

# Present and future ocean-atmosphere CO<sub>2</sub> fluxes, and EO measurement needs

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# Present and future ocean-atmosphere CO<sub>2</sub> fluxes, and EO measurement need

- Why we are interested – the global carbon budget
- Constructing the ocean sink using in-situ and EO observations
  - Methods
  - Results
- A wish list for the future

# Fate of anthropogenic CO<sub>2</sub> emissions (2007–2016)

Sources = Sinks



9.4 GtC/yr  
88%



12%  
1.3 GtC/yr

4.7 GtC /yr  
46%



30%  
3 GtC /yr



24%  
2.4 GtC /yr



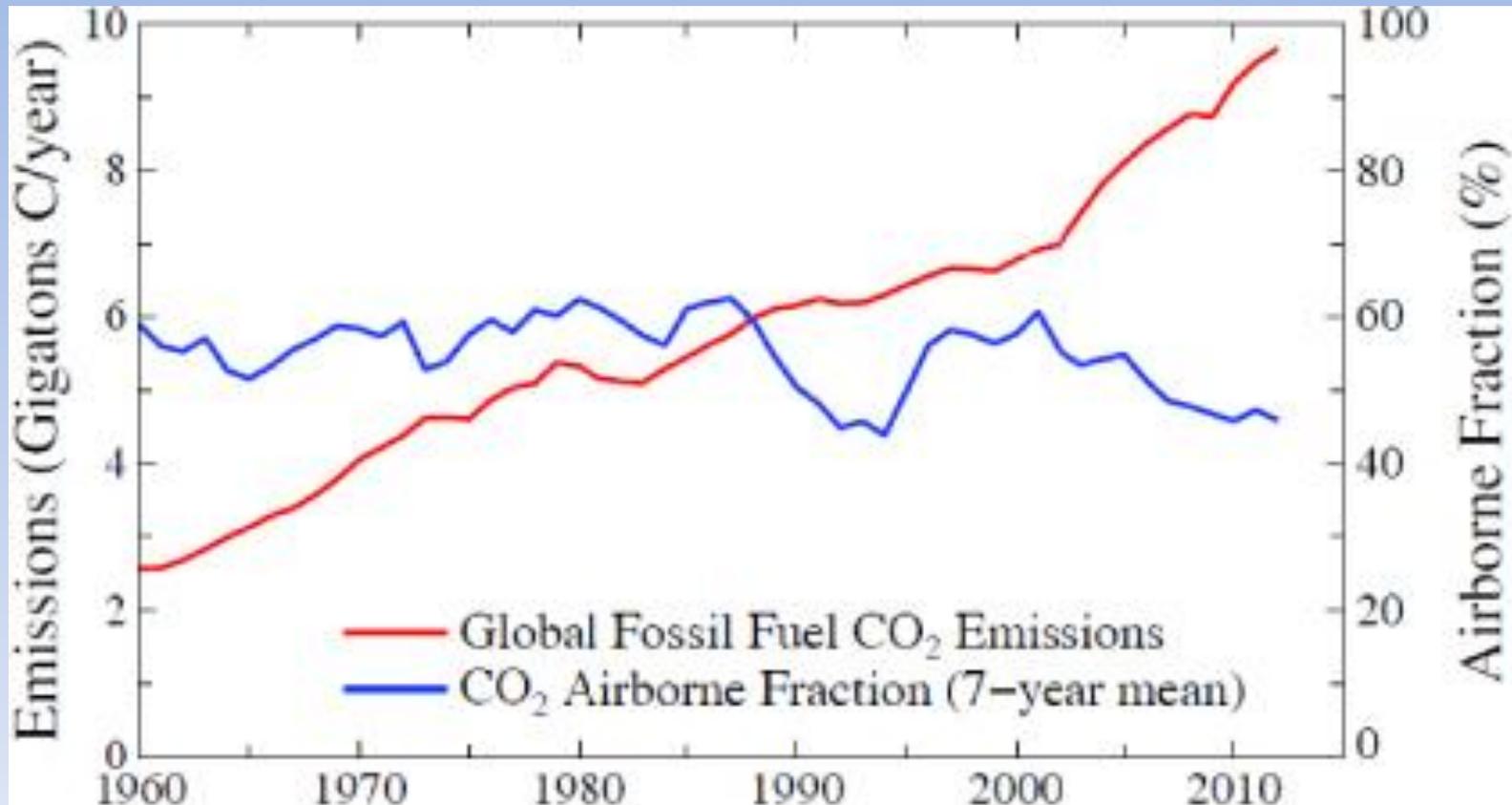
Budget Imbalance:

(the difference between estimated sources & sinks)

6%

0.6 Gt GtC /yr

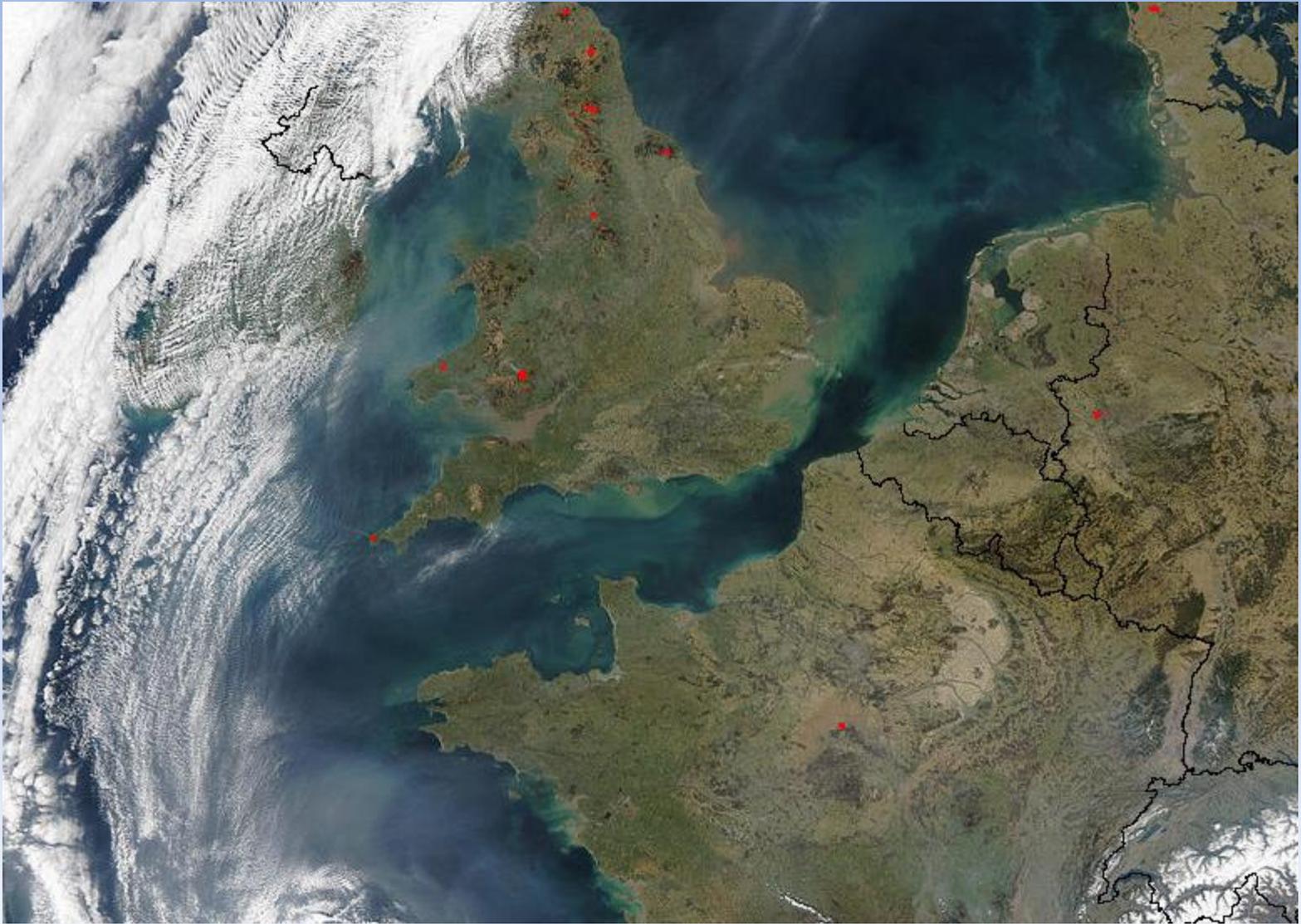
# CO<sub>2</sub> emissions and airborne fraction



- The fossil fuel CO<sub>2</sub> source has increased almost fourfold since 1960.
- The “airborne fraction” has remained roughly constant.

