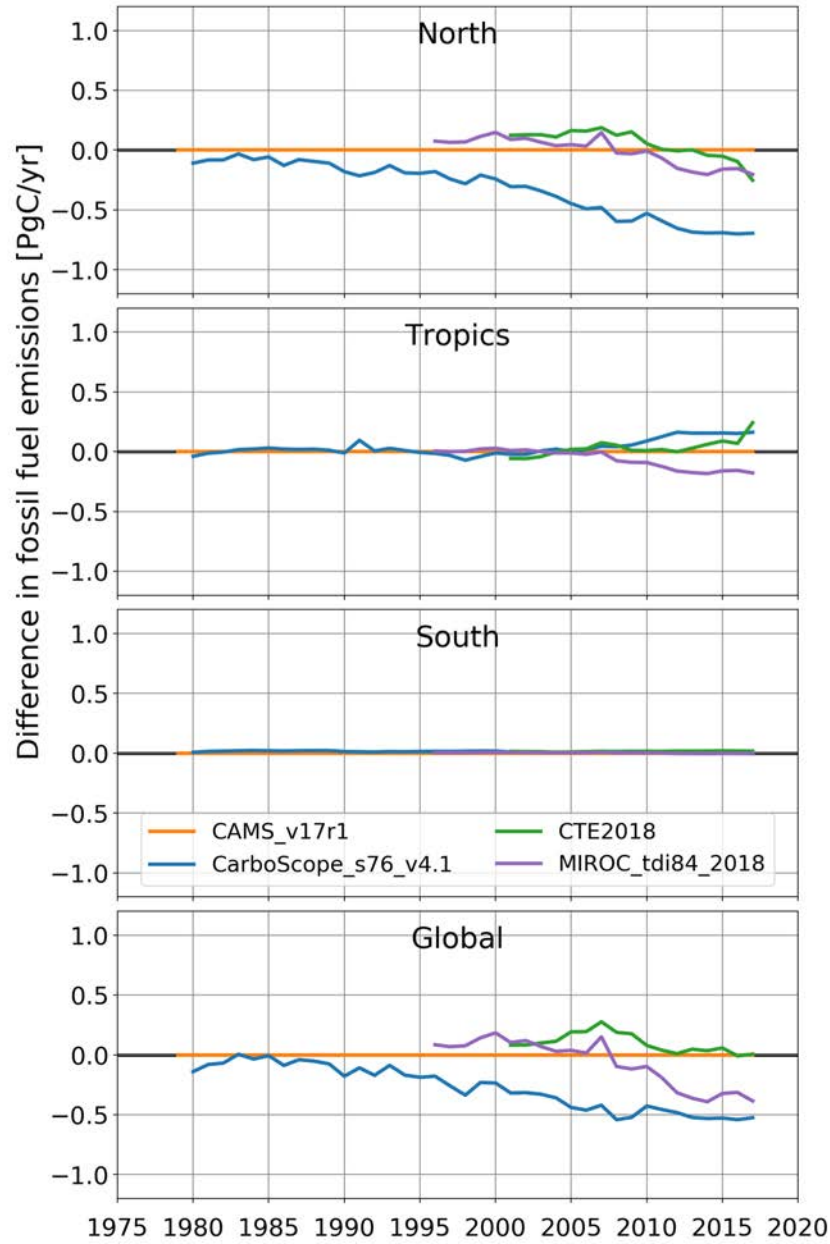
# Global carbon budget 2018: inversions

	CAMS	CarboScope	CTE	MIROC
Time period	1979-2017	1980-2017	2001-2017	1996-2017
Transport	LMDZ v5A	TM3	TM5	MIROC4-ACTM
Meteorology	ECMWF	NCEP	ECMWF	JRA55
Resolution (degrees)	Glb3.75x1.875	Glb4x5	Glb3x2, eur1x1, nam1x1	Glb2.8x2.8
Fossil fuels	EDGAR scaled to CDIAC	CDIAC	EDGAR+IER, scaled to CDIAC	EDGARv432
Biosphere and fires	ORCHIDEE (clim)+GFEDv4+GFAS	Zero	SiBCASA-GFED4	CASA (climatological)
Ocean	Landschützer et al. (2015)	pCO <sub>2</sub> based product oc_v1.6 (Rödenbeck et al. 2014)	Jacobson et al. (2007) Ocean Inversion Fluxes (OIF)	Takahashi et al. (2009)
Observations	Daily averages well-mixed cond. GVP3.2, NRT4.2, WDGCC, RAMCES, ICOS	Flask and hourly	Hourly resolution well-mixed cond. GVP3.2, NRT4.2.	Flask and continuous, GVP3.2, GVP4.0
Optimization	Variational	Conjugate Gradient (re-ortho-normalization)	Ensemble Kalman Filter	Matrix method, 84 regions



