



# **Assessing and tuning model parameterizations**

**Cécile Hannay**

**Community Atmosphere Model (CAM) liaison  
Climate and Global Dynamics (CGD) Laboratory  
National Center for Atmospheric Research (NCAR)**

# Recipe to include a new parameterization



**Developing the parameterization**



**Assessing the parameterization => Part I**



**Tuning the model => Part 2**



**Bon appétit**

# Part I:Assessing the parameterization



## The straightforward road

- **Climate runs**



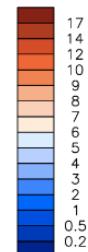
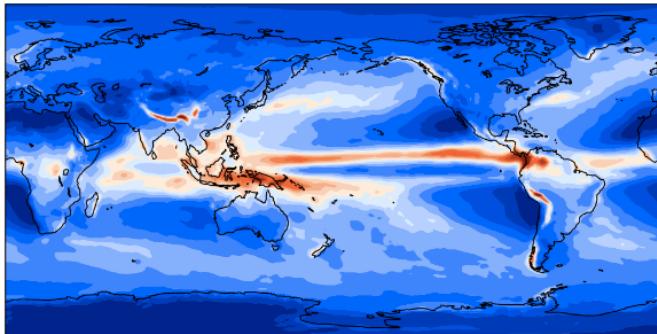
## Alternate ways

- **Forecasts runs**
- **Single Column Model**

# Climate runs

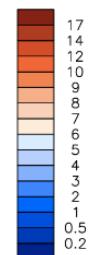
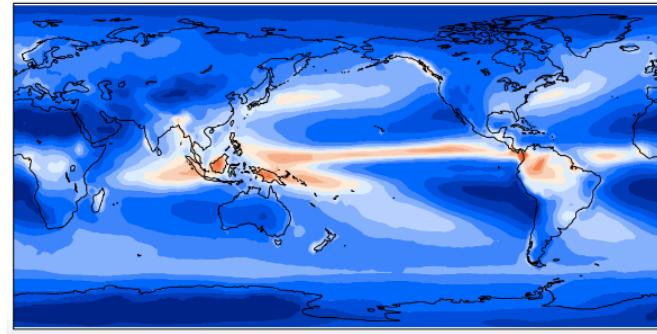
## Precipitation (ANN, 10-year)

Precipitation rate mean = 3.07 mm/day



CAM

Precipitation rate mean = 2.67 mm/day



GPCP

## Strategy

- Make multiple-year run
- Compare the climatology with observations
- Probabilistic approach

## Advantages

- Tests the parameterization as it is intended to be used

## Limitations

- Very expensive
- Results are complicated and depend on all aspects of the model (physics, dynamics, feedback)

## How many years do we need ?

- 1-year can be enough to have a quick look at global means
- 5-year is needed to look at the tropics
- 10-year is needed to capture variability in the Arctic

# Typical climate runs to assess parameterization

## CAM standalone (no active ocean)

- **AMIP runs**

**Standard protocol for testing GCMs**  
**GCM is constrained by realistic sea surface temperature and sea ice from 1979-2005**



- **Climo SSTs**

**Variant of AMIP**  
**Use 12-month climatologies for boundary datasets**  
**Repeat year 2000 to produce present day climate**

## Fully coupled model (atm+Ind+ocn+ice)

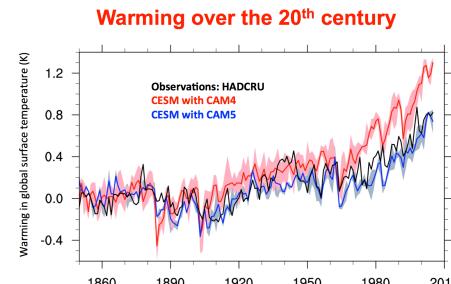
- **1850 control**

**Control simulation for pre-industrial time**  
**Repeat year 1850 to produce pre-industrial climate**



- **20th century**

**Simulation of the 20<sup>th</sup> century**

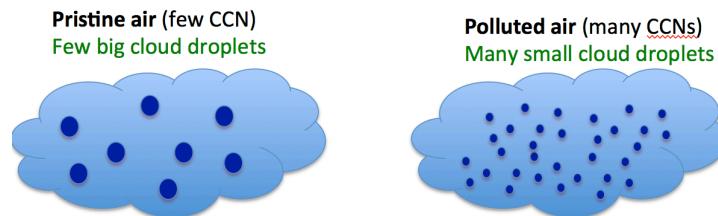


# Typical climate runs to assess parameterization

## Aerosol effect

- Amplitude of cooling (direct and indirect effect)

Two climo SSTs runs with every kept the same except aerosols (pre-industrial versus present day)



## Climate sensitivity

- Equilibrium change in surface temperature due to a doubling of CO<sub>2</sub>

Slab Ocean Model runs with 1xCO<sub>2</sub> and 2xCO<sub>2</sub>

# A quick way to look at a climate run

## The AMWG diagnostics package

### AMWG diags tool

### Compute climos

### Create a webpage with 100s of tables and plots

- global means
- zonal means
- lat/lon plots
- annual cycle
- cloud simulator
- Taylor diagrams
- and many more...

### Comparison Model to observations Model to model

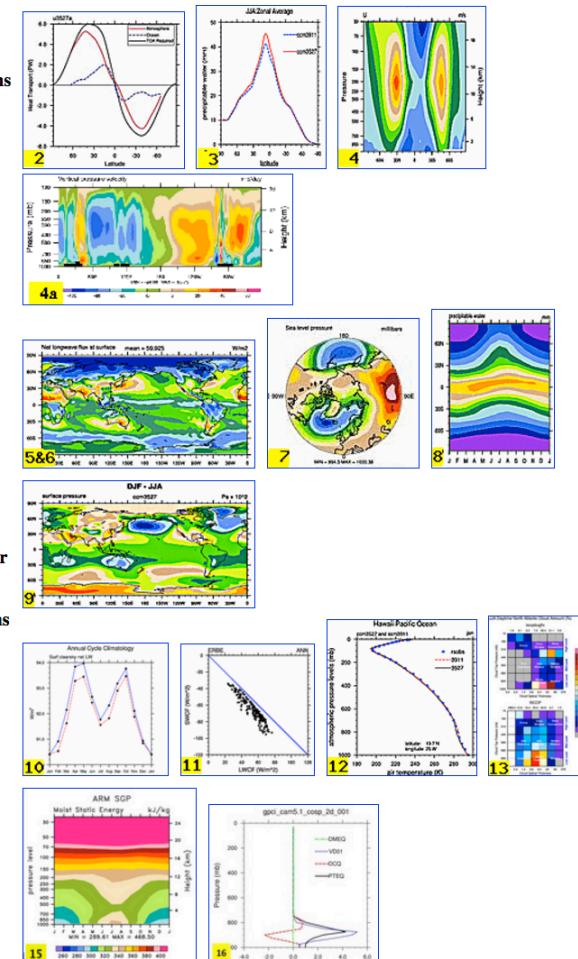
Coming soon



#### Set Description

- 1 [Tables](#) of ANN, DJF, JJA, global and regional means and RMSE.
- 2 [Line plots](#) of annual implied northward transports.
- 3 [Line plots](#) of DJF, JJA and ANN zonal means
- 4 Vertical [contour plots](#) of DJF, JJA and ANN zonal means
- 4a Vertical (XZ) [contour plots](#) of DJF, JJA and ANN meridional means
- 5 Horizontal [contour plots](#) of DJF, JJA and ANN means
- 6 Horizontal [vector plots](#) of DJF, JJA and ANN means
- 7 Polar [contour and vector plots](#) of DJF, JJA and ANN means
- 8 Annual cycle [contour plots](#) of zonal means
- 9 Horizontal [contour plots](#) of DJF-JJA differences
- 10 Annual cycle line [plots](#) of global means
- 11 Pacific annual cycle, Scatter plot [plots](#)
- 12 Vertical profile [plots](#) from 17 selected stations
- 13 Cloud simulators [plots](#)
- 14 Taylor Diagram [plots](#)
- 15 Annual Cycle at Select Stations [plots](#)
- 16 Budget Terms at Select Stations [plots](#)

#### Click on Plot Type

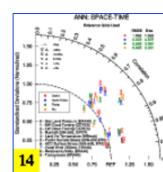
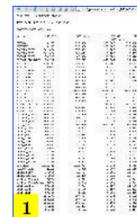


#### WACCM Set Description

- 1 Vertical [contour plots](#) of DJF, MAM, JJA, SON and ANN zonal means (vertical log scale)

#### Chemistry Set Description

- 1 [Tables / Chemistry](#) of ANN global budgets
- 2 Vertical Contour Plots [contour plots](#) of DJF, MAM, JJA, SON and ANN zonal means
- 3 Ozone Climatology [Comparisons](#) Profiles, Seasonal Cycle and Taylor Diagram
- 4 Column O3 and CO [lon/lat](#) Comparisons to satellite data
- 5 Vertical Profile [Profiles](#) Comparisons to NOAA Aircraft observations
- 6 Vertical Profile [Profiles](#) Comparisons to Emmons Aircraft climatology
- 7 Surface observation [Scatter Plot](#) Comparisons to IMROVE

