

# Detecting carbon cycle change using an integrated observation, modeling and analysis system

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# Background and Needs

## Background:

- High uncertainty still remains in global & regional C-budget due to **limited spatial coverage in the observation** and uncertainty in models
- **Next-generation GHGs observing and analysis system** is needed by combining **satellite, aircraft, ship, and ground based** observations and **improved data assimilation systems** for better estimation of C source/sink to evaluate mitigation and adaptation policies.

## Focus of this presentation:

- **Multiple approaches** including different types of **top-down models and bottom-up upscaling techniques** contributed to designate uncertainties in the estimates of large emissions
- **Detection of any changes** that might be **appearing in Asia** under changing climate and society

# Background and Needs

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Reinforced aircraft observation in Asia

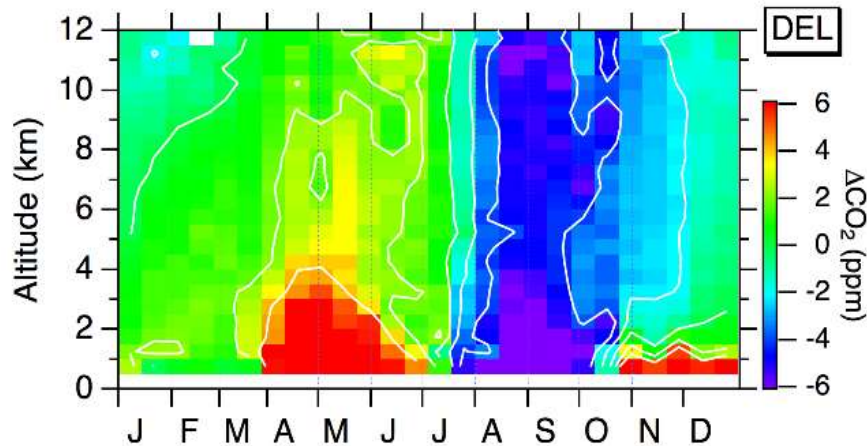
Next generation data assimilation system

## Focus of this presentation:

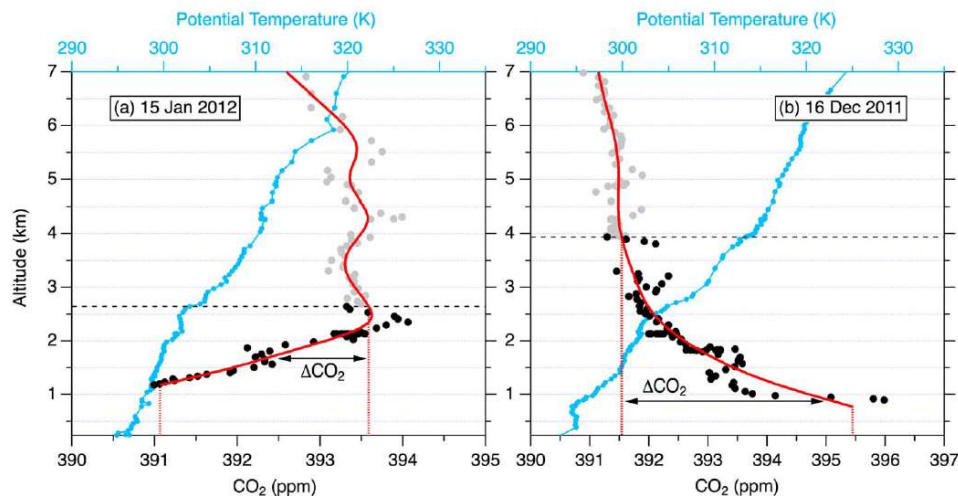
- **Multiple approaches** including different **models and bottom-up upscaling techniques** to designate uncertainties in the estimates
- **Detection of any changes** that might be **appearing in Asia** under changing climate and society

Multiple approaches to detect C-Cycle changes in Asia

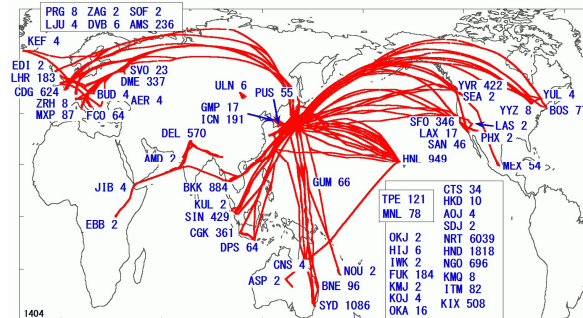
# Detailed signals from terrestrial CO<sub>2</sub> flux detected by frequent CO<sub>2</sub> observations over Asia by CONTRAIL (NIES, MRI)



Seasonal changes in the vertical structure of atmospheric CO<sub>2</sub> concentration over Delhi, India observed by CONTRAIL