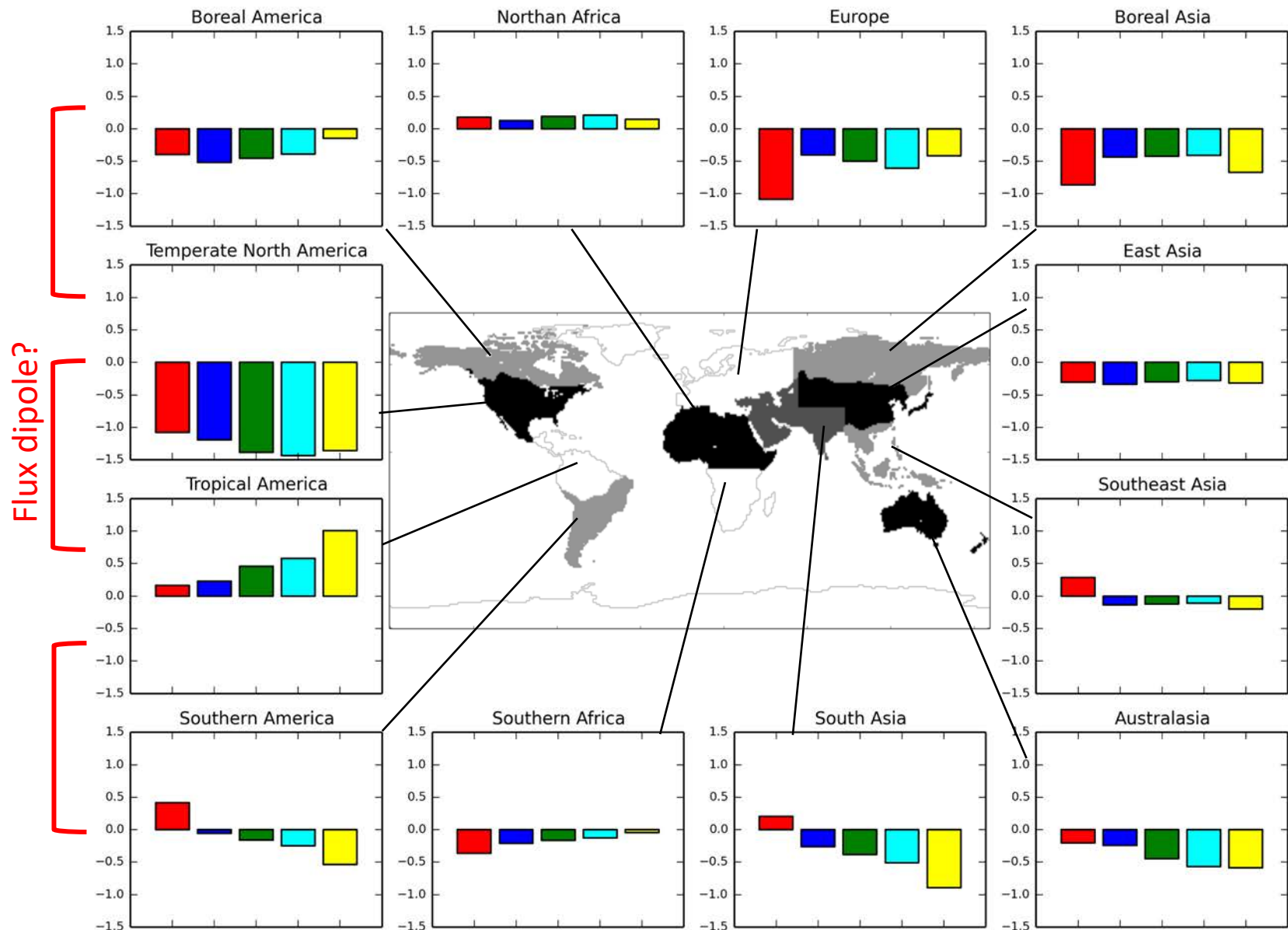
# Global carbon budget 2018: inversions

van der Laan-Luijkx et al.