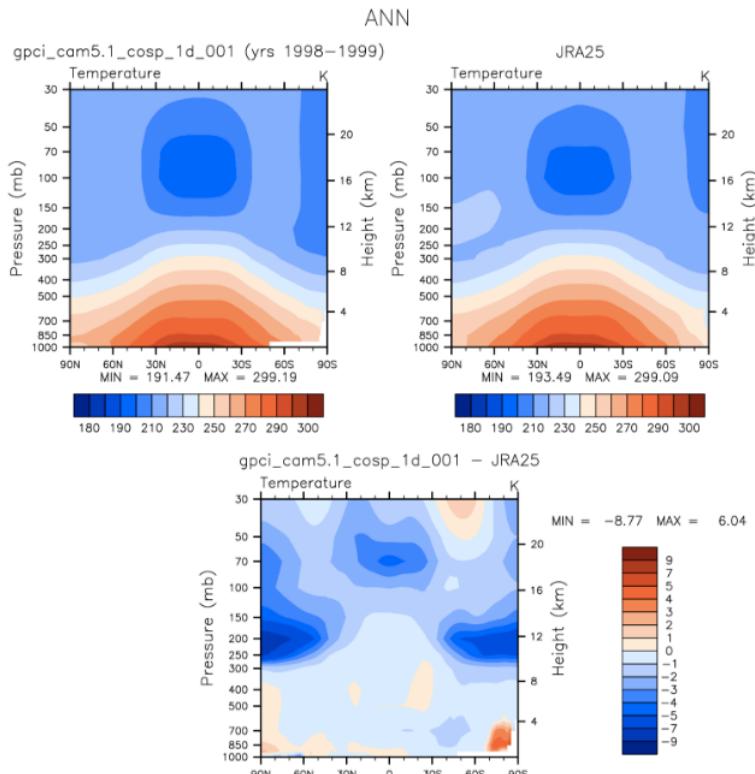


TABLES

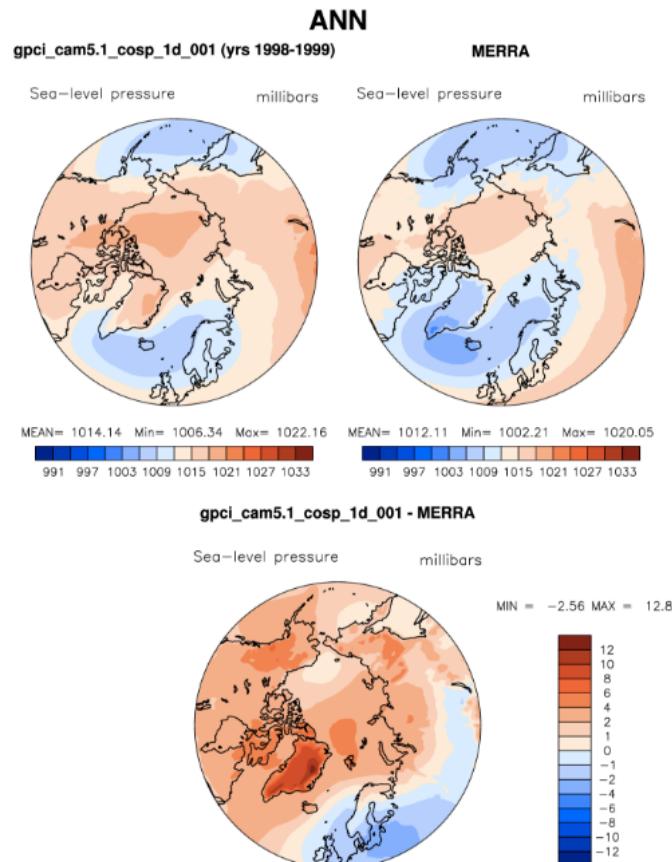
METRICS

# The AMWG diagnostics package: Examples

## Zonal mean: Temperature



## Polar plots: Sea level pressure

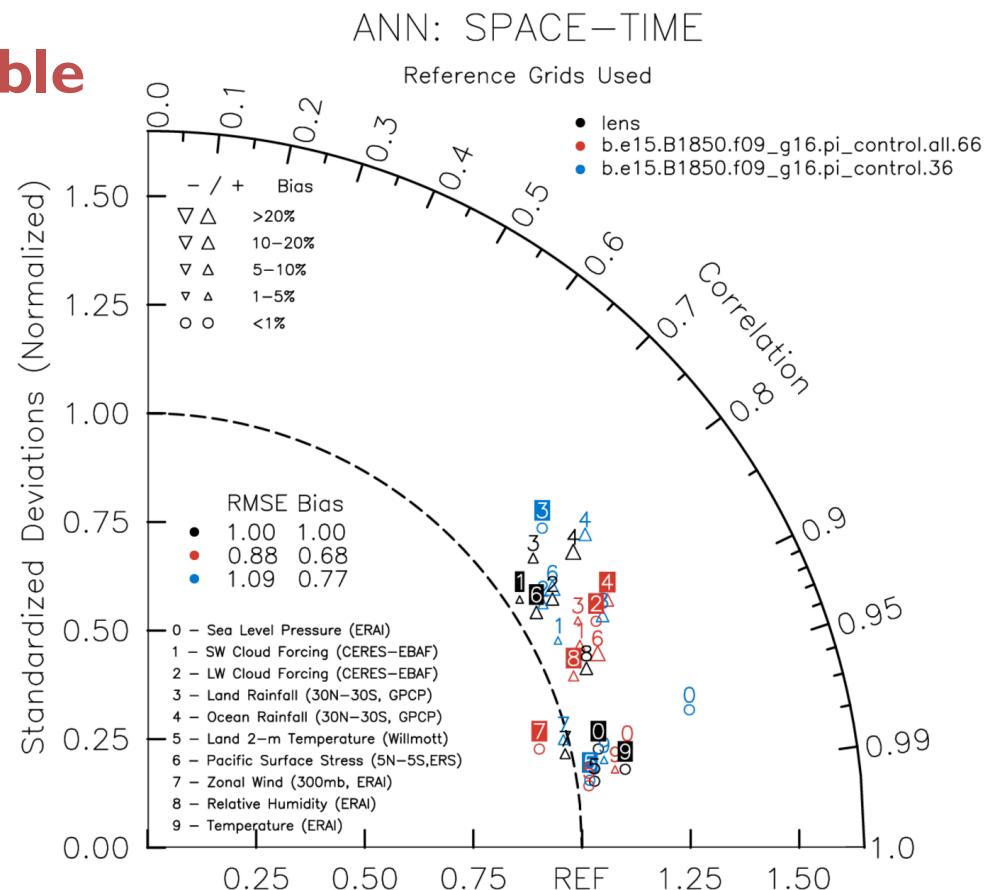


# Taylor diagrams

**Metrics: condense information about variance and RMSE of 10 variables we consider important, when compared with observations**

**Reference = Large-ensemble  
(LENS)**

	RMSE	Bias
LENS	1.00	1.00
CESM2	0.88	0.68
CESM1.5	1.09	0.77



# Everything you need to know about the AMWG diags

<https://www2.cesm.ucar.edu/working-groups/amwg/amwg-diagnostics-package>

The screenshot shows the NCAR CESM website with the following details:

- Header:** Home, About, Administration, Working Groups (highlighted in orange), Models, Events, Publications, Projects, Closures/Emergencies, Locations/Directions.
- Logo:** NCAR UCAR CESM COMMUNITY EARTH SYSTEM MODEL.
- Tagline:** earth • modeling • climate
- Breadcrumbs:** Home » Working Groups » Atmosphere Model
- Section:** Atmosphere Model
- Section:** AMWG DIAGNOSTICS PACKAGE
- Section:** ABOUT THE AMWG DIAGNOSTICS PACKAGE

The AMWG diagnostics package produces over 600 plots and tables from CCSM (CAM) monthly netcdf files.

The diagnostics package computes climatological means of the simulations and produced plots and tables of the mean climate in a variety of formats. The diagnostics package can be used to compare two CCSM (CAM) model simulations or for comparing a model simulation to the observational and reanalysis data. (Information about the AMWG datasets can be found in the Climate Data Guide.)
- Section:** EXAMPLES OF THE WEBPAGES CREATED BY THE DIAGNOSTICS PACKAGE

Included in the package are HTML files which provide the infrastructure for a basic website for the display of all your plots and tables. The c-shell script has a switch for creating webpages automatically. When this is used the end result of running the script is a tar file of all the plots in gif, jpg or png format and the needed html files organized in the proper subdirectories. The user can then untar this file in a directory of their choosing and create a link to it.

  - Model fields compared with observational data [plots](#)
  - Comparison of two different models [plots](#)
  - CAM-chem diagnostics [plots](#)
- Sidebar:** AMWG DIAGNOSTICS PACKAGE
  - Package Overview
  - What's new?
  - Where to find the code?
  - AMWG Dataset Information
  - Documentation
  - Support?
  - Mailing List
  - Known Bugs/Problems
  - Copyright & Terms of Use

# **Example of using climate runs to assess parameterization: CAM5.5 assessment process**

**Candidate parameterizations for CAM5.5**

- **Unified Convection scheme (**UNICON**)**
- **Cloud-Layers Unified By Binormals (**CLUBB**)**

**Developers produced full suite of climate simulations  
(AMIP and 1850 control, indirect effect)**

**Simulations reviewed by panel of experts**

**Panel gave a recommendation about CAM5.5**

**To know more, visit:**

[http://www.cesm.ucar.edu/working\\_groups/Atmosphere/development/cam5.5-process/](http://www.cesm.ucar.edu/working_groups/Atmosphere/development/cam5.5-process/)

**See also Rich's talk**

# Part I: Assessing the parameterization



## The straightforward road

- Climate runs

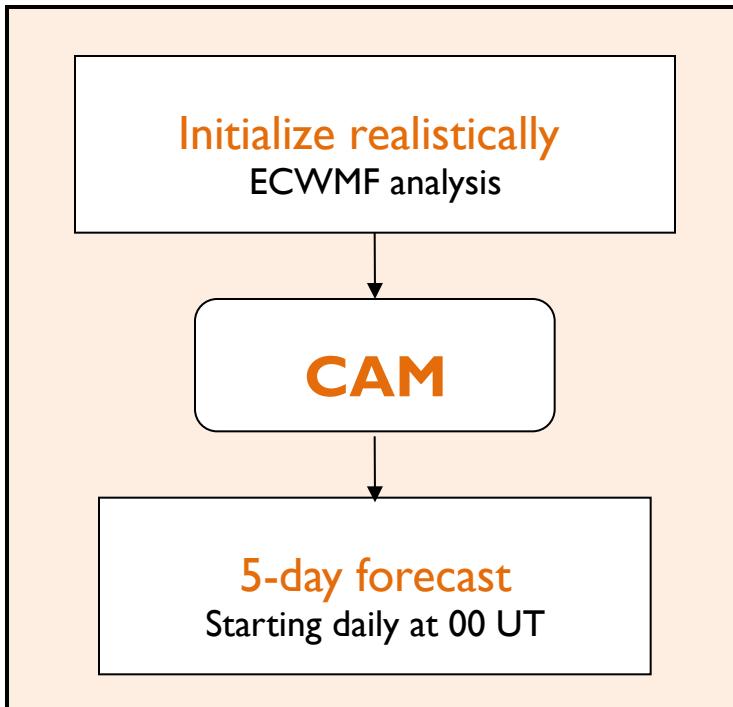
## Alternate ways

- Forecasts runs
- Single Column Model



# Methodology for the forecasts

## Forecast



## Evaluation

AIRS, ISCCP, TRMM, GPCP, SSMI, CloudSat,  
Flash-Flux, ECWMF analyzes

## Strategy

If the atmosphere is initialized realistically, the error comes from the parameterizations deficiencies.