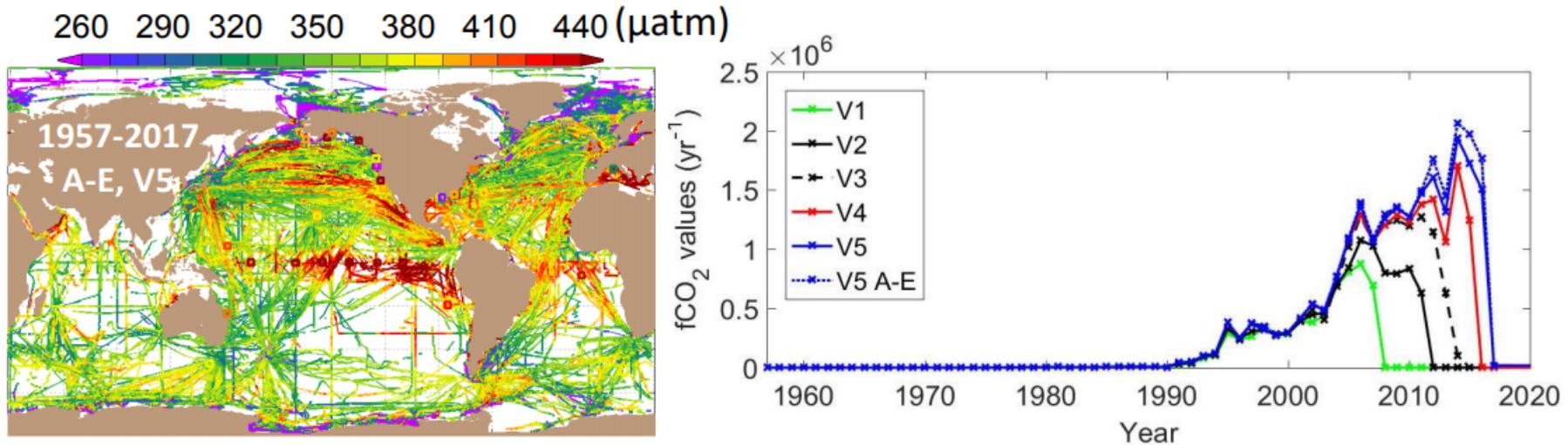
It follows that

- The land and ocean sinks must have similarly increased.





- Terrestrial environment is heterogeneous on ~100m scales
  - net CO<sub>2</sub> flux is the small difference between large uptake and release
- The sea is heterogeneous, but on much larger scales.
  - 100 km in open ocean
- Net fluxes are similar to land, but diurnal and seasonal variations much smaller.



## Global synthesis and gridded products of surface ocean fCO<sub>2</sub>

(fugacity of CO<sub>2</sub>) in uniform format with quality control;

No gap filling; Annual public releases;

V5: 21.5 million fCO<sub>2</sub> values from 1957-2017, accuracy < 5  $\mu\text{atm}$  (flags A-D);

Plus calibrated sensor data (< 10  $\mu\text{atm}$ , flag E);

Online viewers, downloadable (text, NetCDF), ODV;

Documented in ESSD articles;

Fair Data Use Statement;

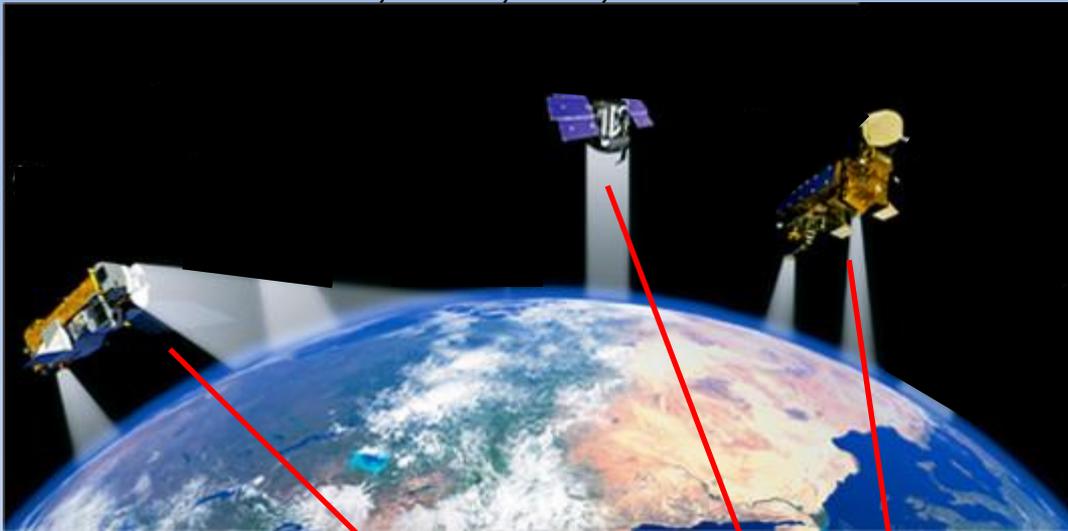
Community activity with >100 contributors worldwide.

(Pfeil et al., 2013; Sabine et al., 2013; Bakker et al., 2014, 2016, all in ESSD)

# Ocean CO<sub>2</sub> fluxes

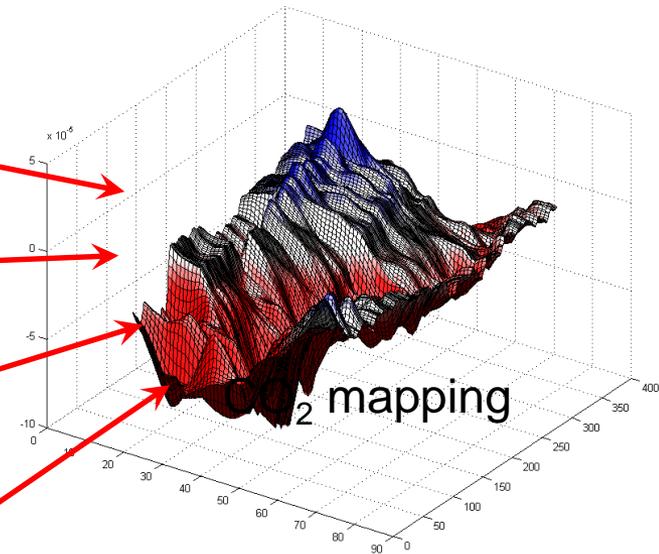
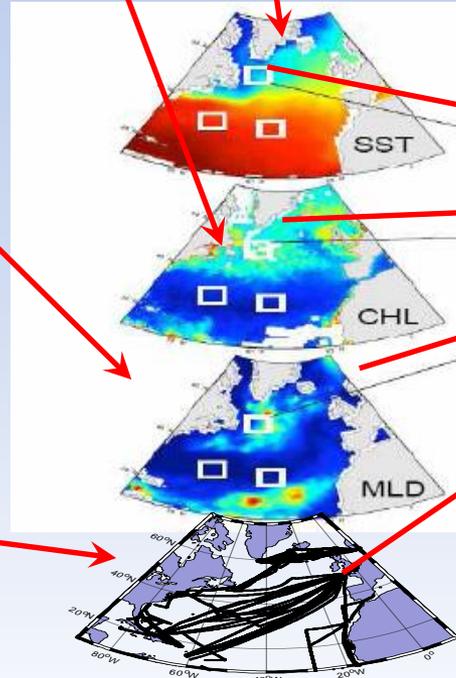
- Use the Gas exchange equation at the sea surface: needs complete coverage of ocean surface CO<sub>2</sub> fugacity, fCO<sub>2</sub>
- Rapid increase in quantity of surface ocean fCO<sub>2</sub> data since the early 90s.
- Brought together and QC'd under SOCAT in recent years
- Good coverage in the N. Hemisphere, more patchy in the South.
- Neural net or regressions used to create maps of fluxes, using Satellite-derived SST, wind speed, and chlorophyll.