<http://www.cger.nies.go.jp/contrail/>



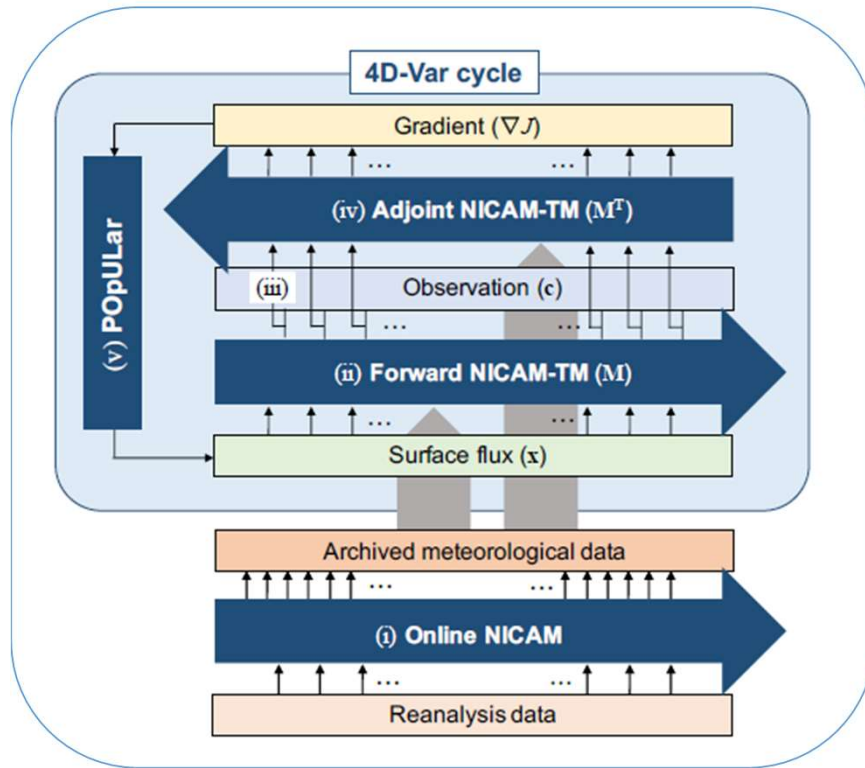
Observed CO<sub>2</sub> vertical profiles over Delhi for flights when (a) a decrease and (b) an increase toward the ground were observed. Convective boundary layer height shown as the horizontal dashed line was estimated by the profiles of potential temperature (blue lines).

(Umezawa, Niwa, Sawa, Machida, Matsueda, *GRL*, 2016)

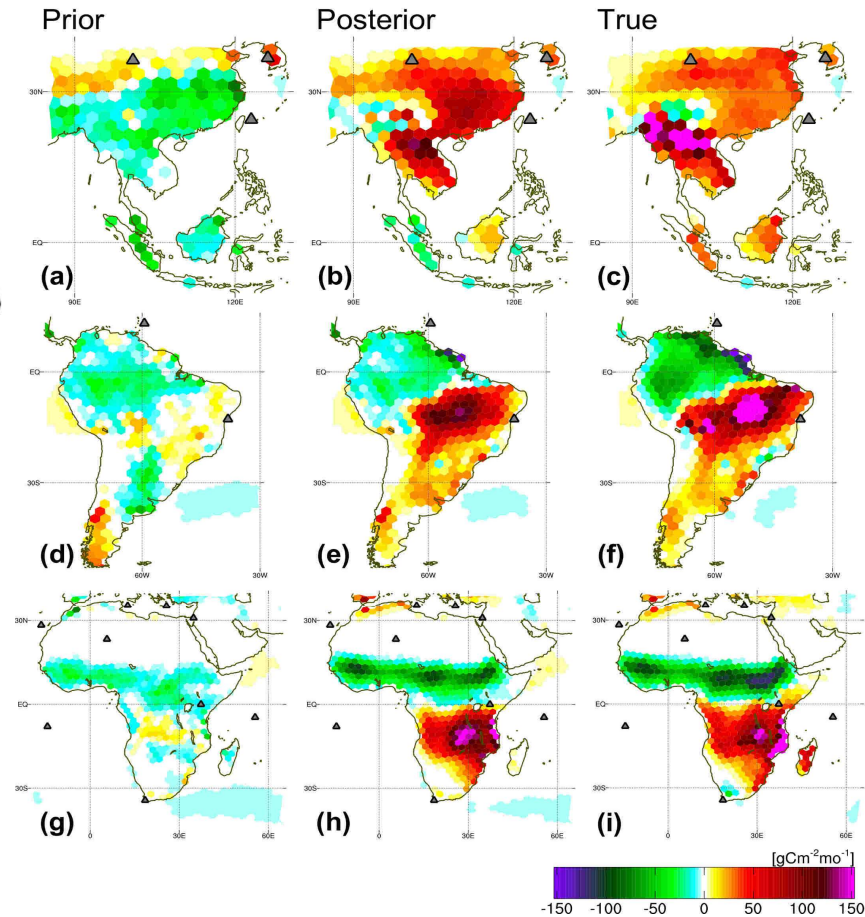
# Successful development of a next generation CO<sub>2</sub> Data Assimilation System (MRI)

