

Global observational synthesis to constrain recent changes in the ocean carbon uptake

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#### Motivation – Models and Obs

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#### **Global Carbon Budget 2016**

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In Tian<sup>49</sup>, Bronte Tilbrook<sup>40</sup>, Ingrid T. v Nicolas Viovu<sup>14</sup>, Anthony P. Walker<sup>53</sup>, A Recent variability of the global ocean carbon sink

#### P. Landschützer<sup>1,2</sup>, N. Gruber<sup>1</sup>, D. C. E. Bakker<sup>2</sup>, and U. Schuster<sup>3</sup>

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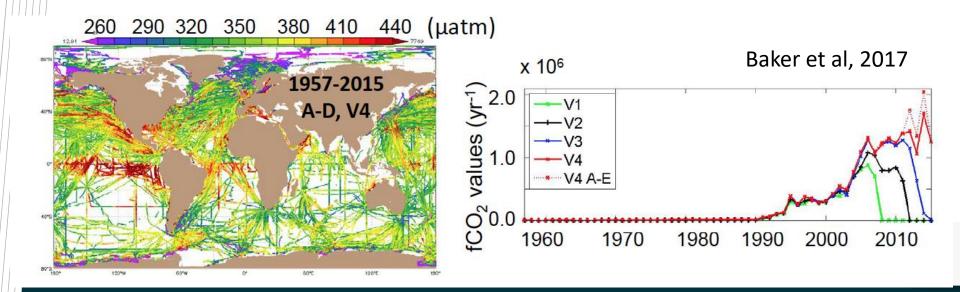


#### Dorothee's excellent SOCAT talk



#### *Motivation – Models or Obs?*

- However, the limited observations of the ocean carbon cycle necessitate some degree of interpolation and/or large-scale spatial and temporal averaging.
- This has the potential either to bias or alias the results toward a dynamically inconsistent ocean state thereby making understanding the drivers of these changes challenging.



Geosci. Model Dev., 9, 1827–1851, 2016 www.geosci-model-dev.net/9/1827/2016/ doi:10.5194/gmd-9-1827/2016 © Author(s) 2016. CC Attribution 3.0 License.



Inconsistent strategies to spin up models in CMIP5: implications for ocean biogeochemical model performance assessment

Roland Séférian<sup>1</sup>, Marion Gehlen<sup>2</sup>, Laurent Bopp<sup>2</sup>, Laure Resplandy<sup>3,2</sup>, James C. Orr<sup>2</sup>, Olivier Martl<sup>2</sup>, John P. Dunne<sup>4</sup>, James R. Christian<sup>5</sup>, Scott C. Doney<sup>6</sup>, Tatiana Ilyina<sup>7</sup>, Keith Lindsay<sup>8</sup>, Paul R. Halloran<sup>6</sup>, Christoph Heinze<sup>10,13</sup>, Joachim Segechneider<sup>12</sup>, Jerry Tjiputra<sup>11</sup>, Olivier Aumont<sup>13</sup>, and Anastasia Romanou<sup>14,15</sup>

Models have issues also - often large biases and unphysical states

To answer this question we <u>better global state estimates</u> that allow us to really understanding the processes

This allows us to understand the processes and mechanisms

Can we the use the increasing observations?



#### Physics drives changes?

# LETTER

doi:10.1038/nature21068

# Recent increase in oceanic carbon uptake driven by weaker upper-ocean overturning

Tim DeVries<sup>1,2</sup>, Mark Holzer<sup>3,4</sup> & Francois Primeau<sup>5</sup>

NEWS & VIEWS RESEARCH

CLIMATE SCIENCE

# Ocean circulation drove increase in CO<sub>2</sub> uptake

The ocean's uptake of carbon dioxide increased during the 2000s. Models reveal that this was driven primarily by weak circulation in the upper ocean, solving a mystery of ocean science. SEE LETTER P.215



#### *Physics drives changes?*

# LETTER

doi:10.1038/nature21068

# Recent increase in oceanic carbon uptake driven by

Tim DeVries<sup>1</sup>

weak Is getting getting a better representation of the physics or ocean state the key to bringing models and observations together?