Satellite SST, SSS, Chl, winds



Extending in-situ  
data to basin-wide  
coverage

Commercial ships  
instrumented for CO<sub>2</sub>



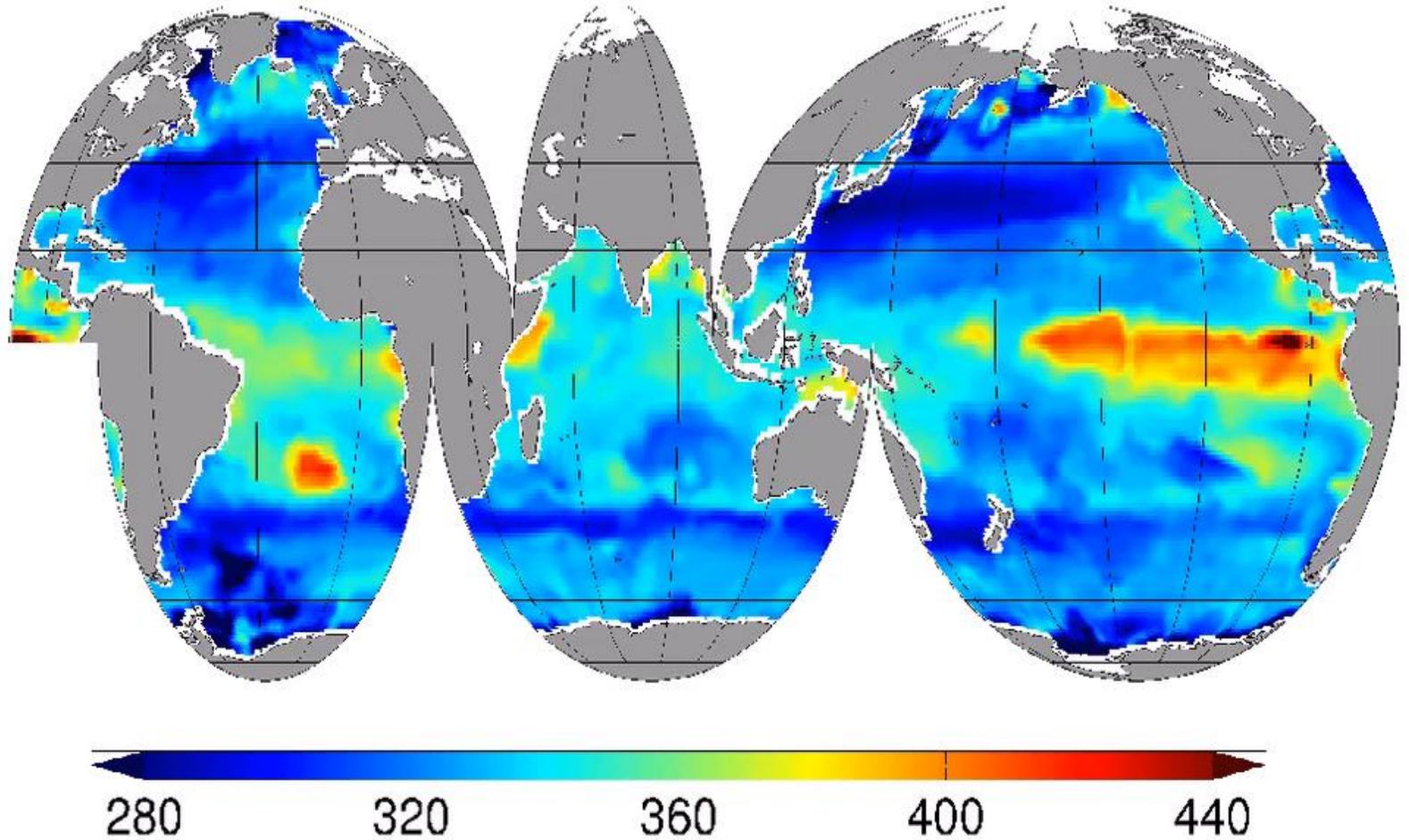
Spot CO<sub>2</sub> values

# Extending ship data to obtain $f\text{CO}_2$ data with full spatial coverage

Seek relationships (using multiple regressions or neural nets) between ship  $\text{pCO}_2$  data and multiple variables:

- Time
  - Region, and position within region
  - Remote-sensed data: SST, SSS, wind, Chl
  - Atmospheric  $\text{xCO}_2$
  - Climatological seasonal data (surface nutrients)
  - Re-analysis and state estimate data (Mixed layer depth)
- $f\text{CO}_2 = f(\text{SST}, \text{MLD}, \text{SSS}, (\text{region}), (\text{time}) \dots)$ .

1982-1



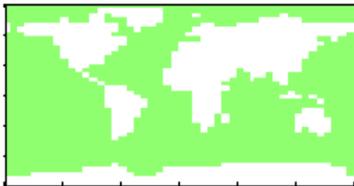
Movie courtesy Peter Landschutzer, ETH Zurich and MPI Hamburg

# Uncertainties: sea surface fCO<sub>2</sub>

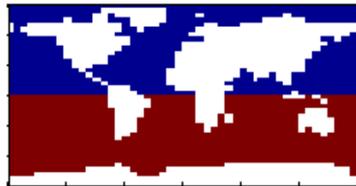
- Realistic-looking reconstructions of surface fCO<sub>2</sub> can be constructed, but how accurate are they?
- Concentrate on the Northern Hemisphere where the data coverage is good.
- Try many different mapping regions and methods of MLR.
- Apply them to model outputs to see how well they reconstruct the “true” pCO<sub>2</sub>
- Use “least angle regression” which chooses the most efficient regression among independent variables.