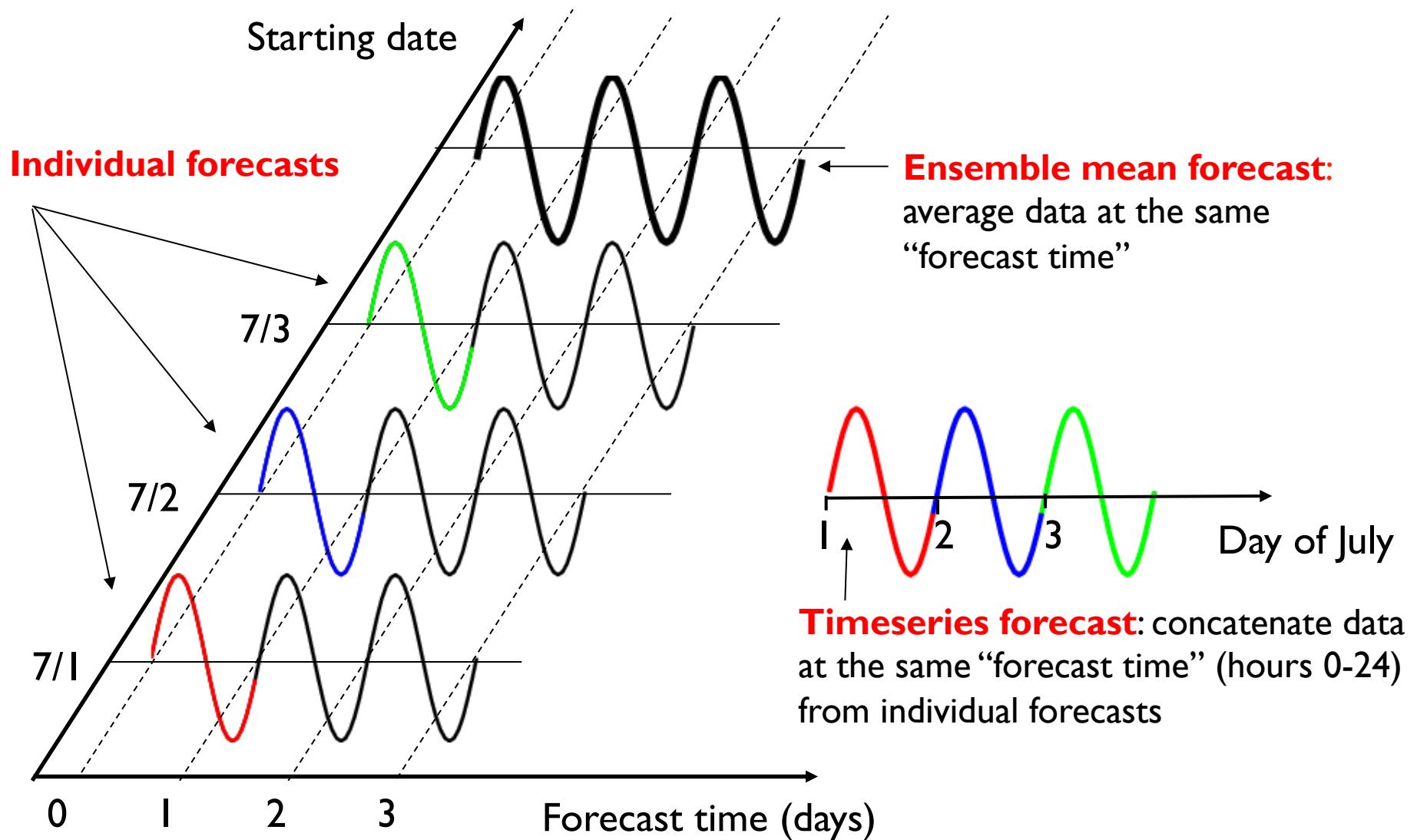
## Advantages

- Evaluate the forecast against observations on a particular day and location
- Evaluate the nature of moist processes parameterization errors before longer-time scale feedbacks develop.

## Limitations

Accuracy of the atmospheric state ?

# Ensemble mean forecast and timeseries forecast



# Clouds: Multiple Categories

## Stratiform (large-scale) clouds

- Responds to large-scale relative humidity



## Shallow convection clouds

- 10 - 100 meters
- Non precipitating (mostly)
- Responds to surface forcing

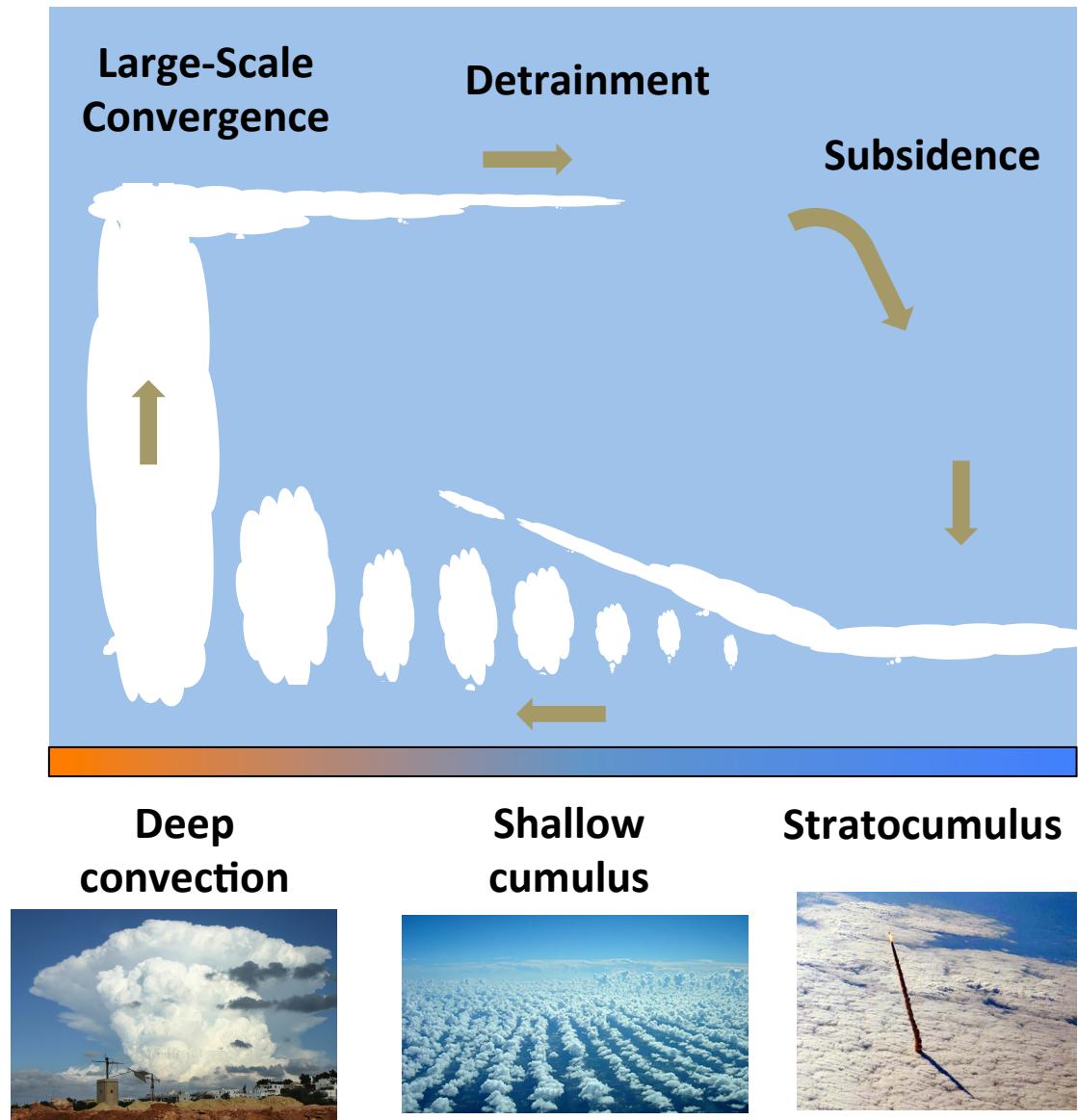
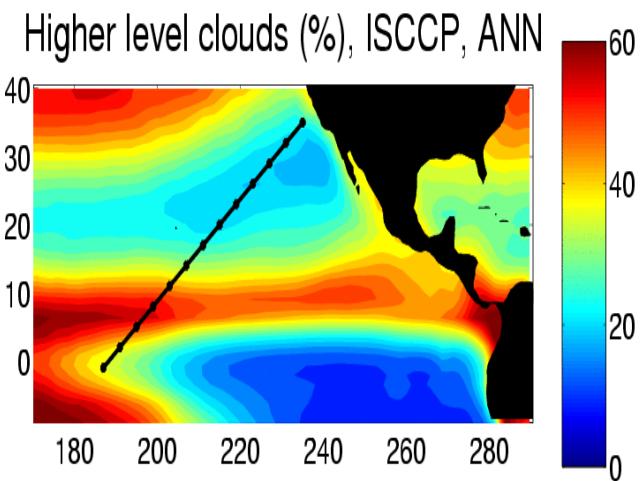
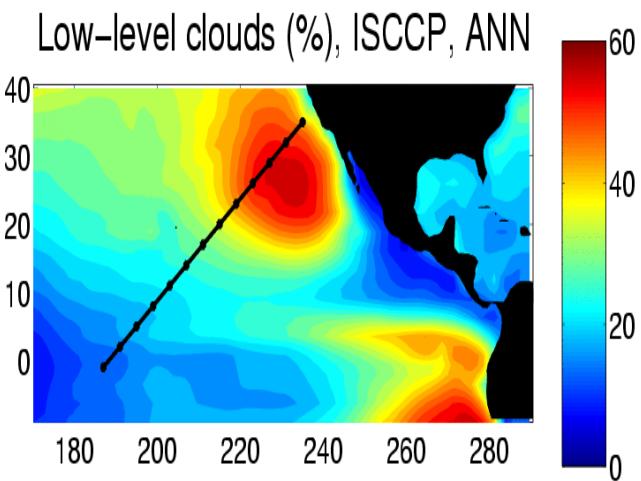


## Deep convection clouds

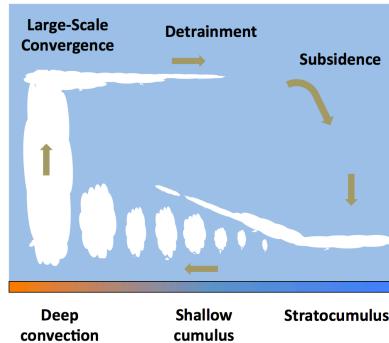
- 100m – 10km
- Penetrating convection (surface -> tropopause)
- Precipitating
- Responds to surface forcing and conditional instability



# Cloud regimes along Pacific Cross-section

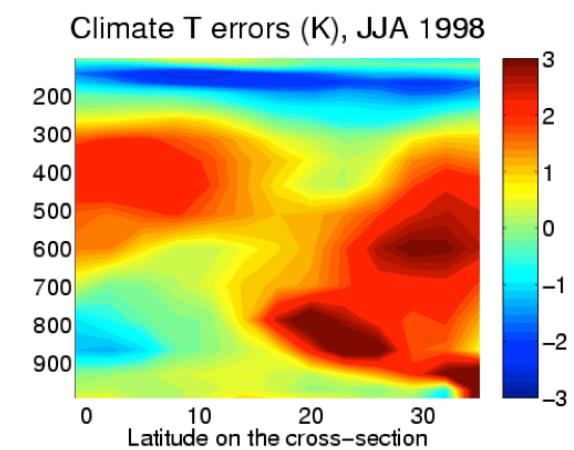
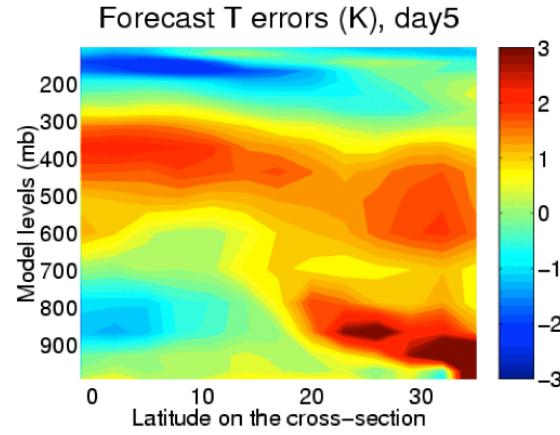
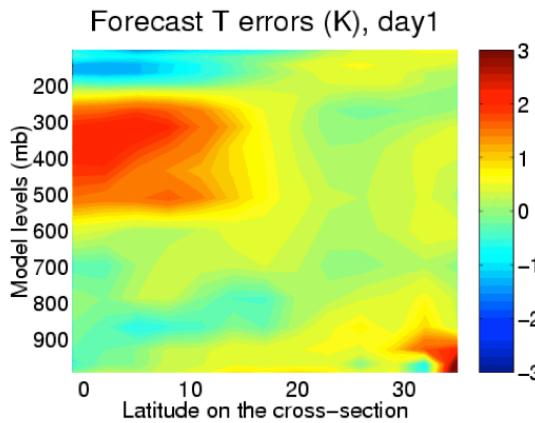