## NICAM-TM 4D-Var

(Niwa et al., GMD, 2017a, 2017b)



NICAM-TM (Nonhydrostatic ICOSahedral Atmospheric Model-based Transport Model)

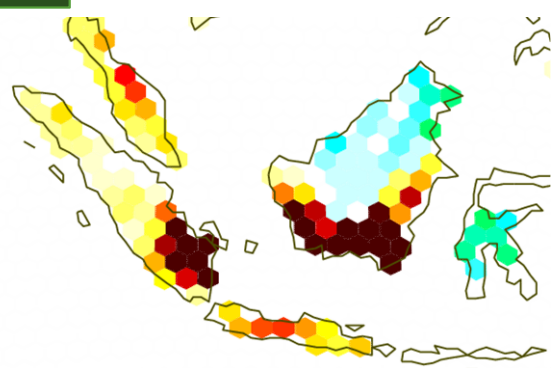


Sensitivity tests using “twin experiments”. Monthly mean distributions of the prior (left), posterior (middle) and true (right) CO<sub>2</sub> fluxes focus on anomalies due to biomass burnings for Southeast Asia in March (a-c), South America in September (d-f), and Africa in September (g-i).

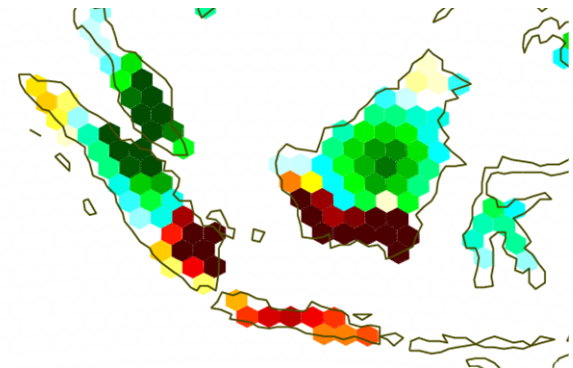
# Southeast Asia for Sep-Oct 2015

The inversion with CONTRAIL retrieved strong sources that are likely related to biomass burning, and also some sinks.

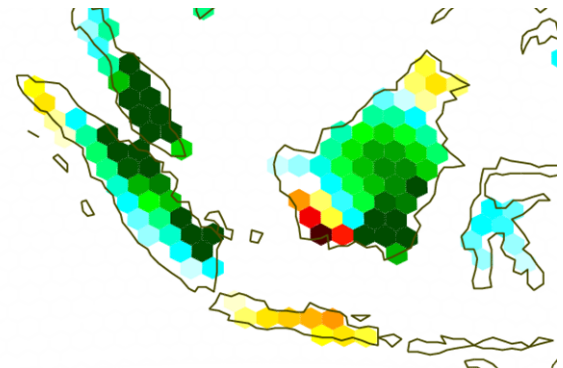
Sep



Prior

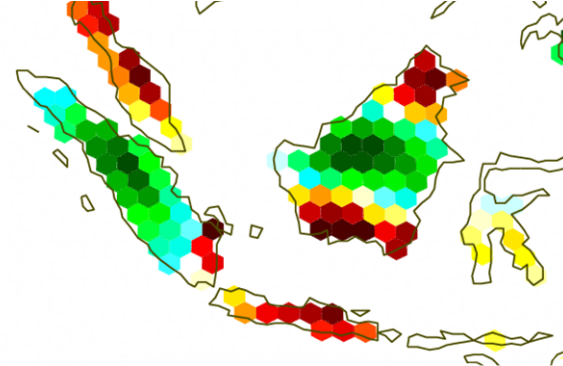
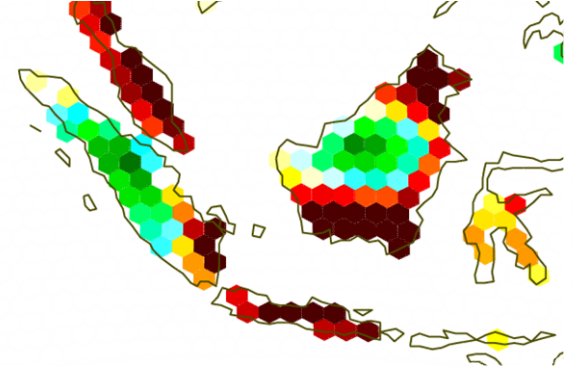
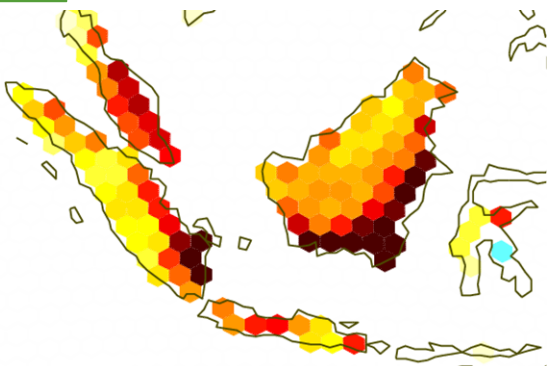