# Ocean divisions

2d gl0001



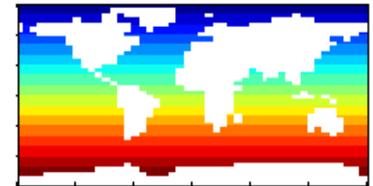
2d gl0002



2d bn3006



2d bn1018



2d Pe1303



2d Pe1306



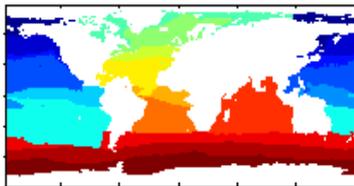
2d Wn0911



2d Wn0940



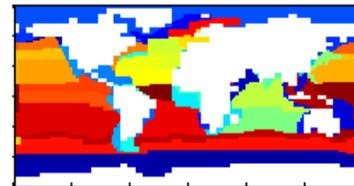
2d FM1417



2d Gr0928



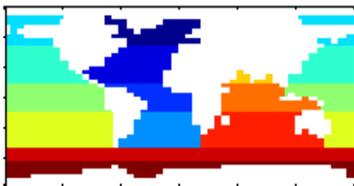
2d Lo0754



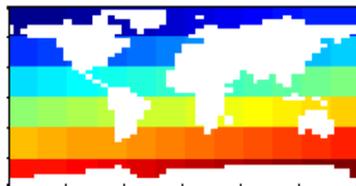
2d Sc1312



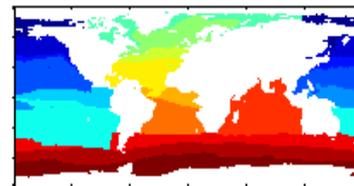
Ta0913



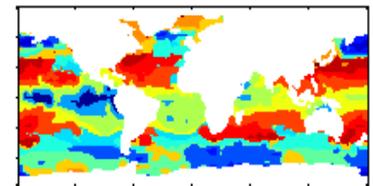
bx3030



3d FM1417

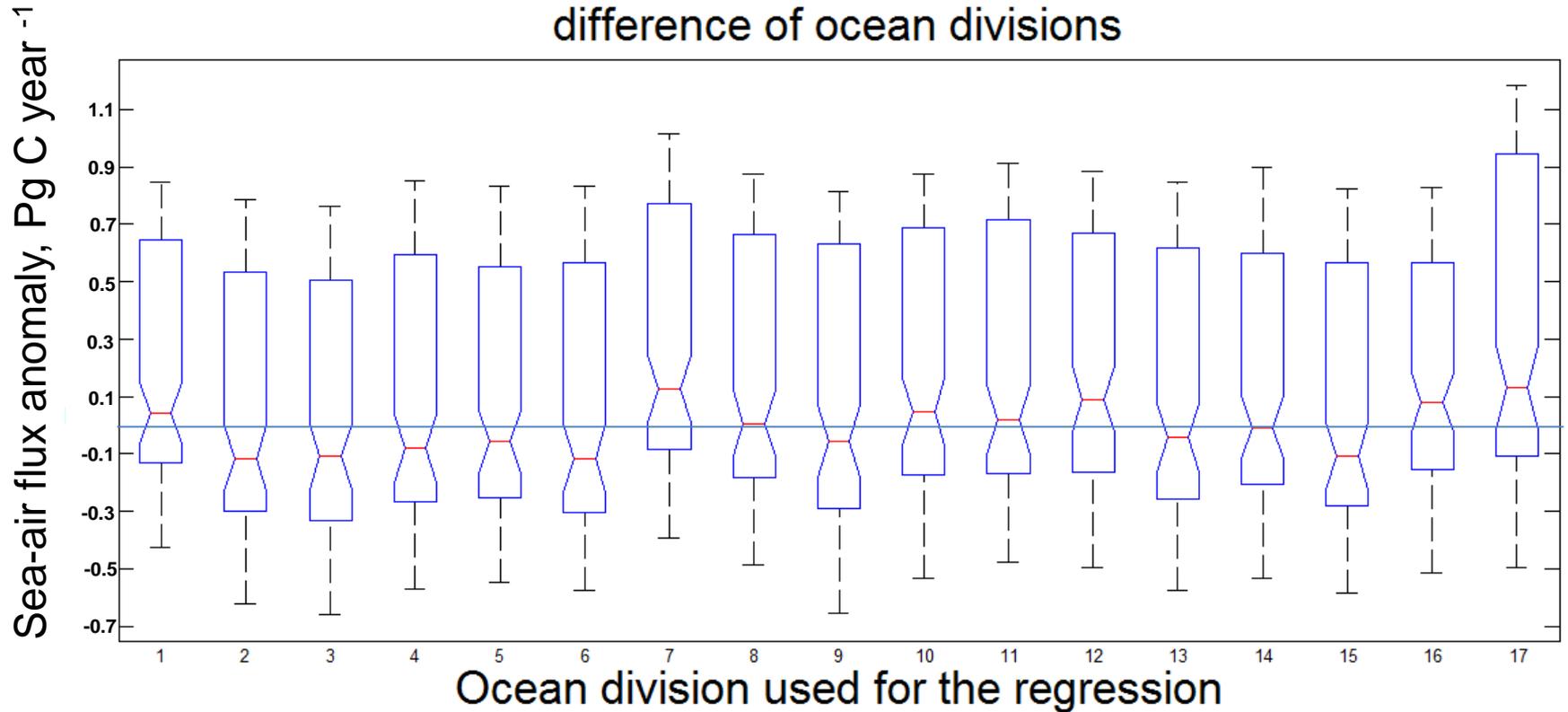


3d La1316



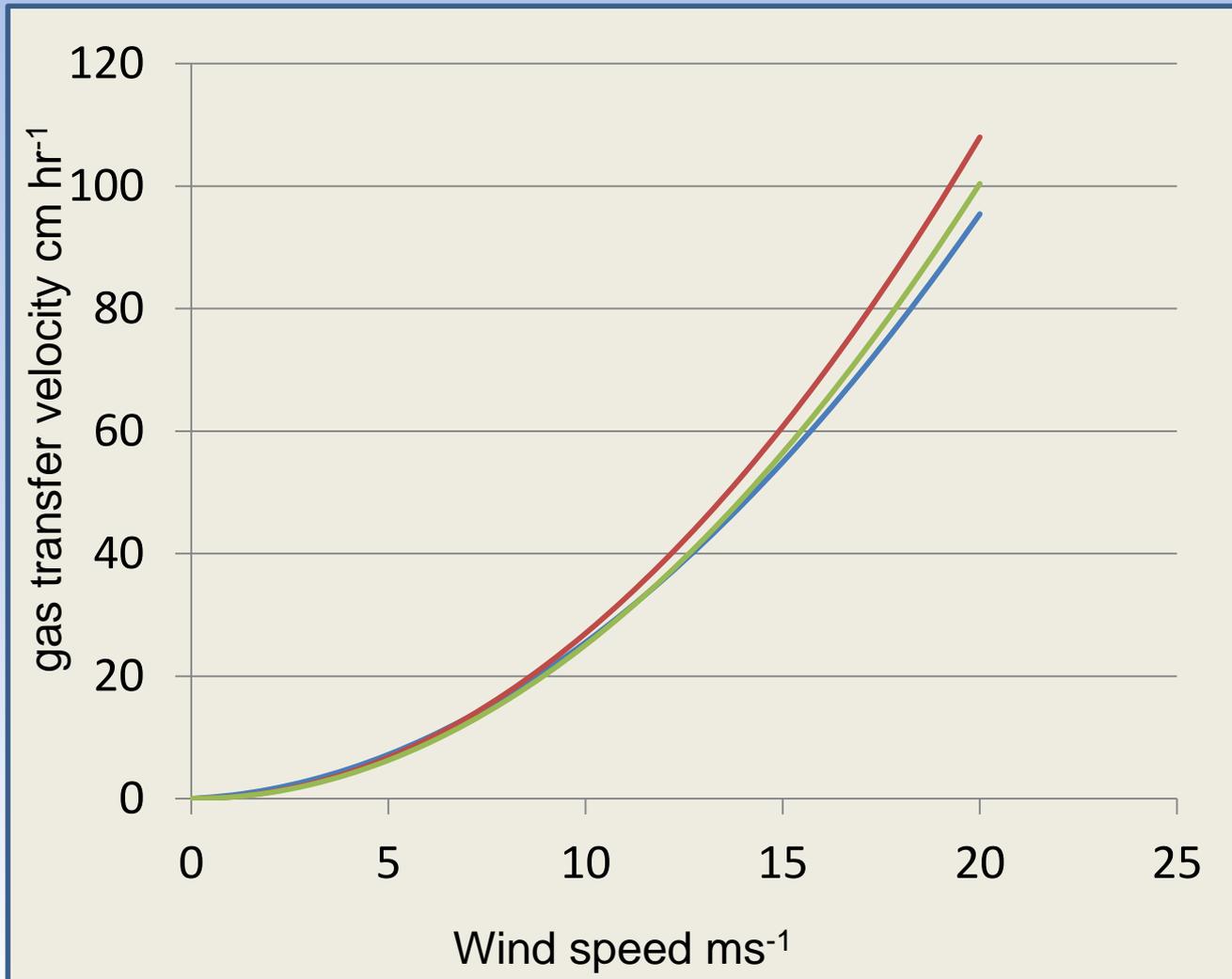
# Flux uncertainty due to ocean divisions

Annual mean sea-air CO<sub>2</sub> flux [Pg C year<sup>-1</sup>],  
difference of ocean divisions



Standard deviation for the northern hemisphere is 6%, ~0.07 Pg C year<sup>-1</sup>