# Forecast and climate errors (JJA 1998)



**Climate bias appears very quickly**

- where deep convection is active, error is set within 1 day
- 5-day errors are comparable to the mean climate errors



# Let's compare forecasts from 3 model versions

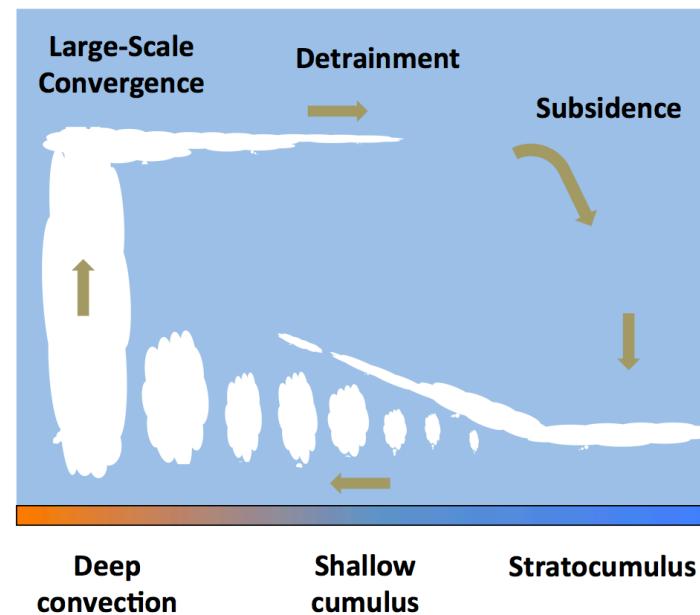
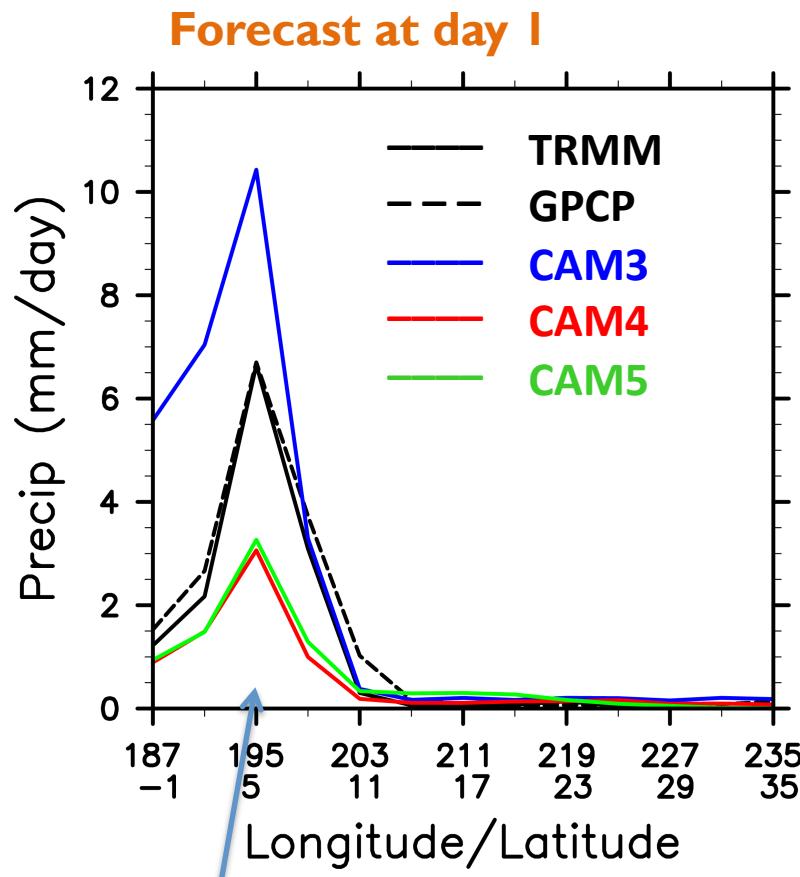
CAM3	Release 2004
CAM4	<b>Release April 2010</b> <b>New physics:</b> <ul style="list-style-type: none"><li>- Deep convection (<b>Neale and Richter, 2008</b>)</li></ul>
CAM5	<b>Release June 2010</b> <b>New Physics:</b> <ul style="list-style-type: none"><li>- Cloud microphysics (<b>Morrison, Gettelman</b>)</li><li>- Radiative Transfer (<b>Iacono, Collins, Conley</b>)</li><li>- PBL and Shallow convection (<b>Bretherton and Park</b>)</li><li>- Macrophysics (<b>Park, Bretherton, Rasch</b>)</li><li>- Aerosol formulation (<b>Ghan, Liu, Easter</b>)</li><li>- Ice clouds (<b>Gettelman, Liu, Park, Mitchell</b>)</li></ul>

## Known issues in CAM3

- Deep convection: **Too much** precipitation
- Stratocumulus: PBL **too shallow**

**What can we learn  
from forecasts  
along cross-section ?**

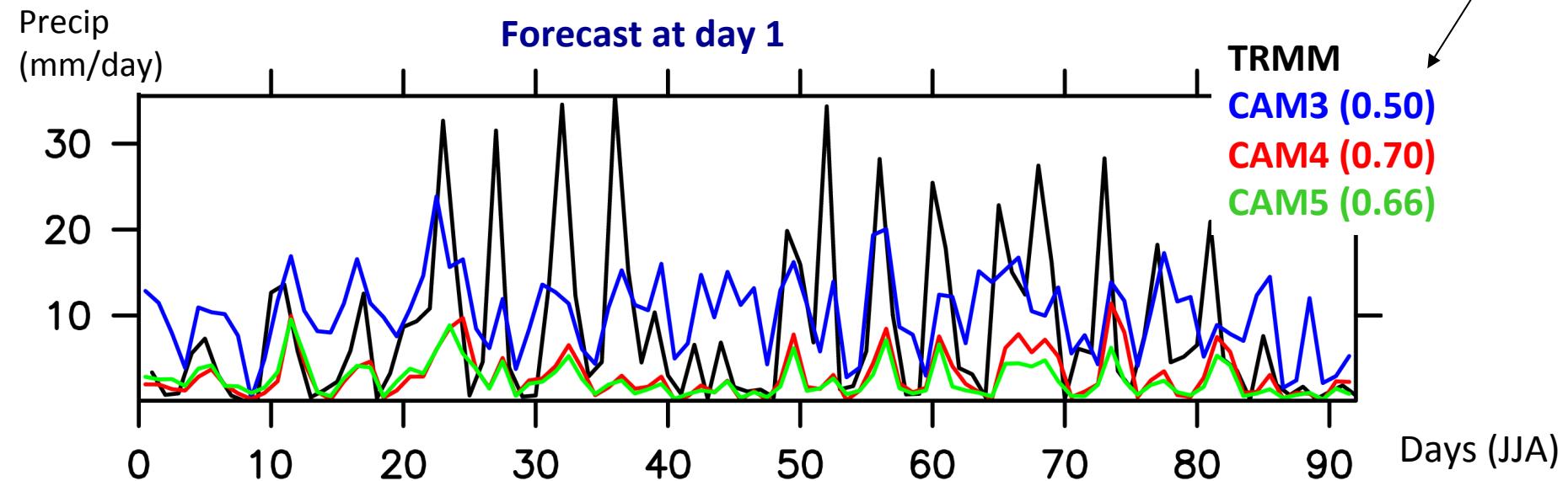
# Precipitation: Monthly means, June 2008



- **CAM3:** overestimates the precipitation in the deep convection
- **CAM4/5:** reduction in the ITCZ precipitation

# Precipitation timeseries in deep convection

Correlation  
with TRMM



In the deep convection zone:

- CAM3: overestimates the precipitation  
rains all the time

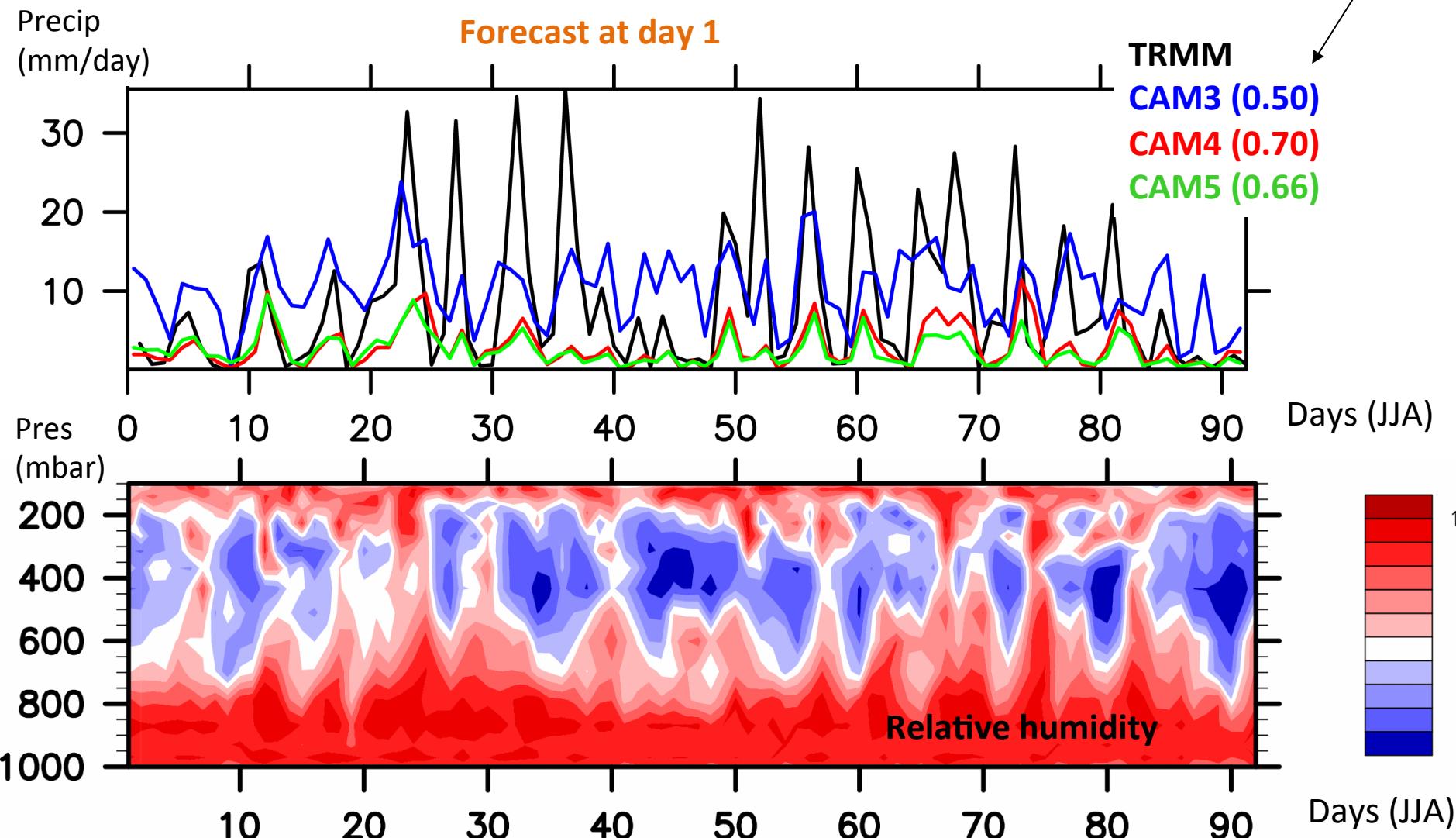
Mixing parcel  $\leftrightarrow$  env

- CAM4/5: reduction in the precipitation  
better correlation with observed precipitation  
underestimates strong events