Posterior



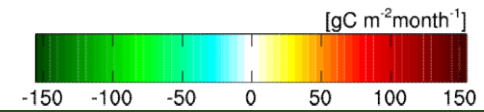
Posterior-Prior

Oct

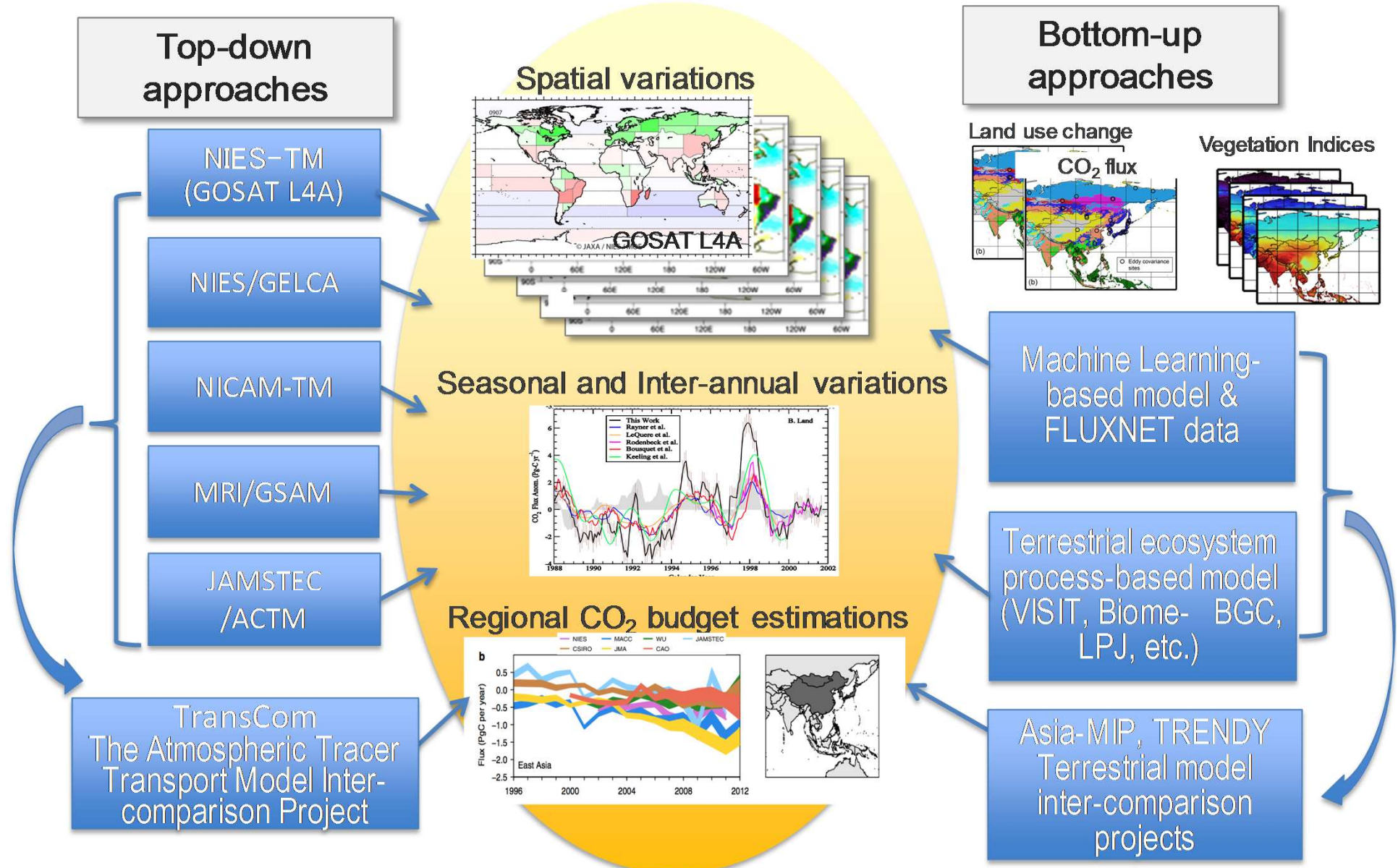


Slide provided by Niwa Y (MRI)

Presented at JpGU-AGU Joint Meeting 2017 (May 23, Chiba)