# Gas transfer parameterizations since 2000

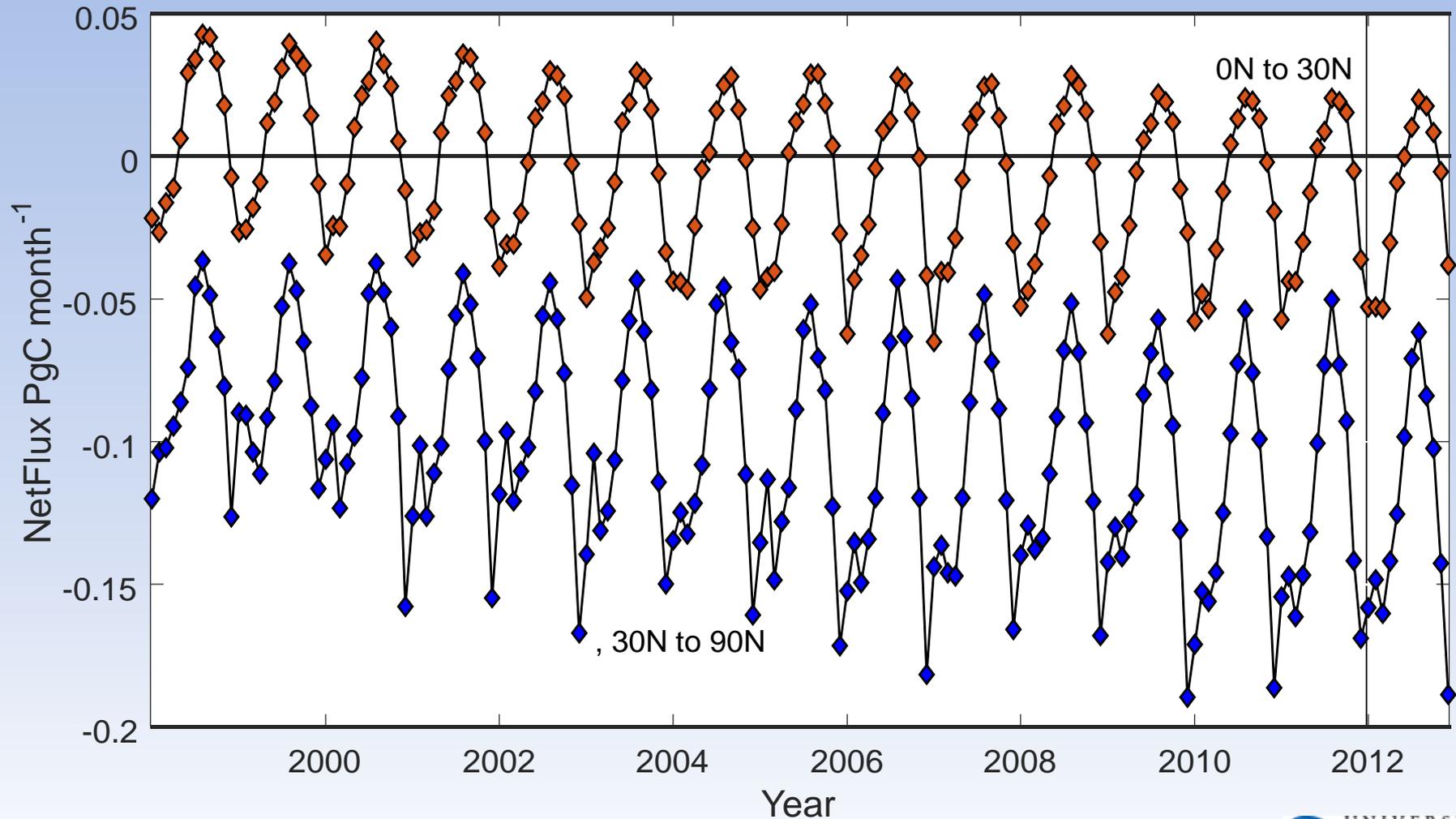


- Nightingale 2000
- Sweeney 2007
- Wanninkhof 2014

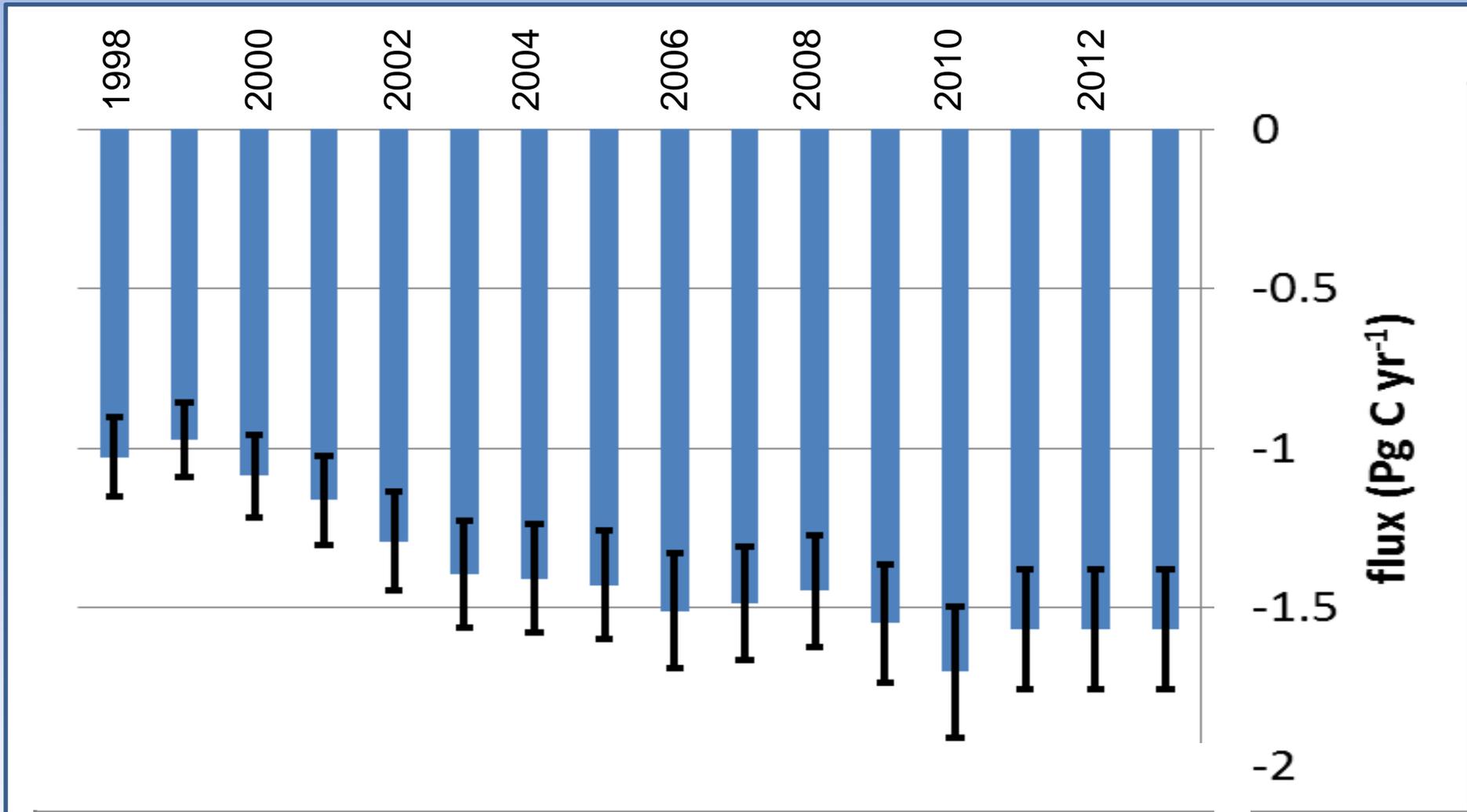
# Flux calculation

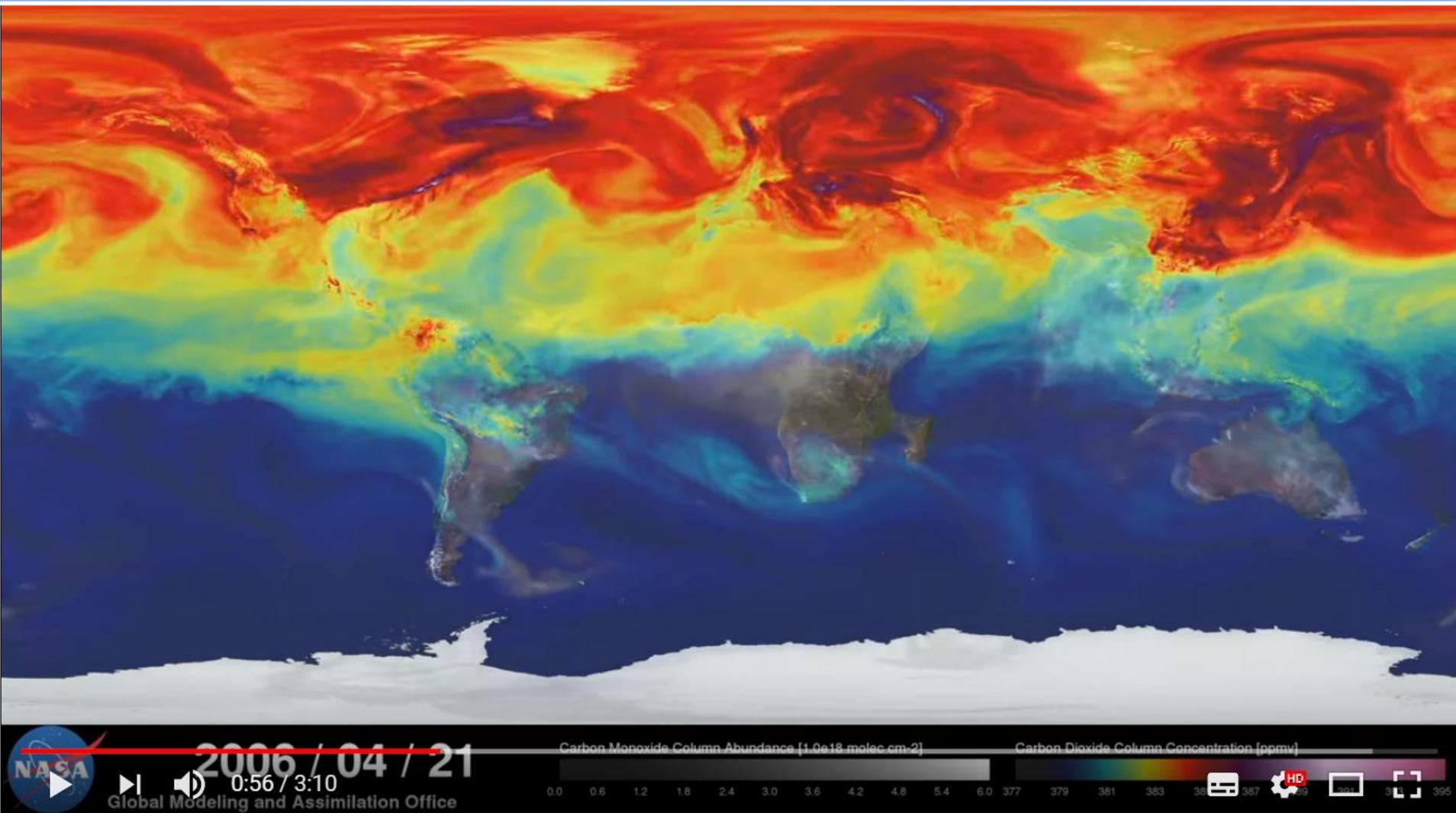
- We use the FluxEngine developed by Shutler and colleagues: <http://www.oceanflux-ghg.org/Products/FluxEngineA>
- CCMP 6-hourly winds from satellite capture high wind speed events
- Accurate land mask, ice mask
- Accurate SSTs to account for SOCAT “inlet temperatures”, corrected to 1m.
- Correction for surface temperature skin effect (important! 0.4 PgC yr<sup>-1</sup> globally, see Woolf et al, JGR **121**, 1229-1248, 2016).

# Monthly ocean fluxes, 0-30N and 30N-90N

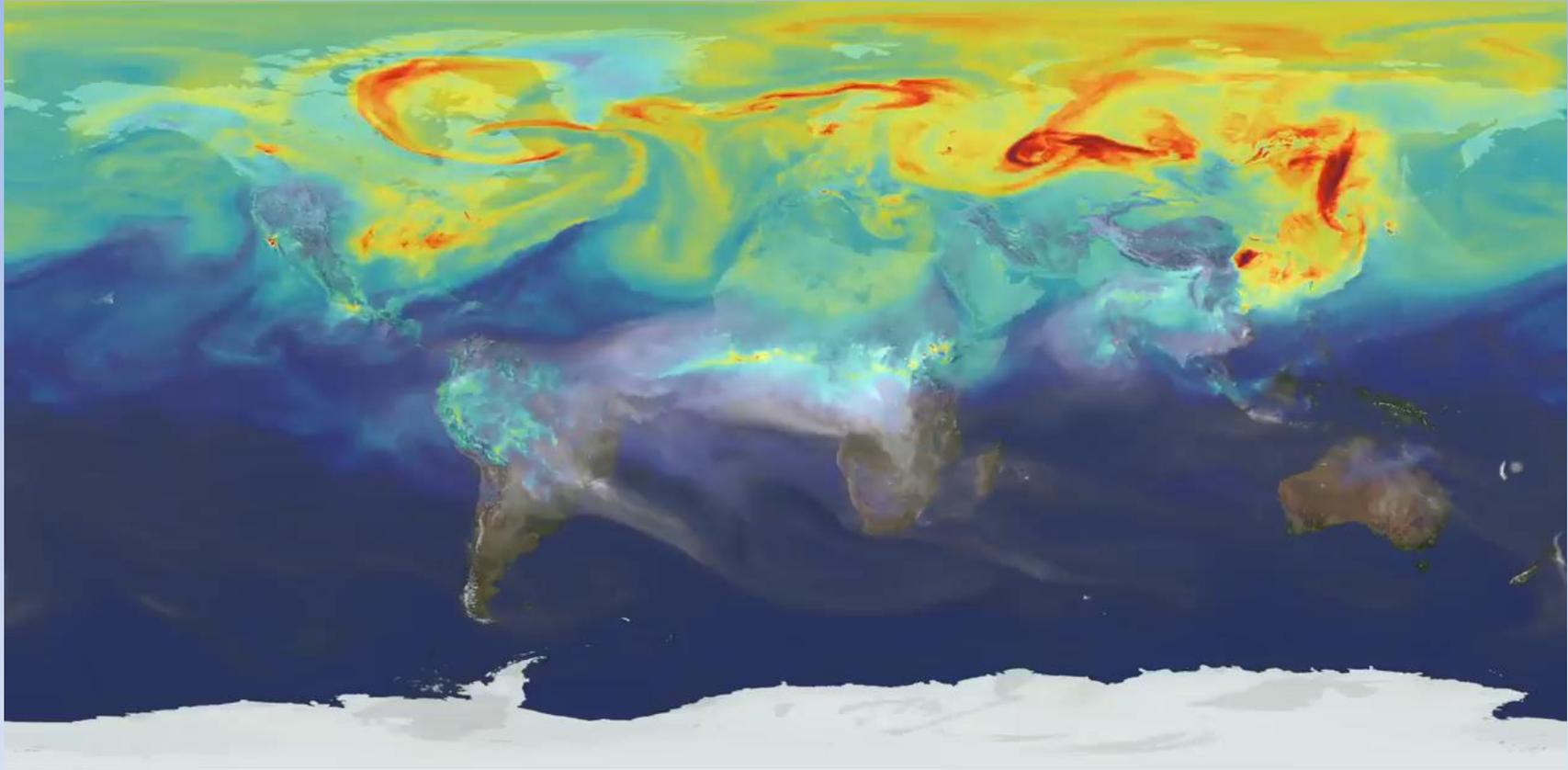


# N. Hemisphere ocean sink (PgC yr<sup>-1</sup>)





- JPL high-res



 **2006 / 01 / 11**  
Global Modeling and Assimilation Office

Carbon Monoxide Column Abundance [ $1.0e18$  molec  $cm^{-2}$ ]  
0.0 0.6 1.2 1.8 2.4 3.0 3.6 4.2 4.8 5.4 6.0