# **Ocean circulation drove** increase in CO<sub>2</sub> uptake

The ocean's uptake of carbon dioxide increased during the 2000s. Models reveal that this was driven primarily by weak circulation in the upper ocean, solving a mystery of ocean science. SEE LETTER P.215



#### Goal:

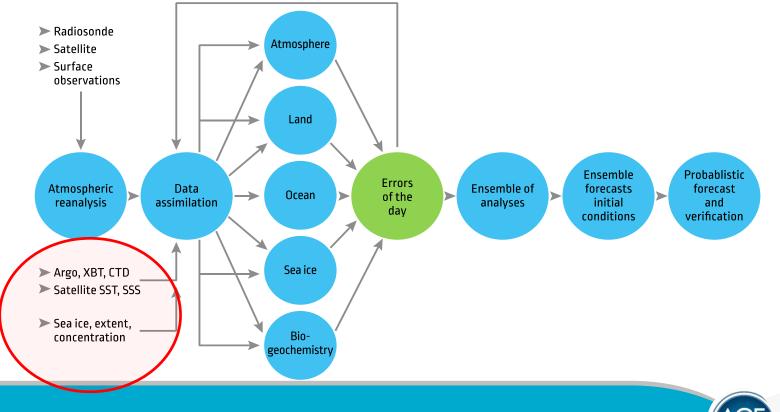
### CLIMATE ANALYSIS FORECAST ENSEMBLE

sustem

CSIR

Simulate the response of the ocean carbon cycle in a framework dynamically consistent with the physical changes

#### Coupled Data Assimilation - > Forecasts

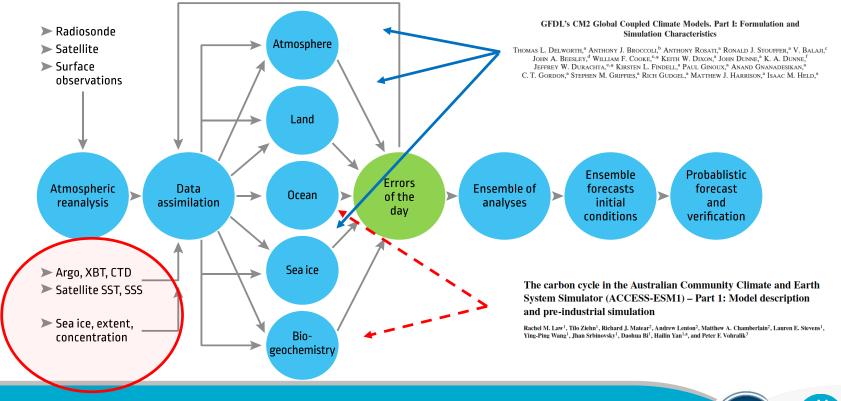


#### Goal:

sustem

Simulate the response of the ocean carbon cycle in a framework dynamically consistent with the physical changes

Coupled Data Assimilation - > Forecasts



# Simulations

Physical Coupled Model spun up for 1000+ years -> used to build covariance matrices

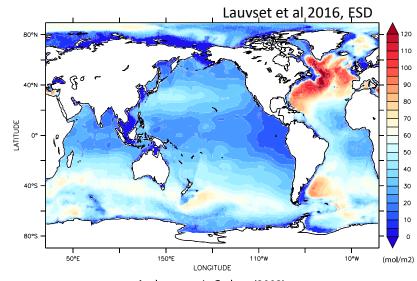
Physical assimilation to remove model biases 2002 -2016

-> why 2002 - data!!!

BGC initialized with GLODAP V2 in 2002, observed Chla

Driven with GCP atmospheric history between 2002 and 2016

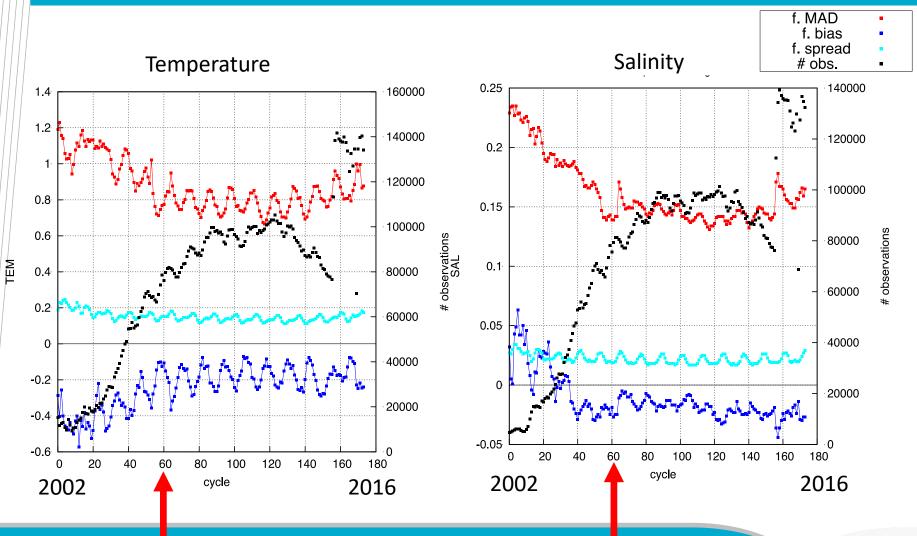
Focus on 2006 onwards ->



Anthopogenic Carbon (2002)