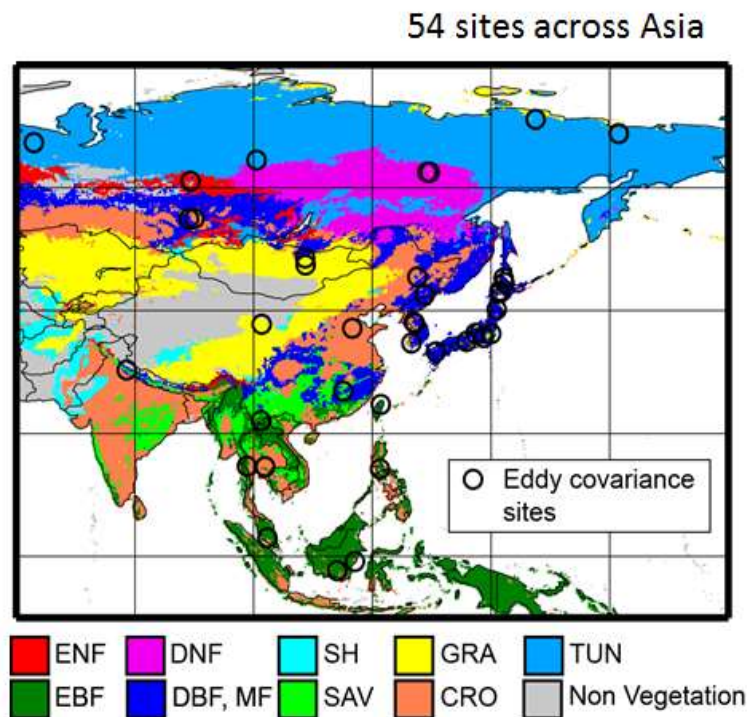
# Inter-comparison among Top-down & Bottom-up approaches to designate uncertainties (JAMSTEC & Chiba Univ)



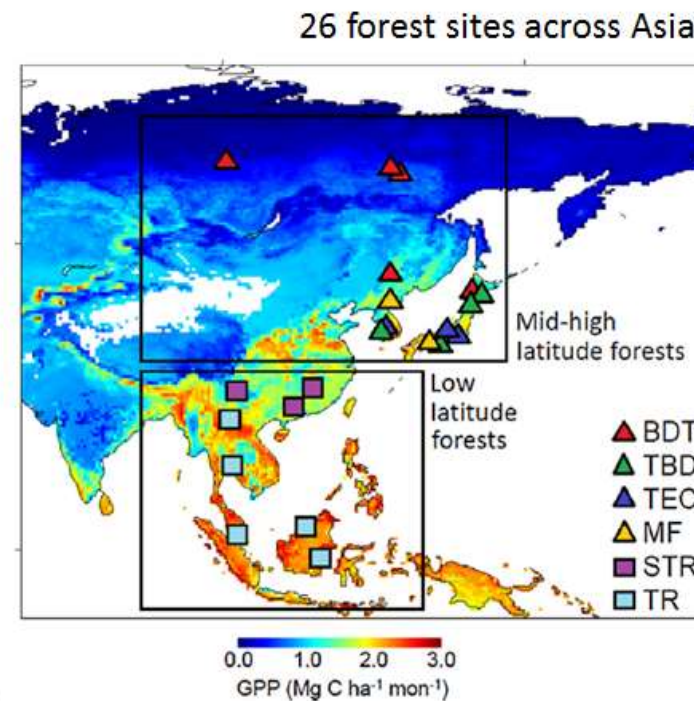
# Detection of changes in terrestrial C budget using AsiaFlux/FLUXNET data upscaling (JAMSTEC/Chiba Univ)

Location of the sites for data driven CO<sub>2</sub> flux estimations in Asia

CO<sub>2</sub> flux



Ecosystem carbon cycle



(Ichii *et al.* *JGR*, 2017)

(Kondo *et al.* *Agric For Meteorol*, 2017)



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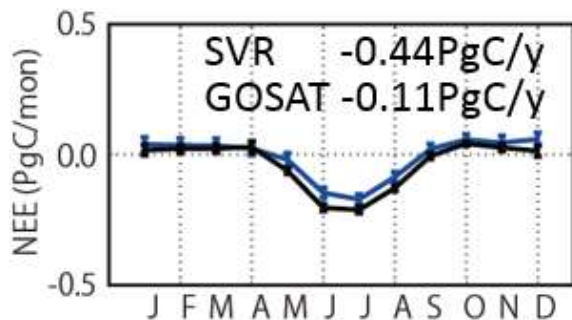
54 sites across Asia

26 forest sites across Asia

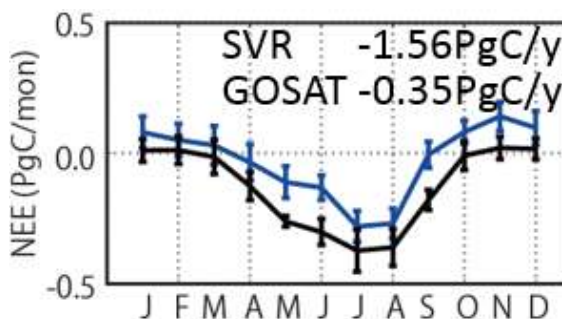
Inter-comparison of bottom-up upscaling and top-down estimate or regional CO<sub>2</sub> flux