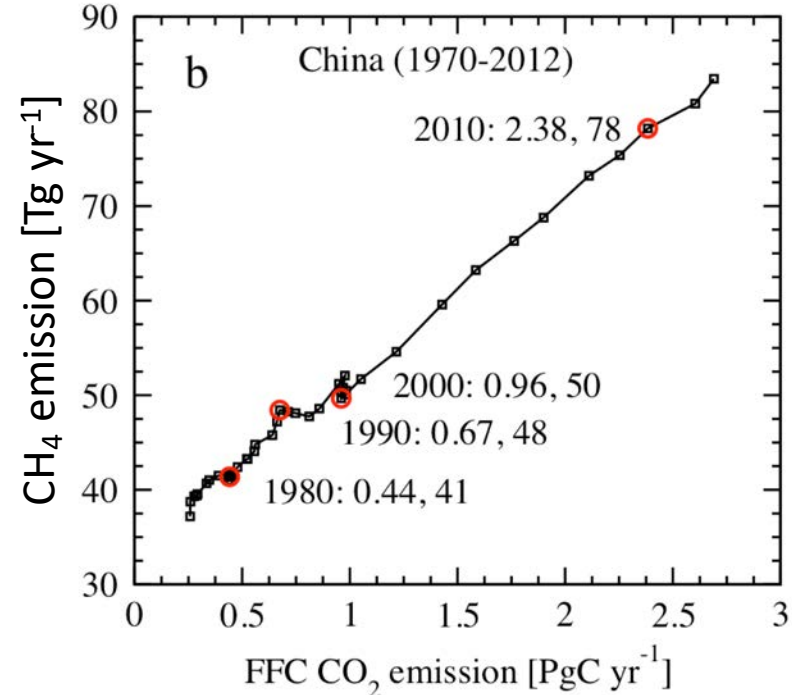
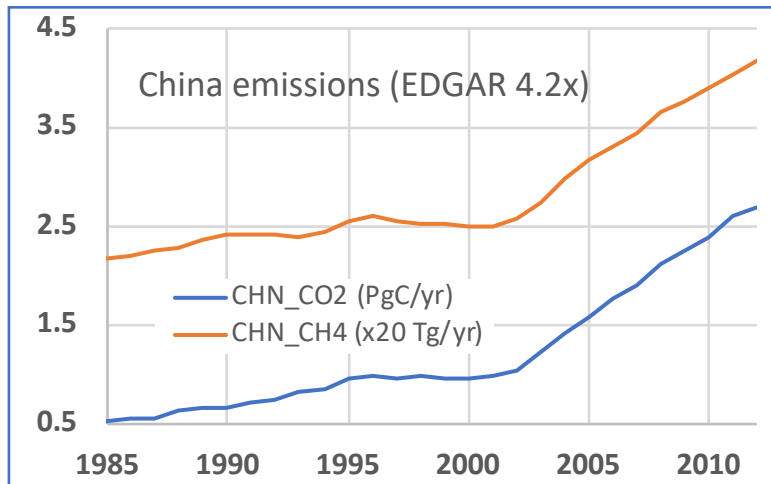
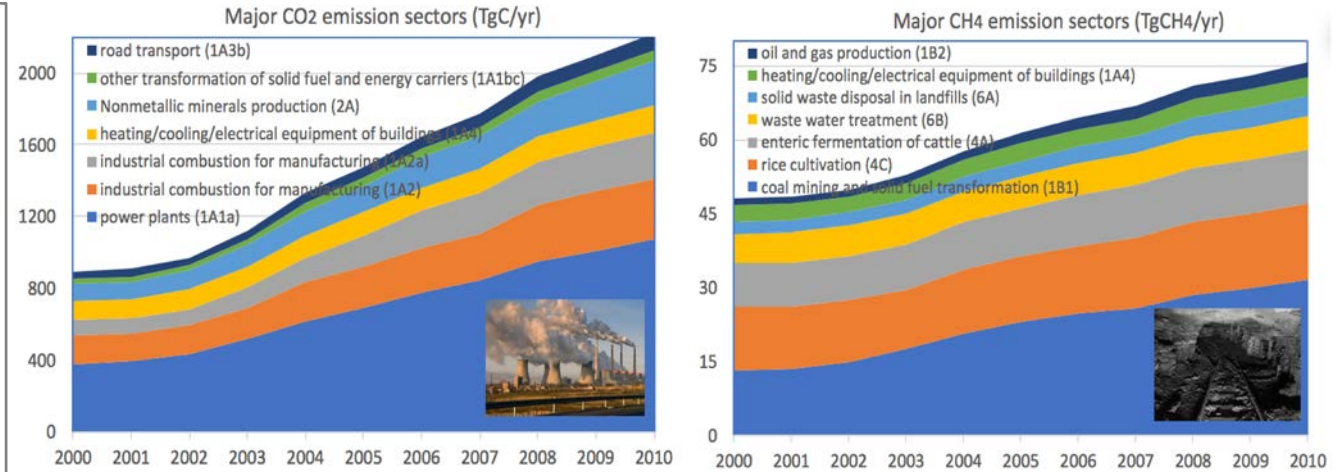
Land regions:  
MIROC4-ACTM  
sensitivity runs (for  
varying a priori  
uncertainty)  
compared with  
LSCE inversion

Control (L=1.0, O=0.5 PgC )  
HiLnd (L=2.0, O=0.5 PgC )  
HiOcn (L=2.0, O=1.0 PgC )  
CONTRAIL (L=1.0Pg, O=0.5 )



# CO<sub>2</sub> and CH<sub>4</sub> emission (covariation)

- A good linearity between anthropogenic emission inventories of CO<sub>2</sub> and CH<sub>4</sub> over the period of 1970s - 2012 (EDGAR4.x)
- The main driver for CO<sub>2</sub> and CH<sub>4</sub> emission increases is the coal mining and burning in China
- Linearity arises from the constant emission factors used for each of the emission processes ??



# Notes

- Ms. Naoko Okamura, MEXT
- Mr. Takashi Matsuo, ADB – established in 1966, 20 b\$
- Special session 1: Cross over issues of Data sharing, AO-DataCube (TG10 & TG11), User engagement and communication (TG12)
  - Qinhuo Liu (RADI, CAS)