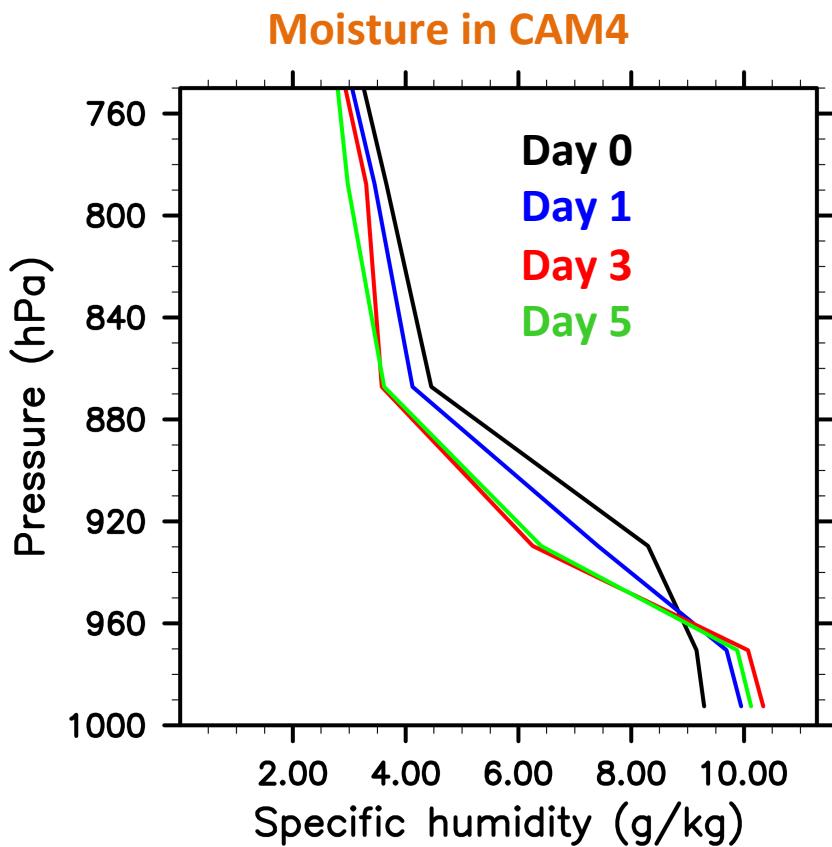
No mixing

Allows mixing

# Precipitation timeseries, JJA 2008

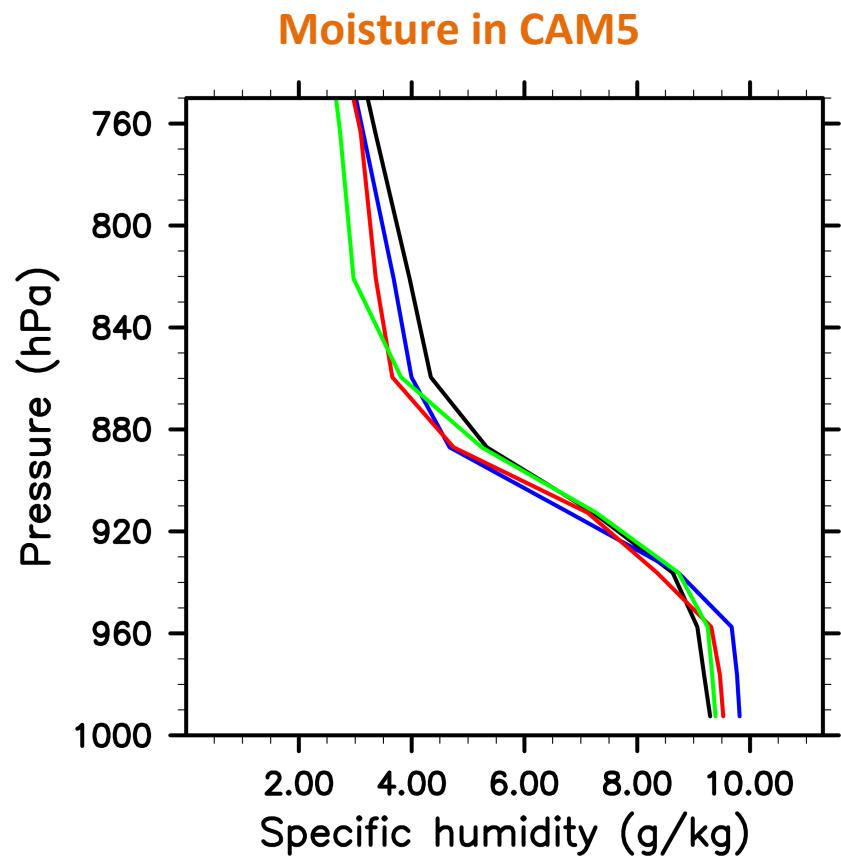


# Moisture profile in the stratocumulus regime



CAM4: PBL collapses

Dry and surface-driven  
PBL scheme



CAM5: PBL height is maintained

scheme based on prognostic TKE  
with explicit entrainment at top of PBL

# What did we learn from forecasts along cross-section ?

**CAM forecasts** allows for diagnosing parameterization errors in different cloud regimes

## **CAM3**

- too much precipitation in deep convection (deep convection scheme: no mixing between the parcel and its environment)
- PBL too shallow in stratocumulus (dry and surface-driven PBL scheme )

## **CAM4**

- dramatic improvement of precipitation in the early forecast with the new convection scheme (entrainment of environment)

## **CAM5**

- new PBL scheme produces deeper and better mixed PBLs (PBL scheme: prognostic TKE with explicit entrainment at top of PBL)

# Part I: Assessing the parameterization



## The straightforward road

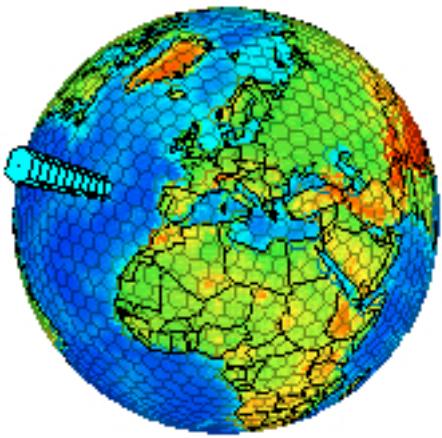
- Climate runs

## Alternate ways

- Forecasts
- Single Column Model



# Single Column Modeling (SCM)



$$\frac{\partial \theta}{\partial t} = \left( \frac{\partial \theta}{\partial t} \right)_{phys} - \left( \vec{V} \cdot \nabla \theta \right)_{obs} - \left( \omega_{obs} \frac{\partial \theta}{\partial p} \right)$$

$$\frac{\partial q}{\partial t} = \left( \frac{\partial q}{\partial t} \right)_{phys} - \left( \vec{V} \cdot \nabla q \right)_{obs} - \left( \omega_{obs} \frac{\partial q}{\partial p} \right)$$

## Observations for:

- horizontal advective tendencies
- vertical velocity
- surface boundary conditions)

## Strategy

- Take a column in **insolation** from the rest of the model
- Use **observations** to define what is happening in neighboring columns

## Advantages

- **Inexpensive** (1 column instead of 1000s)
- Remove **complications from feedback** between physics and dynamics

## Limitations

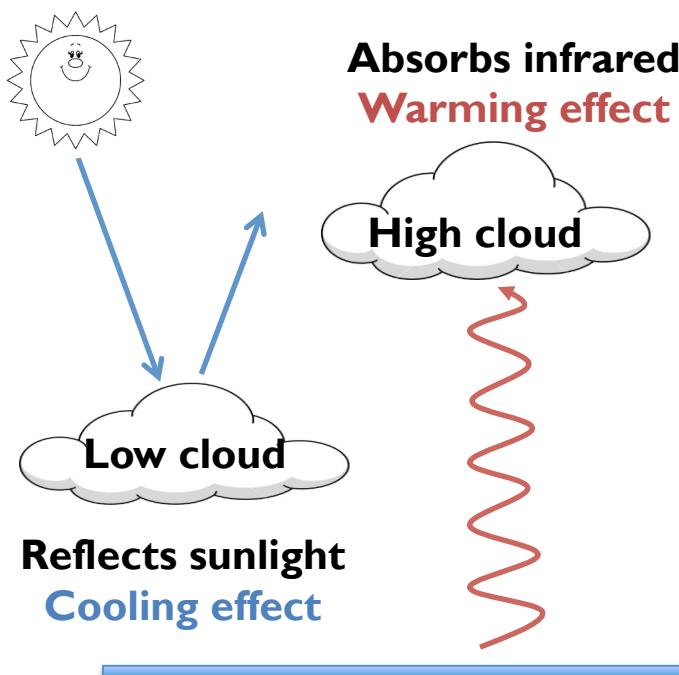
- **Data requirements** (tendencies needs to be accurate to avoid growing error)
- **Cannot detect problem in feedback**