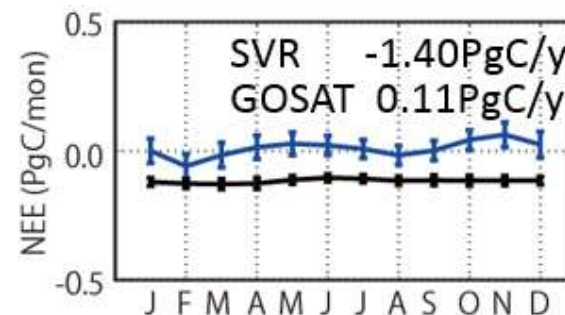
Boreal Eurasia, South West



Temperate Asia, North East



Tropical Asia, South

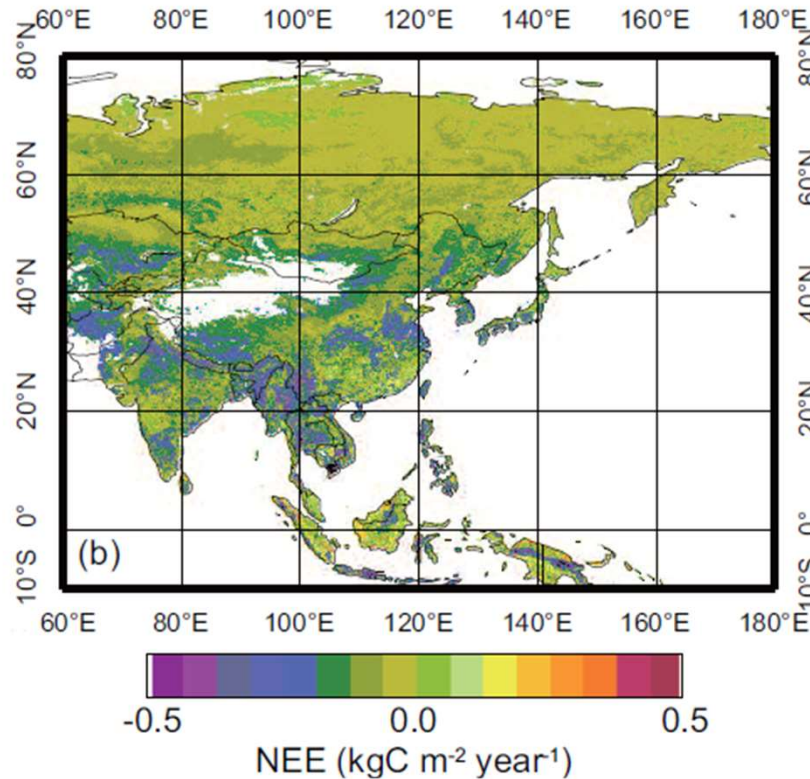


(Ichii et al. JGR, 2017)

(Kondo et al. Agric For Meteorol, 2017)

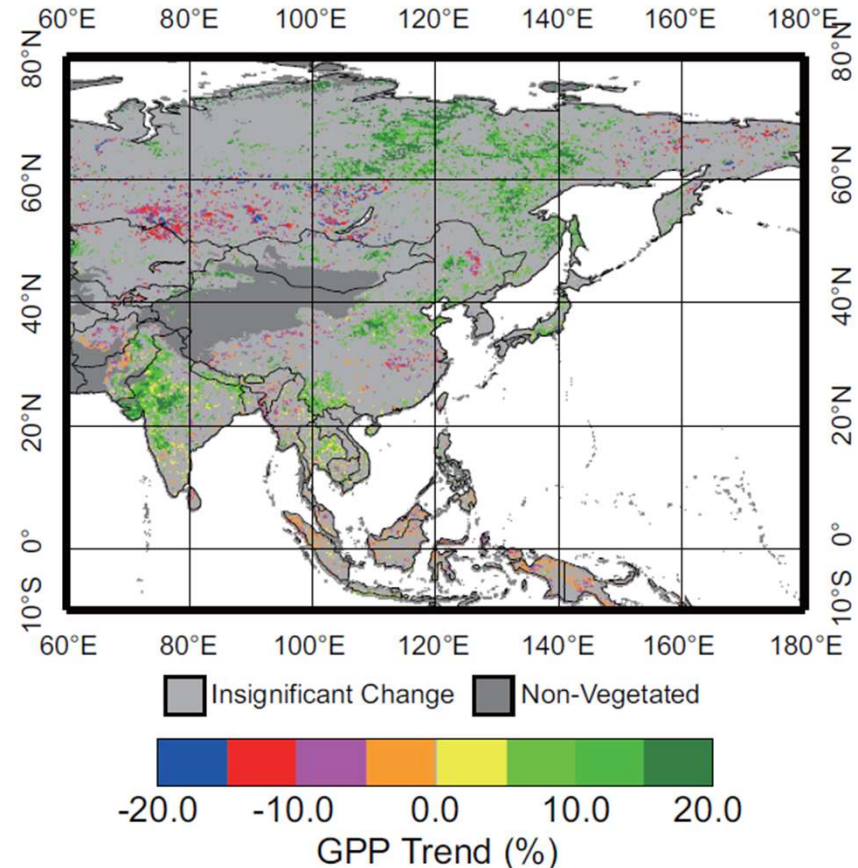
# Detection of changes in terrestrial C budget using AsiaFlux/FLUXNET data upscaling (JAMSTEC/Chiba Univ)

## NEE



Spatial distribution of estimated net annual ecosystem exchange (NEE) (2000-2015).