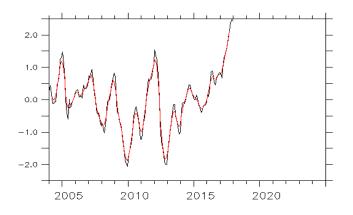
## Physically Assessment- Total Ocean



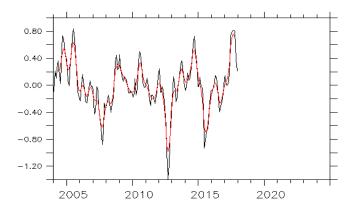


## Physically Assessment – Major Climate Modes

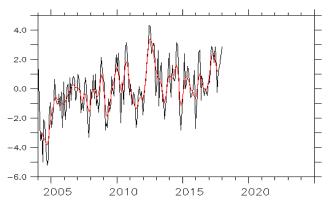
Nino 3.4



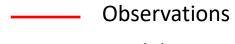
#### Indian Ocean Dipole



#### Southern Annular Mode



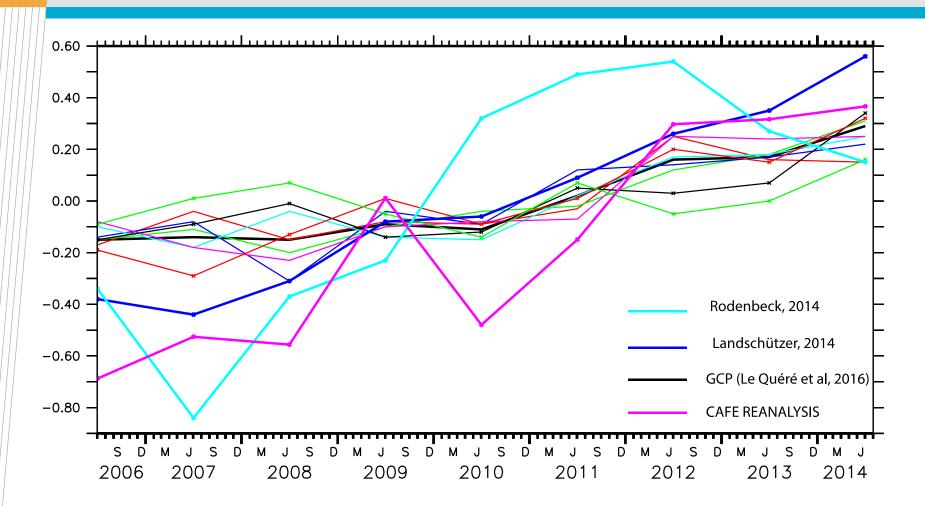
#### Major Climate Modes Well Reproduced