# Example: CGILS study

**Goal: Understanding mechanisms of low cloud feedback in SCM**

## What is low cloud feedback ?

Cloud effect on climate

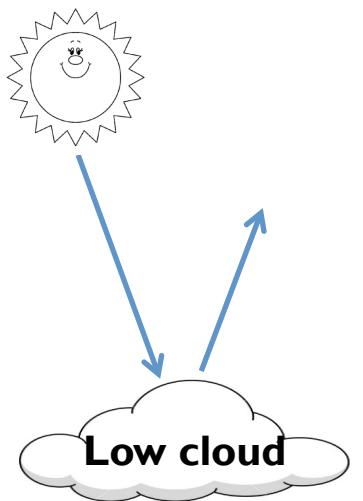


# Example: CGILS study

**Goal:** Understanding mechanisms of **low cloud feedback** in SCM

## What is low cloud feedback ?

### Cloud effect on climate



Reflects sunlight  
**Cooling effect**

### In a warmer climate

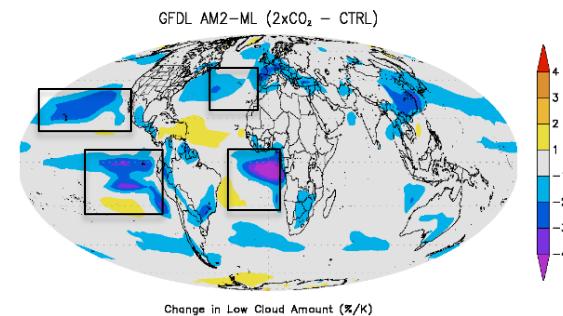


**More low cloud**  
**Cooling effect**  
**Negative feedback**

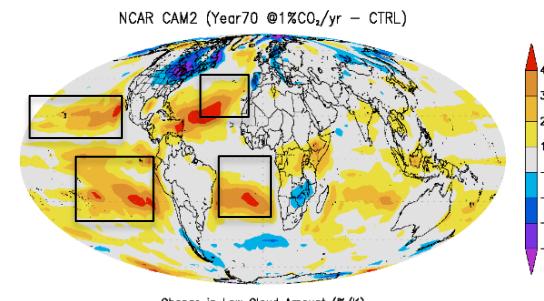


**Less low cloud**  
**Warming effect**  
**Positive feedback**

### Low cloud feedback in 2 US models



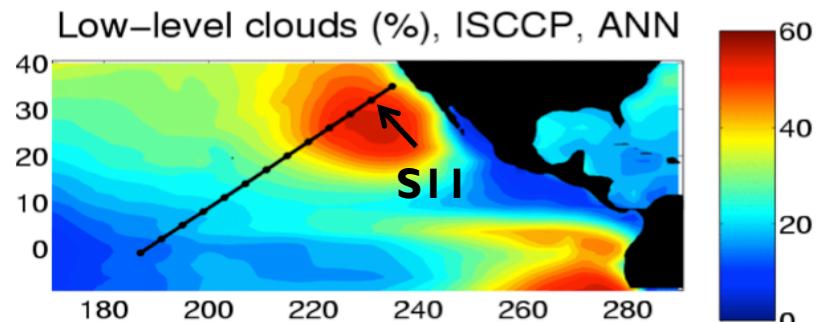
**GFDL: Negative feedback**



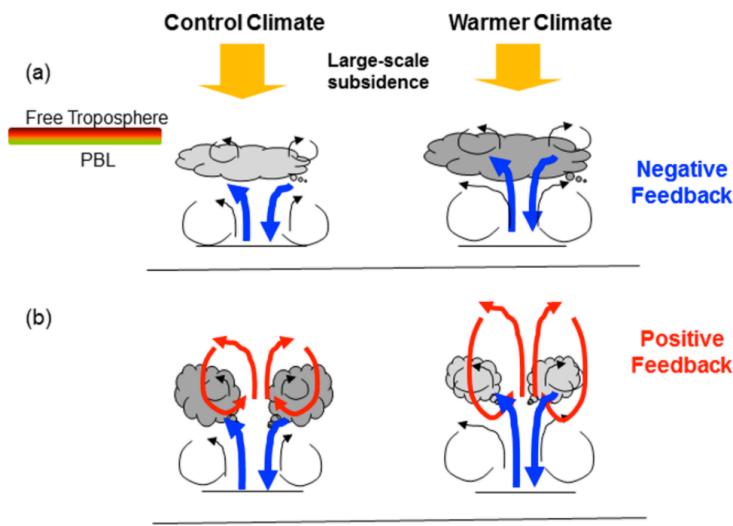
**NCAR: Positive feedback**

# Example: CGILS study

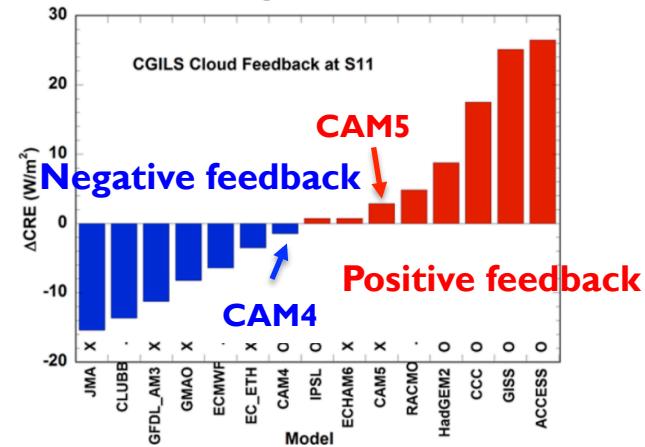
**Goal: Understanding mechanisms of low cloud feedback in SCM**



## Proposed mechanism



**SCM experiments to determine low cloud feedback sign at SII in 15 models**



Models with **no active shallow convection**

Models with **active shallow convection**

In warmer climate

- Enhanced moistening of PBL (**blue arrow**)
- If no active shallow convection => more low cloud
- If active shallow => this is balanced by enhanced shallow convection (**red arrow**) which dries the cloud.

# Part 2:Tuning the model



## Tuning basics



- **Whatsdat ?**
- **Tuning at a glance**

## Example of tuning

- **Tuning of a recent CAM6 run**

## Example of tuning challenge

- **Finite volume versus spectral element coupled run**

# Tuning of the model

- **Tuning** = adjusting parameters (“tuning knobs”) to achieve agreement with observations.

**TOA radiative balance:** Net SW - Net LW  $\sim 0$

- **Tuning knobs** = parameters weakly constrained by obs

- Example:

**rhminl** = relative humidity threshold for low clouds ( $\sim 0.9$ )

rhminl  $\searrow \Rightarrow$  cloud fraction  $\nearrow \Rightarrow$  Net SW at TOA  $\searrow$

# Some tuning parameters in CAM5

Par	Description	Diag
rhminl	relative humidity threshold for low clouds	<a href="#">diag</a>
a2l	Evaporative enhancement factor for stratocumulus-top entrainment rate	<a href="#">diag</a>
rpen	Penetrative entrainment efficiency at the top of shallow convective plume	<a href="#">diag</a>
co_lnd	Auto-conversion efficiency of cumulus condensate into	<a href="#">diag</a>
co_ocn	precipitation over land and ocean	
Dcs	Critical diameter for ice to snow auto-conversion	<a href="#">diag</a>
dp1	parameter for deep convection cloud fraction.	<a href="#">diag</a>

In CAM5: 20<sup>+</sup> tuning knobs

# Tuning process at a glance

- Focus on our favorite variables:

TOA radiative balance

SWCF: SW cloud forcing (= Net SW<sub>all sky</sub> - Net SW<sub>clear sky</sub>)

LWCF: LW cloud forcing (= Net LW<sub>all sky</sub> - Net LW<sub>clear sky</sub>)

PREH2O: precipitable water

Precipitation

- For each diagnostics,  
we have our favorite observation/reanalysis dataset
- Goal: our favorite variables  $\leftrightarrow$  our favorite datasets

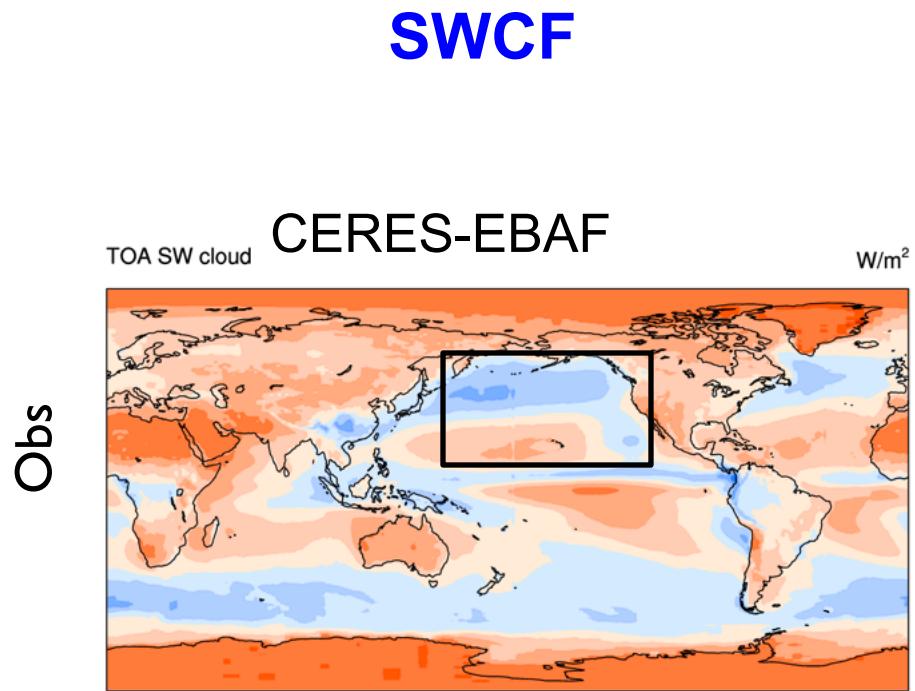
# Tuning process at a glance

- Suite of runs
  - 5-10 year standalone CAM simulations (guidance)
  - 10<sup>+</sup> yr coupled runs (tuning)
- Evaluation of favorite variables versus favorite datasets using AMWG diagnostic package
  - global averages
  - zonal means
  - lat-lon plots
  - Taylor diagrams
  - Timeseries of radiative balance and surface temperature

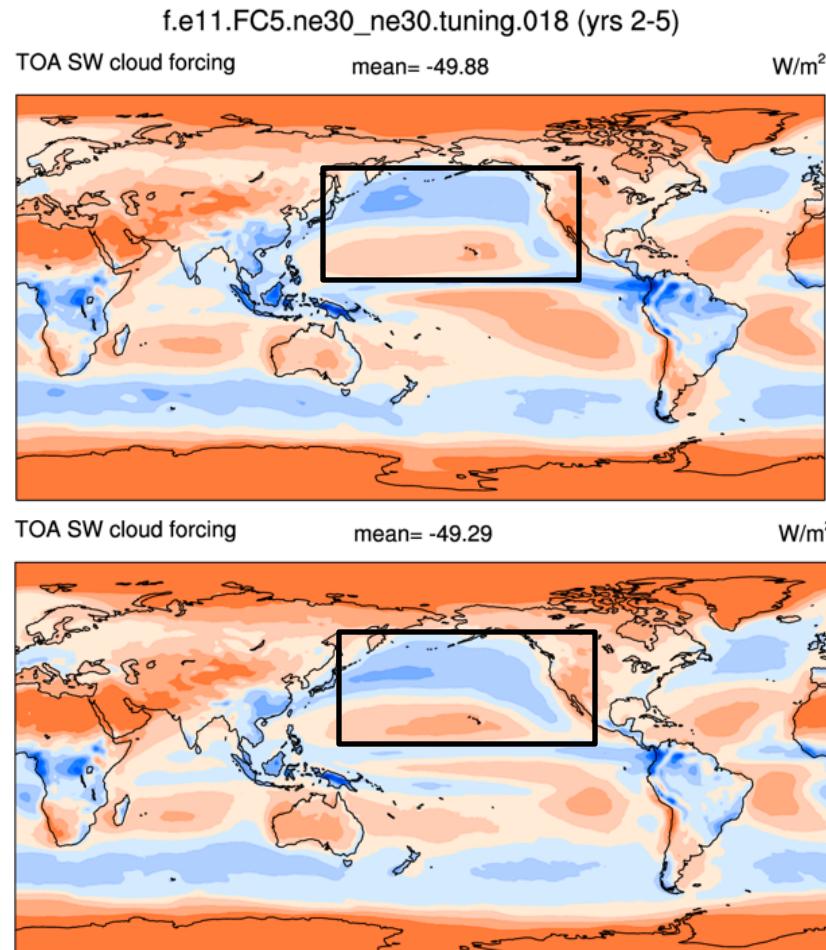


# Why tuning in coupled mode ?

- CAM standalone misses the feedback atm  $\leftrightarrow$  ocn
- Simulation that can look acceptable in standalone can produce runaway coupled simulation