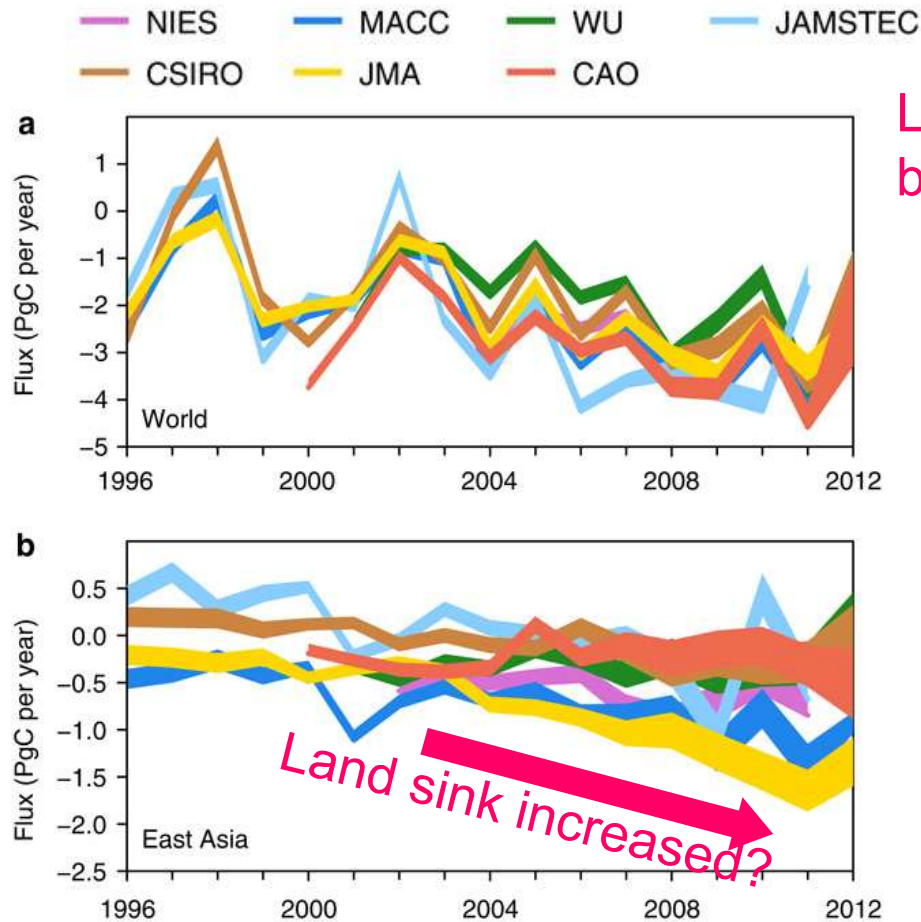
## GPP trend



Spatial distribution of percentage change in estimated gross primary productivity (GPP) from 2000 to 2015.

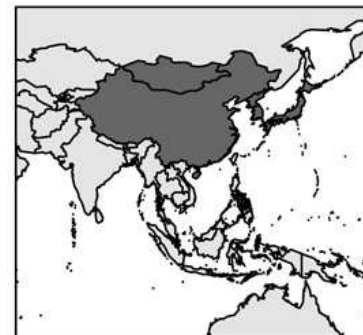
(Ichii *et al.* *JGR*, 2017)

# Asian carbon budget since the mid 1990s, and uncertainty in the fossil fuel sources in East Asia (JAMSTEC)



Land biosphere fluxes estimated by 7 inversion models

The width of each curve:  
Range obtained by different FFC emissions (CDIAC, EDGAR & IEA inventories)



East Asia: The annual  $\text{CO}_2$  sink increased (between 1996–2001 and 2008–2012) by 0.56 (0.30–0.81) PgC, accounting for ~35% of the increase in the global land biosphere sink.

Uncertainty in the FF emissions contributes 32% to the uncertainty in land biosphere sink change.

(Thompson, Patra, *et al. Nature Comm.*, 2016)

# Asian carbon budget since the mid 1990s, and uncertainty in the fossil fuel sources in East Asia (JAMSTEC)

Re-estimate C budget in East Asia

Apply the same scaling factor to lower anthropogenic CO<sub>2</sub> emission in China