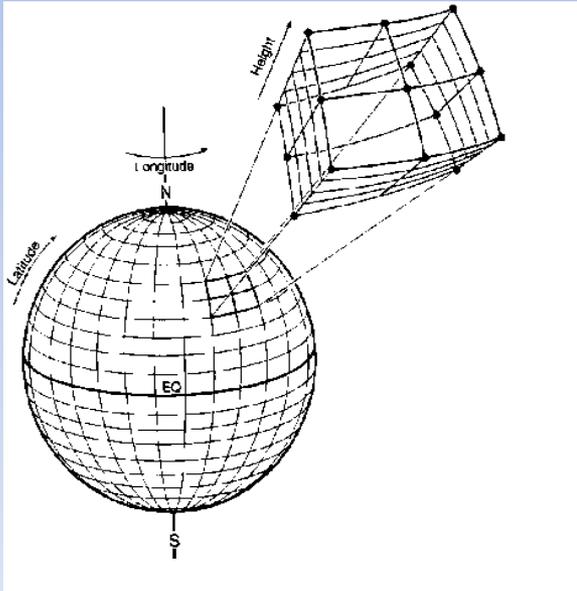
Carbon Dioxide Column Concentration [ppmv]  
377 379 381 383 385 387 389 391 393 395

# N. Hemisphere land flux by atmospheric inversion

- Use atmospheric transport model and inversion scheme, with standard priors.
- use N. H ocean observations as a well-observed prior.
- Aggregate northern and southern hemisphere sinks are well resolved, hence a value for the net NH land sink.

# Transport MODEL : GEOS-Chem v9.02

<http://acmg.seas.harvard.edu/geos/index.html>



**CO<sub>2</sub> Simulation** : Nassar et al. 2010; Suntharalingam et al. 2005

**Resolution** : 2° (lat) x 2.5° (lon) ; 47 vertical levels

**Spin up and simulation**:2004-2012

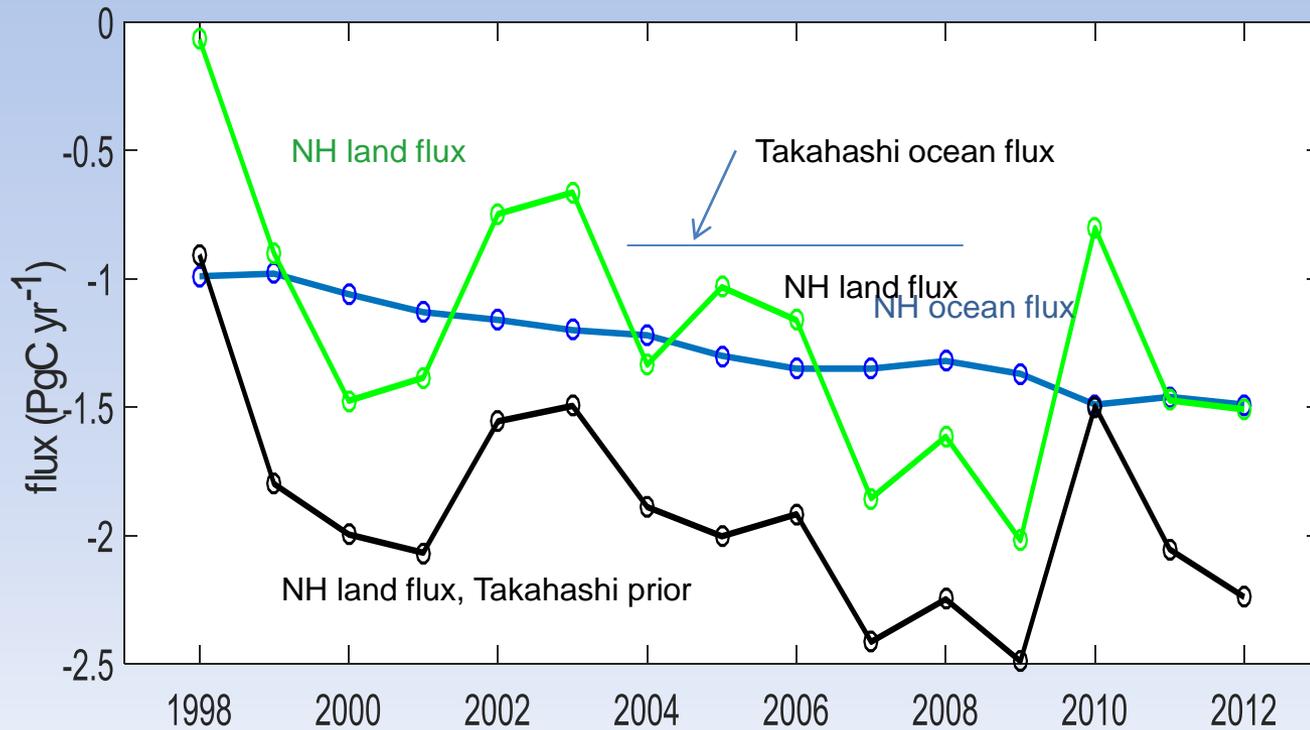
## Initial Prior CO<sub>2</sub> fluxes

Fossil: CDIAC, Andres et al. 2011

Ocean: **Climatology(Takahashi et al.,2009) ;**

Land: Biomass burning (Van der Werf et al. 2006);  
Balanced Biosphere(Olsen et al. 2004);  
Remaining fluxes based on Nassar et al. 2010.

# Aggregated observational estimate of N. Hemisphere land fluxes, using inverse atmospheric calculation



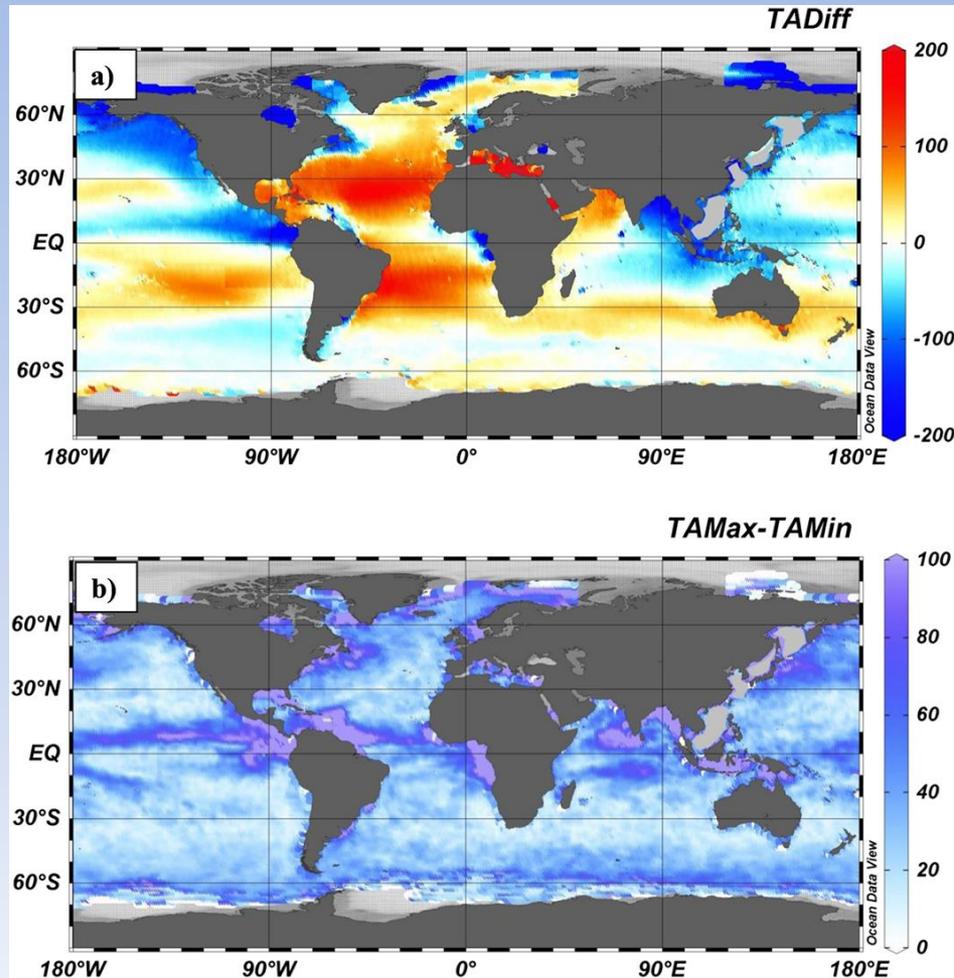
# Constraints from the ocean CO<sub>2</sub> flux reconstructions on global carbon cycle

- We can accurately ( $1-\sigma < 10\%$ ) constrain the ocean CO<sub>2</sub> sink in the Northern hemisphere (and the tropics)
- It has substantially increased since late 90s and in 2012 stood at  $\sim 1.5 \text{ PgC yr}^{-1}$ .
- Combined with coarse latitudinal atmospheric inversion, gives values and trend for the N. Hemisphere terrestrial sink, which is around  $1 \text{ PgC yr}^{-1}$  smaller than other studies.
- S. Hemisphere sink has also increased – (land tropics + S hemisphere oceans?).