CESM-Coupled CAM - standalone



# Part 2:Tuning the model



## Tuning basics

- **Whatsdat ?**
- **Tuning at a glance**

## Example of tuning



- **Tuning of a recent CAM6 run**

## Example of tuning challenge

- **Finite volume versus spectral element coupled run**

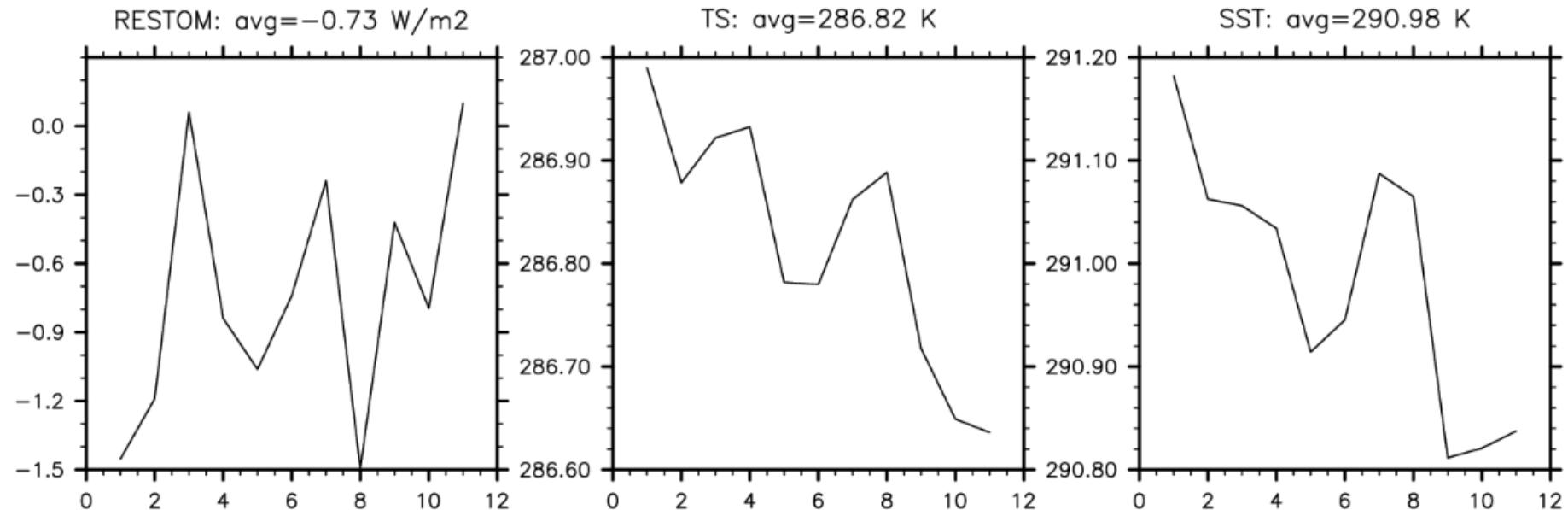
# Example: Tuning of a recent CAM6 run

Timeseries of radiative imbalance and surface temperature

**RESTOM = -0.73 W/m<sup>2</sup>**

**TS is cooling**

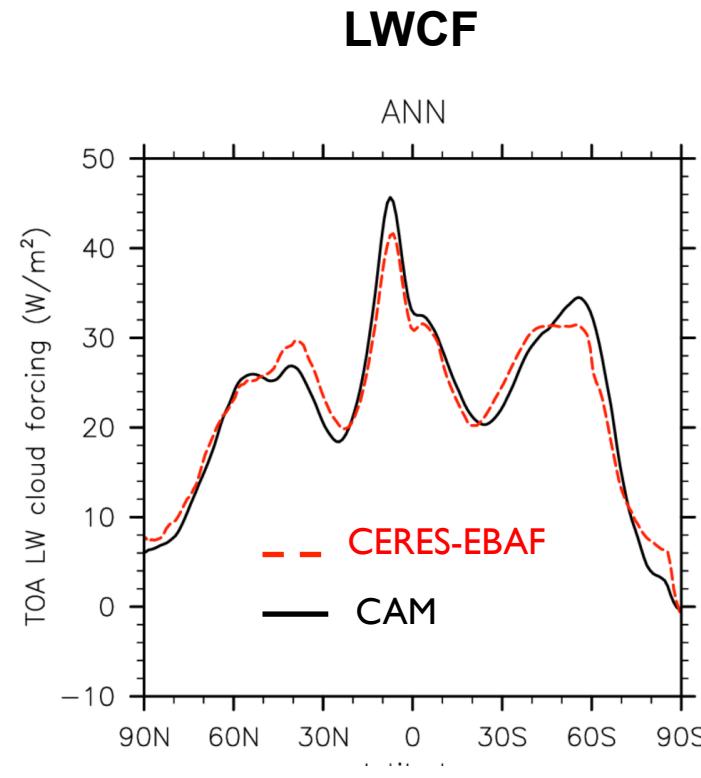
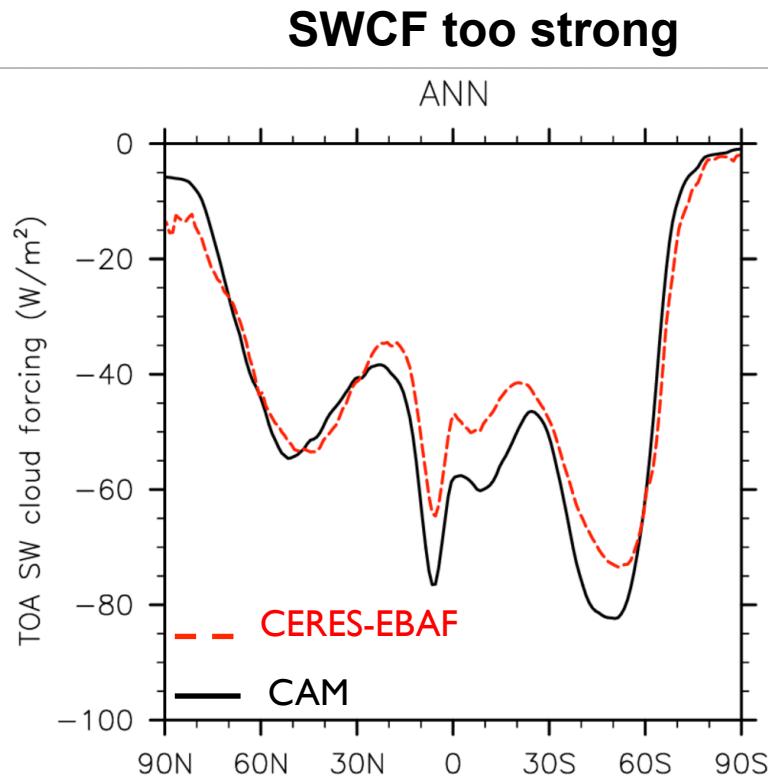
**SST is cooling**



**Negative radiative imbalance and surface temperature cooling**

# Example: Tuning of a recent CAM6 run

## Zonal SW and LW cloud forcing



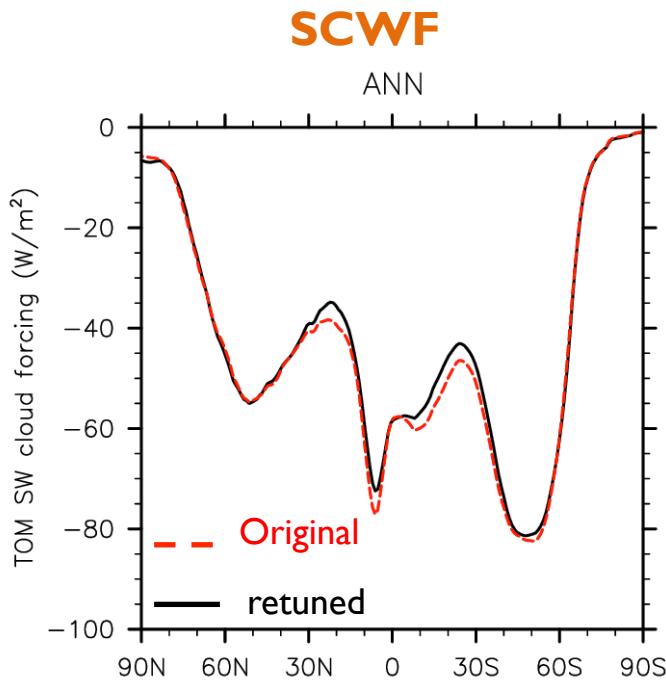
**SWCF: global error of 5  $\text{W/m}^2$**

**LWCF: global error of 0.2  $\text{W/m}^2$**

=> This could explain the cooling

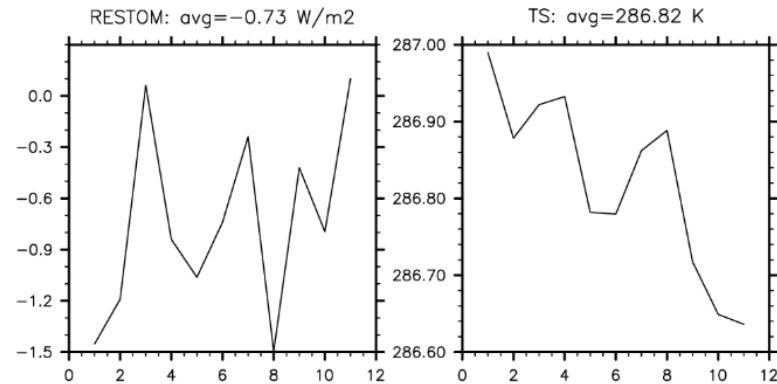
# Example: Tuning of a recent CAM6 run

Adjust parameters to decrease SCWF      => Better radiative balance

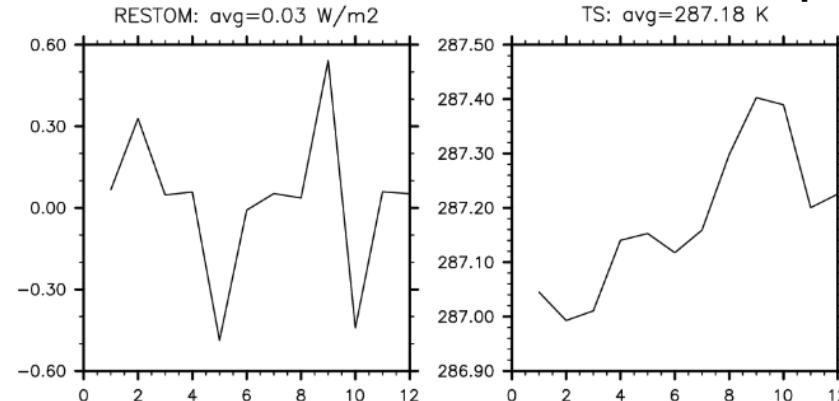


Globally SCWF bias  
is reduced by  $1.7 \text{ W/m}^2$

**Original:**  
Imbalance of  $-0.73 \text{ W/m}^2$ ; surface temperature cooling



**Retuned:**  
Imbalance of  $0.03 \text{ W/m}^2$ ; better surface temperature



# Part 2:Tuning the model



## Tuning basics

- **Whatsdat ?**
- **Tuning at a glance**

## Example of tuning

- **Tuning of a recent CAM6 run**

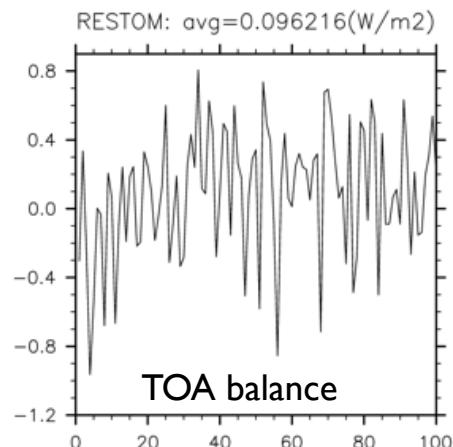
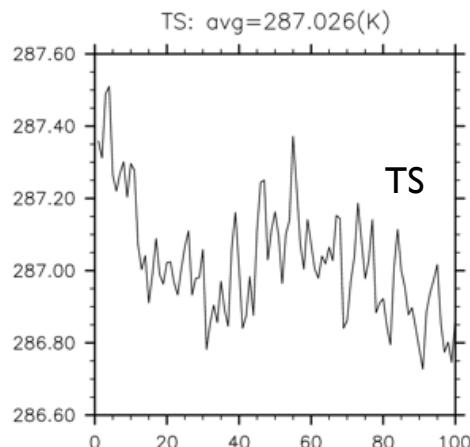
## Example of tuning challenge