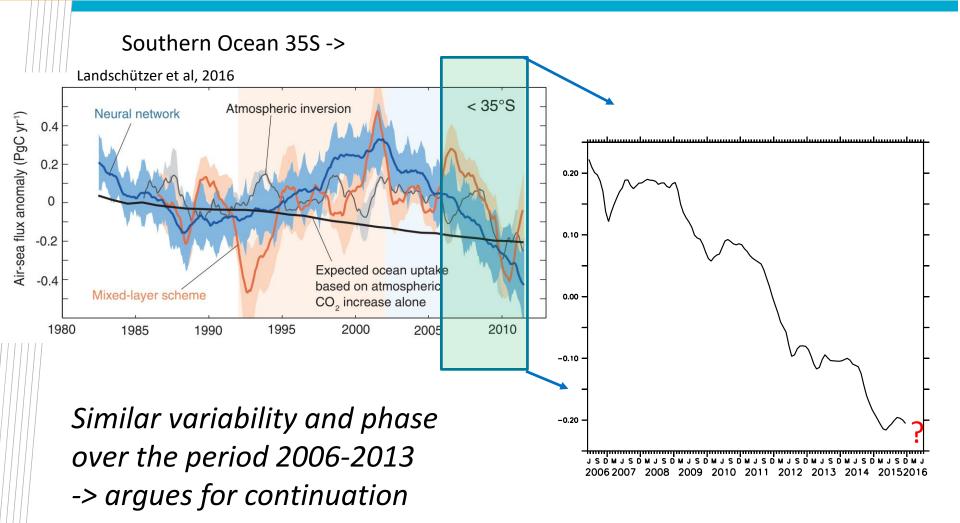


## Global Responses Anomalies 2006-2014



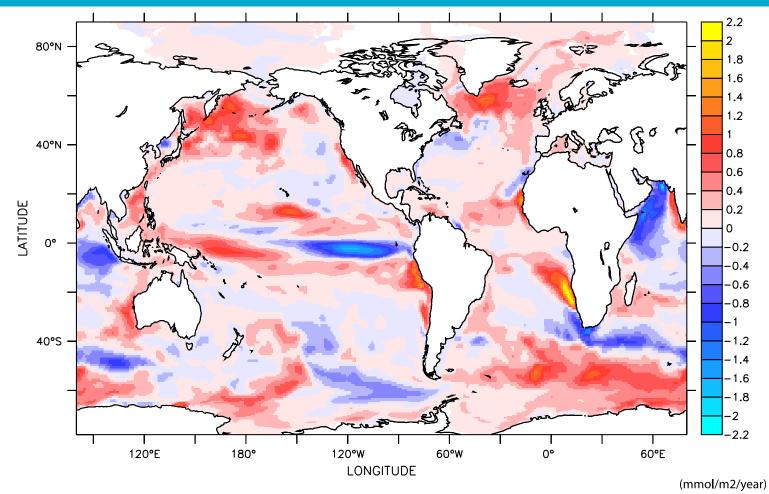
Models: Buitenhuis et al ,2010, Aumont and Bopp, 2006, Doney et al 2009, Assman et al; 2010, Oke et al 2014, Hauck, 2013, Séférian et al, 2013

#### Results: Southern Ocean



ACE CSIRO

#### Results – Global Trends

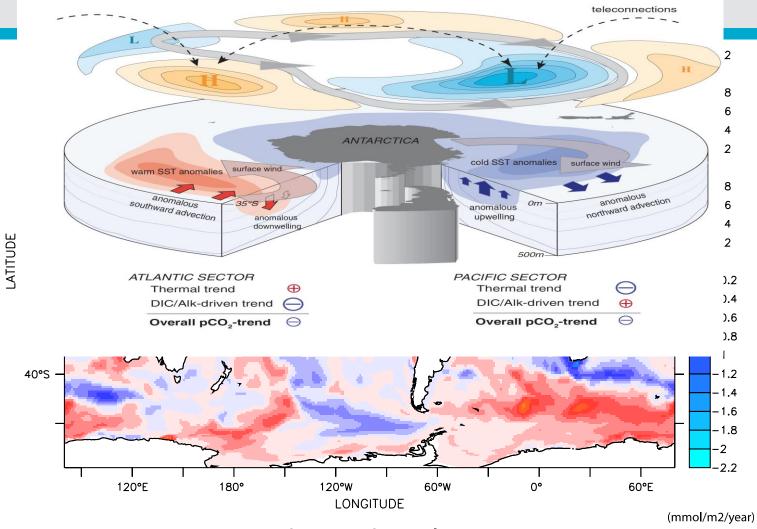


Linear Trends in Carbon Fluxes (2006-2016)



## Results – Global Trends

#### Landschützer et al, 2016



Linear Trends in Carbon Fluxes (2006-2016)









Early Stages.....

Improving the state estimation improves the carbon response and closes the gap between models and observations

Hopefully this will a product for the Global Carbon Budget Update

More work to do : SOCAT, SOCCOM, atmospheric observations and others

Allows to probe mechanisms and improve our representation of processes e.g. biological pump

Can't go back much more than a decade and requires computer resources

**RECCAP -2 ? Exciting – seasonality improved** 





#### GOAL -> Forecasts, in the land and ocean

More information/future



Decadal Forecasting Project

Home C

me CAFE system

Observations and Processes

Processes Verification

Verification and Applications

 $\overline{\mathbf{a}}$ 

More -

CSIRO

### Welcome to the CSIRO Climate Analysis Forecast Ensemble System

Research and development to deliver multi-year climate forecasts for Australia.

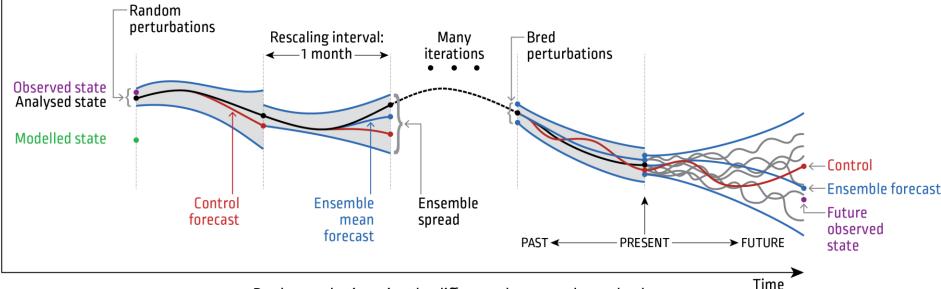
Dive in

https://research.csiro.au/dfp/

# Methodology

Random initial perturbations with prescribed RMS whose amplitude defines the rescaling.

Forecast evolution



Bred perturbations: i.e. the difference between the evolved perturbed forecasts and the control, renormalised via the norm defined by the RMS of the initial perturbations and the length of the rescaling interval.