# EO measurement needs for CO<sub>2</sub> fluxes

- Ideally: pH and TA at the air-sea interface
- Accurate gas transfer velocities – (sea surface information: scatterometry, passive microwave, SAR, → wind, waves, whitecapping, effect of slicks?)
- Ice cover
- SST -- surface skin and “foundation temperature”
- SSS
- Chlorophyll

# Alkalinity from space: Global variability of total alkalinity, and amplitude of the seasonal cycle. (Aquarius, 2014)

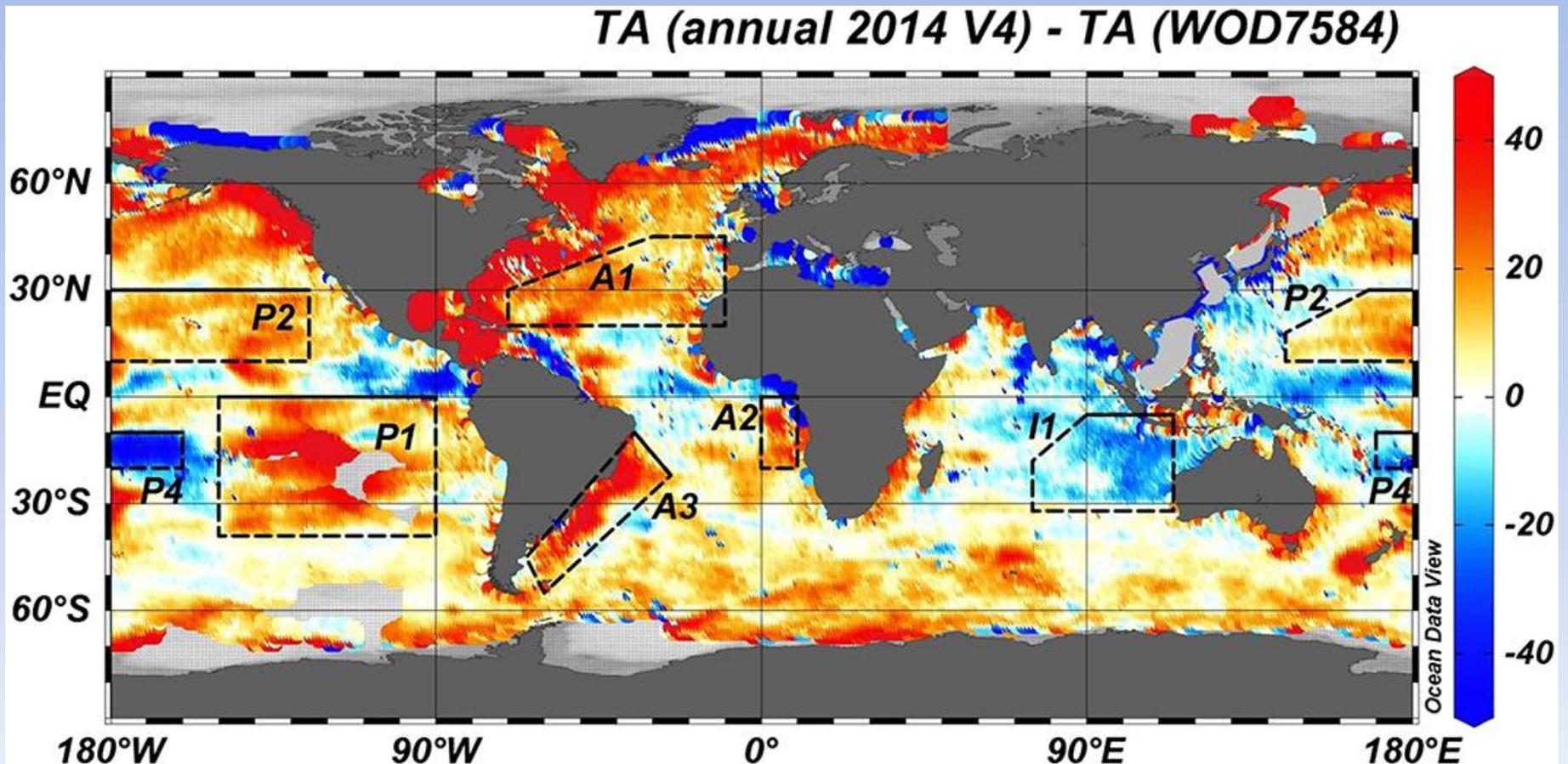


From Fine et al, 2017: *Geophysical Research Letters*

*Volume 44, Issue 1*, pages 261-267, 5 JAN 2017 DOI: 10.1002/2016GL071712

<http://onlinelibrary.wiley.com/doi/10.1002/2016GL071712/full#grl55372-fig-0002>

# Changes in ocean total alkalinity over recent decades: from Aquarius satellite data (2014) compared to Conkright et al climatology