Estimate “scaling factor” of 0.59 to lower anthropogenic CH<sub>4</sub> emission

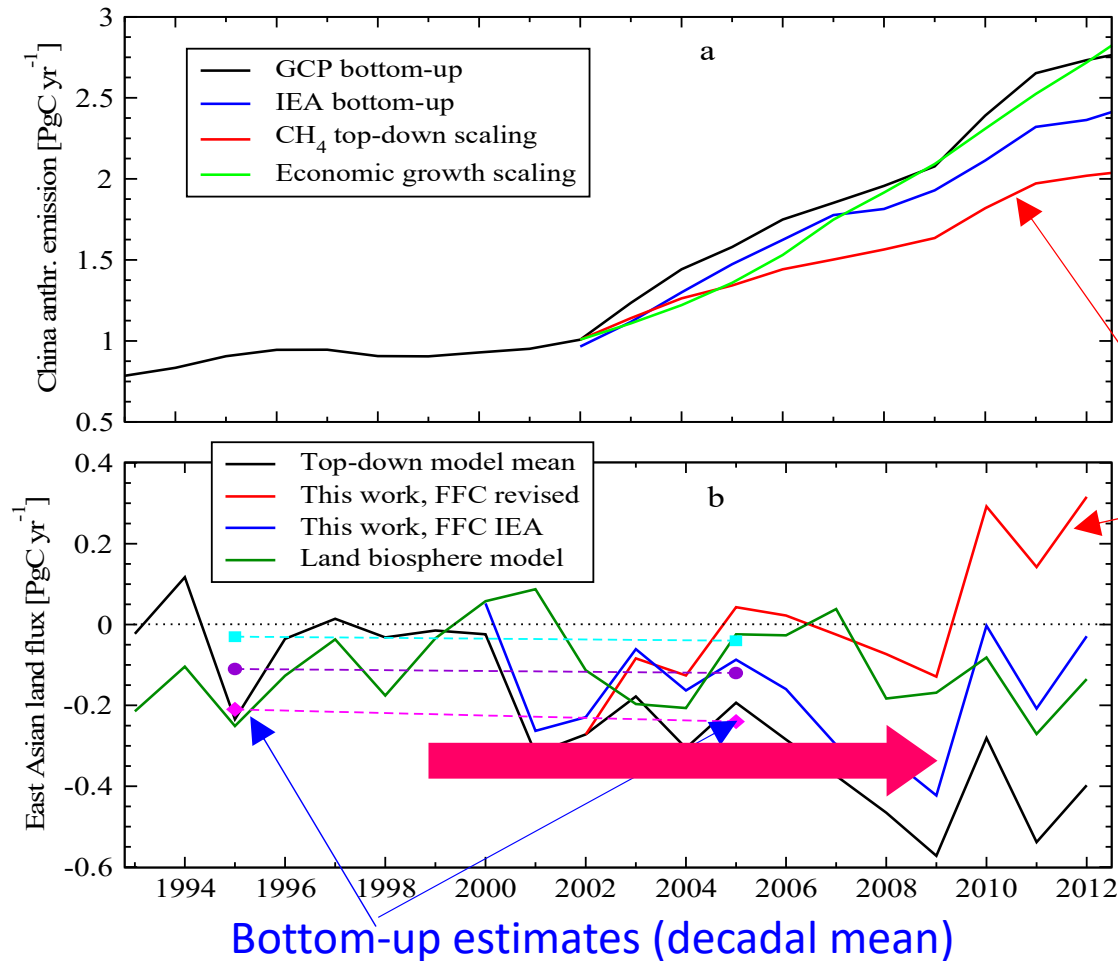
Inventory based CH<sub>4</sub> emission from China  
>> Inverse analysis based CH<sub>4</sub> emission from East Asia

Estimate CH<sub>4</sub> emission increase rate by inverse analysis

(Saeki and Patra, *Geoscience Lett.*, 2017)

# Asian carbon budget since the mid 1990s, and uncertainty in the fossil fuel sources in East Asia (JAMSTEC)

No significant increase in CO<sub>2</sub> uptake (~2009) in East Asia by modifying anthropogenic CO<sub>2</sub> emissions from China using a scaling factor of 0.59



(a) Anthropogenic CO<sub>2</sub> emission scenarios for China for 4 scenarios based on a scaling factor from CH<sub>4</sub> inversion results for East Asia, the economic (GDP) growth, and those estimated by CDIAC and IEA emission inventories.

Results using scaling factor

(b) Multi-model ensemble mean CO<sub>2</sub> flux of East Asia is corrected a posteriori for revised anthropogenic CO<sub>2</sub> emissions from China.

"Bottom-up estimates" are taken from Calle *et al.*, ERL, 2016

(Saeki and Patra, *Geoscience Lett.*, 2017)

# Summary of the project

- 1) **Multiple approaches** including **different types of top-down models and bottom-up upscaling** techniques contributed to designate uncertainties in the estimates of large emissions (e.g. fossil fuel use and land use changes).
- 2) **Key target regions and events** were identified as potential hot-spots in the Asia-Pacific where we need further targeted research. (e.g. potential increase in **terrestrial carbon sink in Siberia and East Asia**, uncertainty in the **recent rapid growth of anthropogenic GHG emissions in East Asia**, emissions from land use change and **El Niño-induced extreme forest fires in Southeast Asia**)
- 3) **A prototype system was developed** and tested for future operational monitoring (e.g. GOSAT-2 analysis system) to detect changes in regional, continental, and global GHGs budgets based on integration of observation and modeling.

# Next Challenge