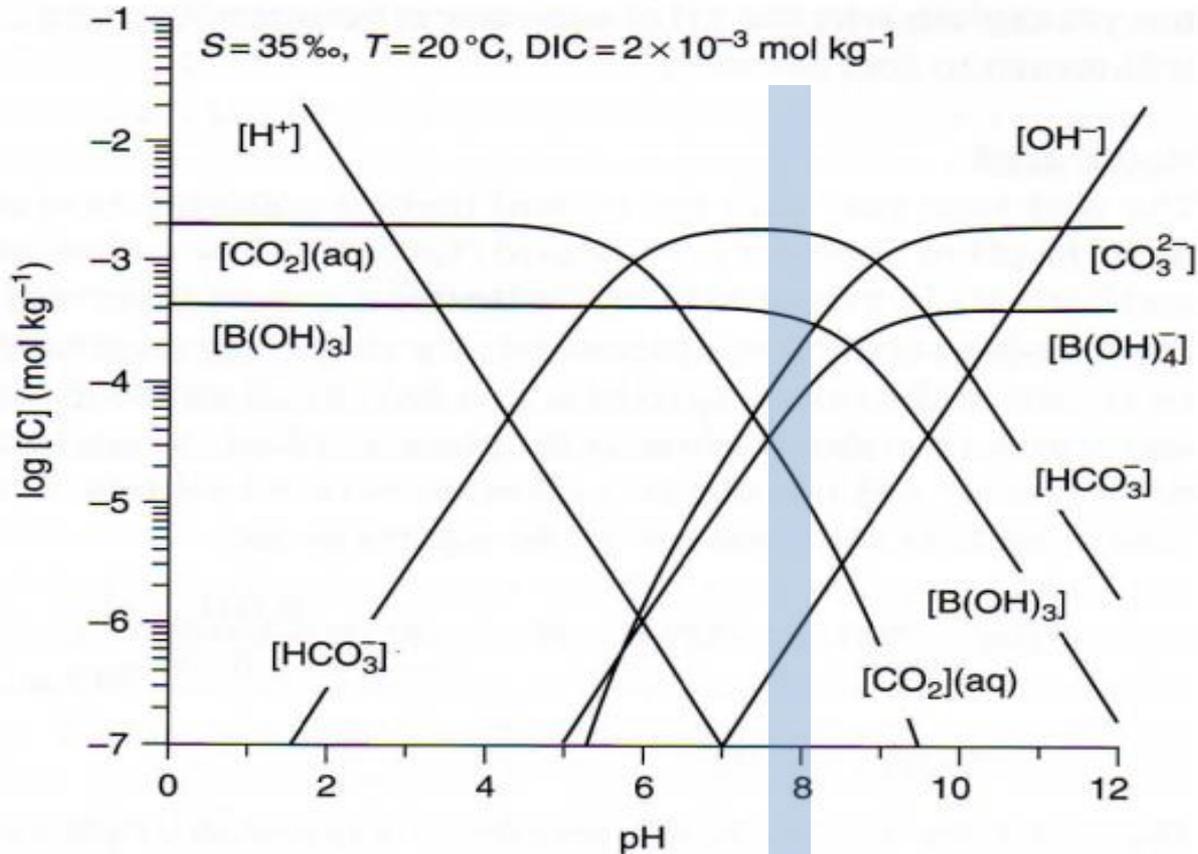


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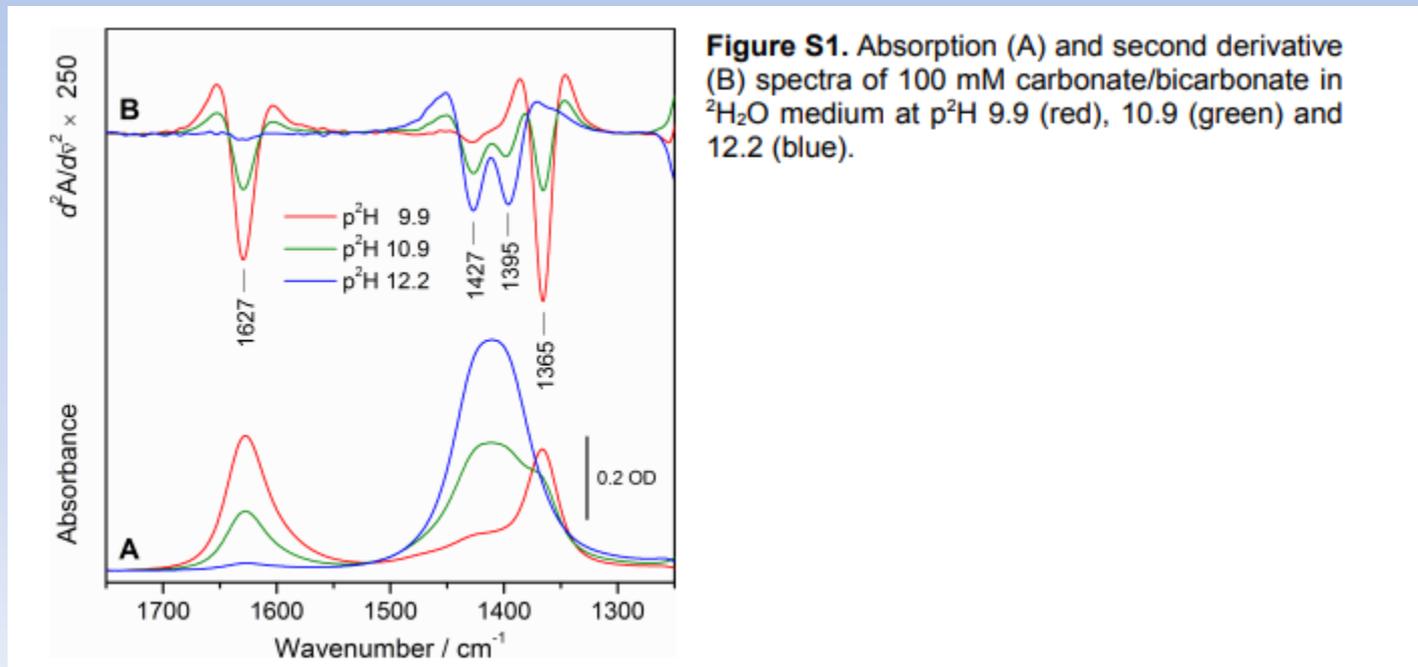
<http://onlinelibrary.wiley.com/doi/10.1002/2016GL071712/full#grl55372-fig-0002>

# Can we directly observe marine carbonate / pH from space?



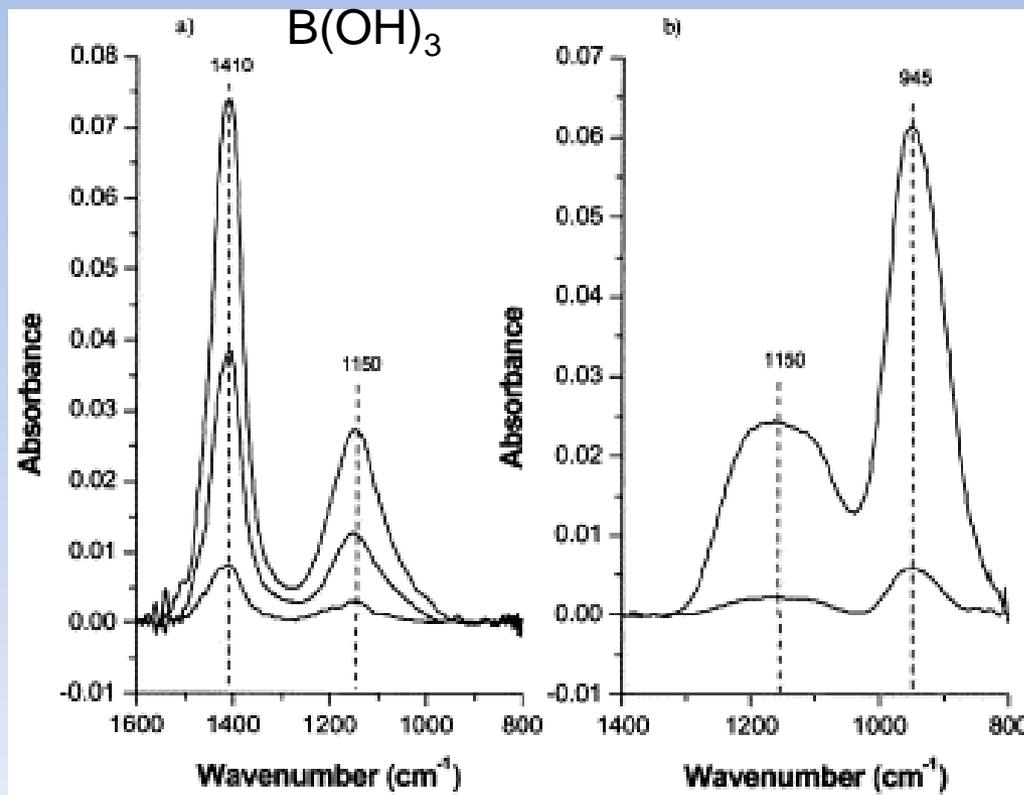
seawater pH

# Carbonate/bicarbonate ion IR spectra



Baldassarre, M. and A. Barth (2014). "The carbonate/bicarbonate system as a pH indicator for infrared spectroscopy." *Analyst* **139(9)**: 2167-2176.

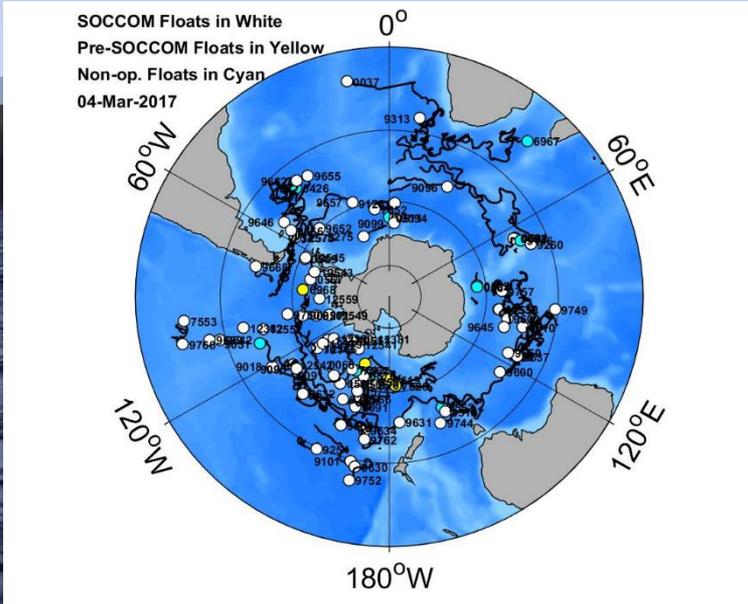
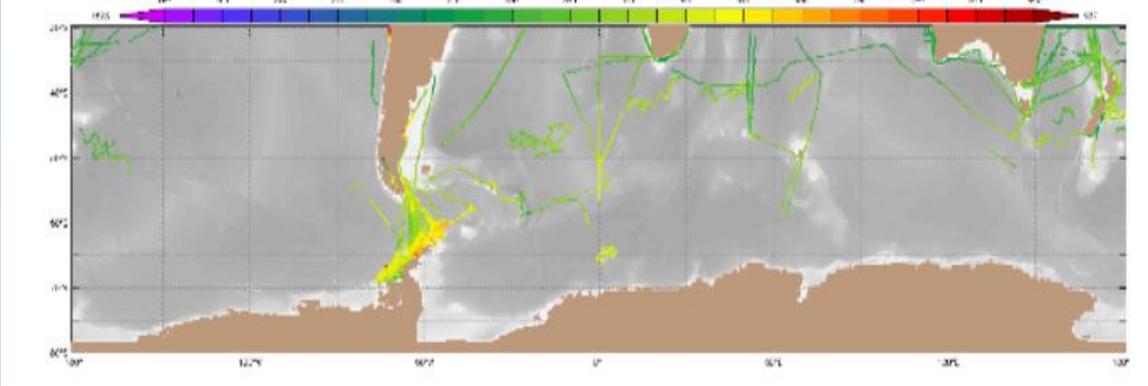
# Borate/boric acid IR spectra



# Future work to improve ocean-atmosphere CO<sub>2</sub> fluxes

- Full assimilation / re-analysis framework incorporating the carbon cycle, assimilating biogeochemical observations from in-situ and EO.
- Improved Surface layer alkalinity
- Improved gas exchange parameterization – using information on the sea surface (whitecaps, slicks, spray)
- Combine EO observations with improved coverage of in-situ observations using autonomous platforms.

- Autonomous instruments for data-poor regions such as the Southern Ocean?



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