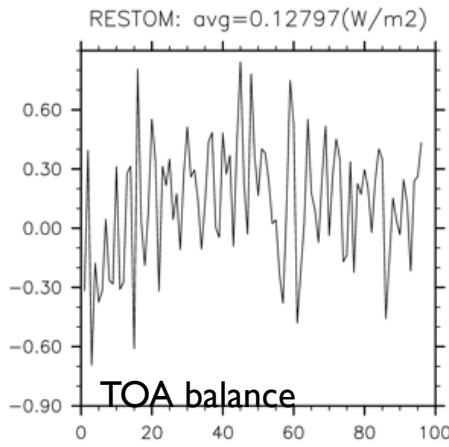
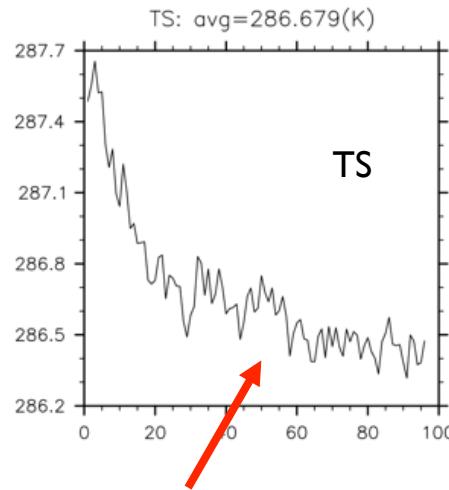
- **Finite volume versus spectral element coupled runa**

# Example of tuning challenge

**CESM1.1: Finite volume (FV)**



**CESM1.2: Spectral element (SE)**



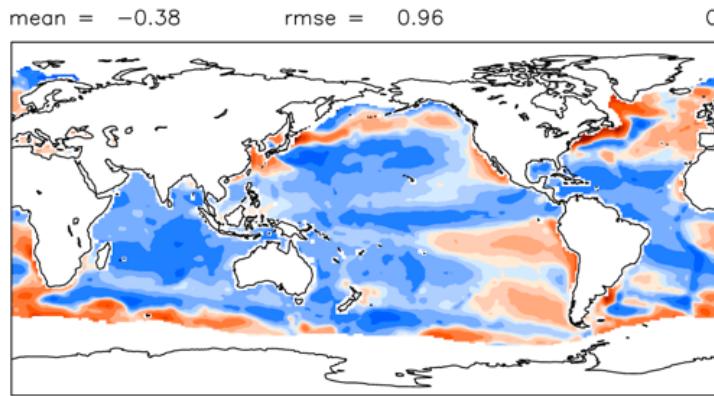
**“Houston, we have problem”**

**Both simulations are started from Levitus and are reasonably balanced.**  
**Finite volume produces a decent surface temperature**  
**Spectral element produces too cold surface temperature**

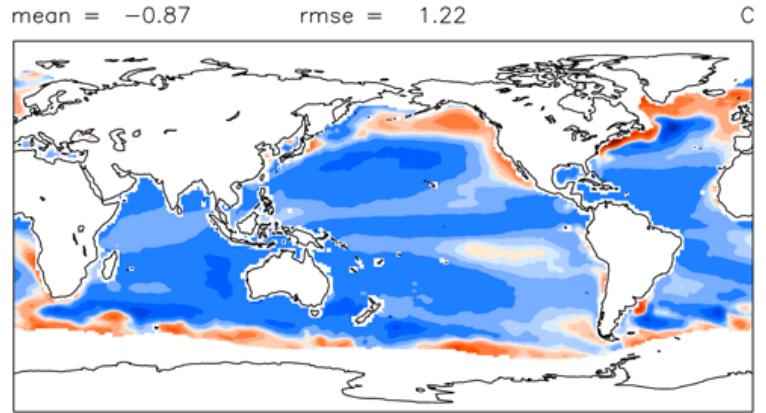
# Sea-Surface Temperature (SST) biases

SSTs compared to HadISST/OI.v2 (pre-industrial)

Finite Volume: Levitus



Spectral Element: Levitus



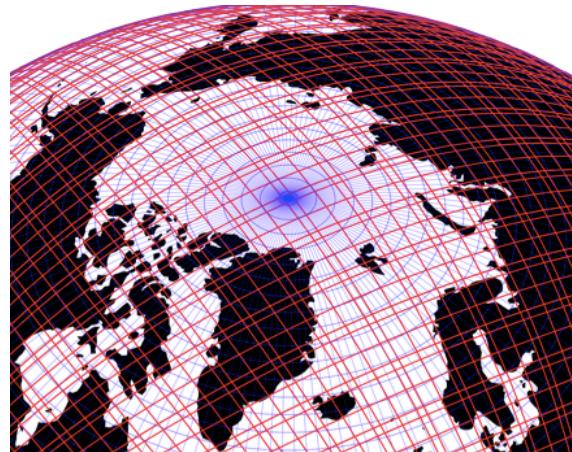
**SSTs stabilize but too cold compared to obs  
SST: 0.5K colder than FV**

# What is different: Finite Volume $\leftrightarrow$ Spectral Element ?

## Tuning parameters

	FV	SE
rhminl	0.8925	0.884
rpen	10	5
dust_emis	0.35	0.55

## Grid differences at high latitudes



Red: CAM-SE grid  
Blue: CAM-FV grid  
(at about 2 degree)

Courtesy:  
Peter Lauritzen

## Topography

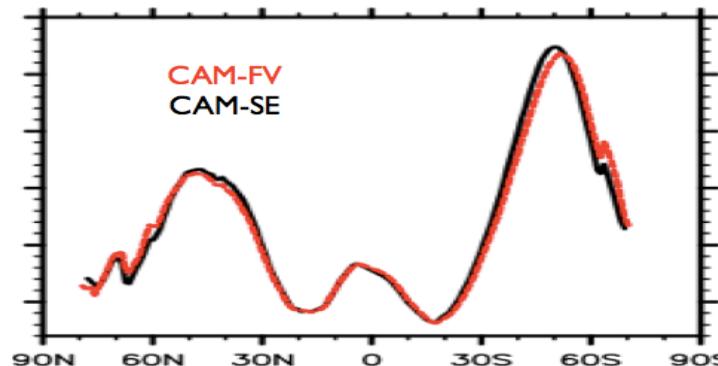
New software to generate topography  
(accommodate unstructured grids and  
enforce more physical consistency)

## Climate

SST colder in SE than FV  
Atmosphere is drier in SE than FV  
Surface stress in Southern Oceans

## Remapping differences (ocn $\leftrightarrow$ atm)

State variables: FV uses “bilinear” and SE “native”

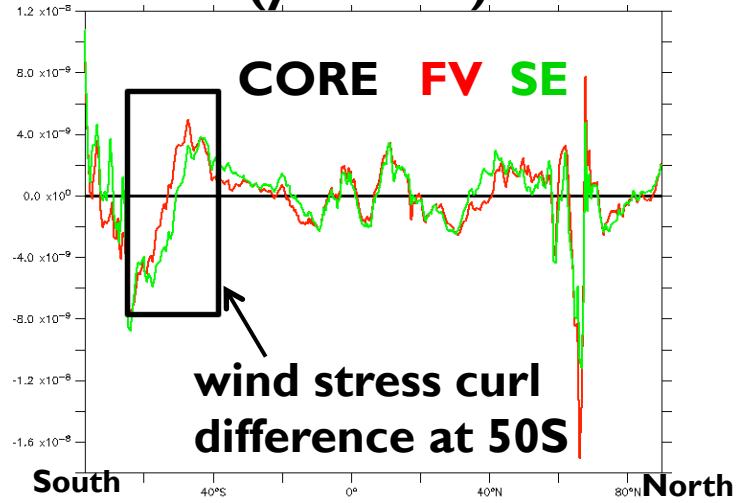


TAUX in CAM-SE:

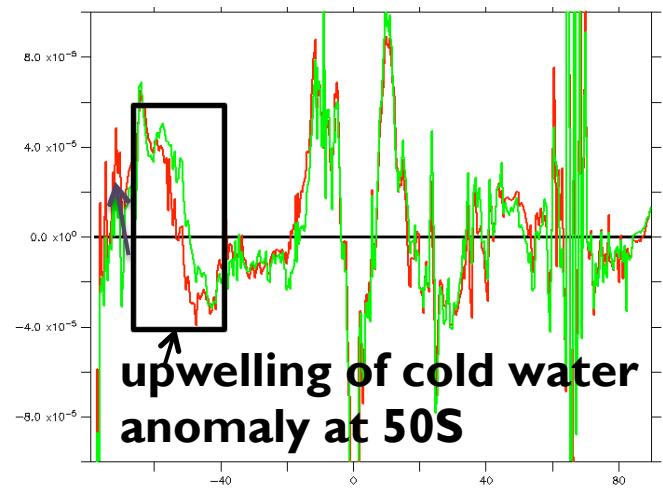
- Location: maximum moves north
- Amplitude increases

# Mechanism responsible of SST cooling in SE

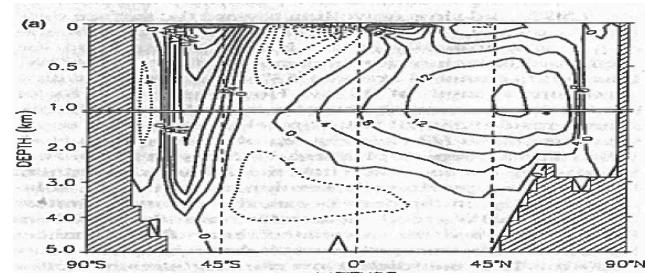
Wind stress curl anomaly  
(year 1-10)



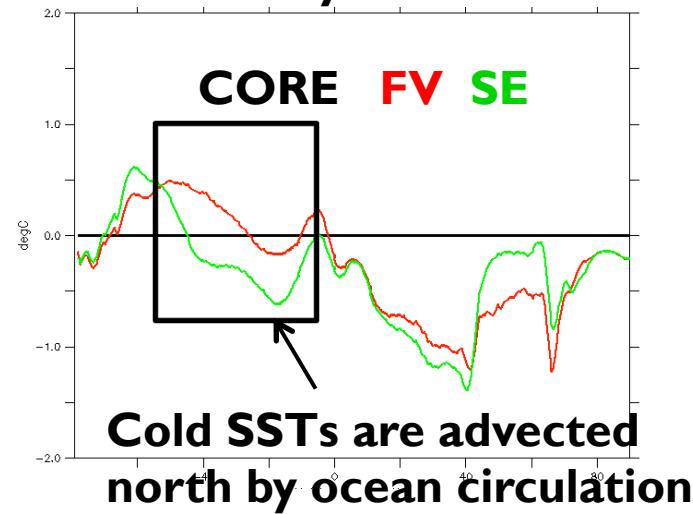
100-m vertical velocity anomaly



Ocean circulation

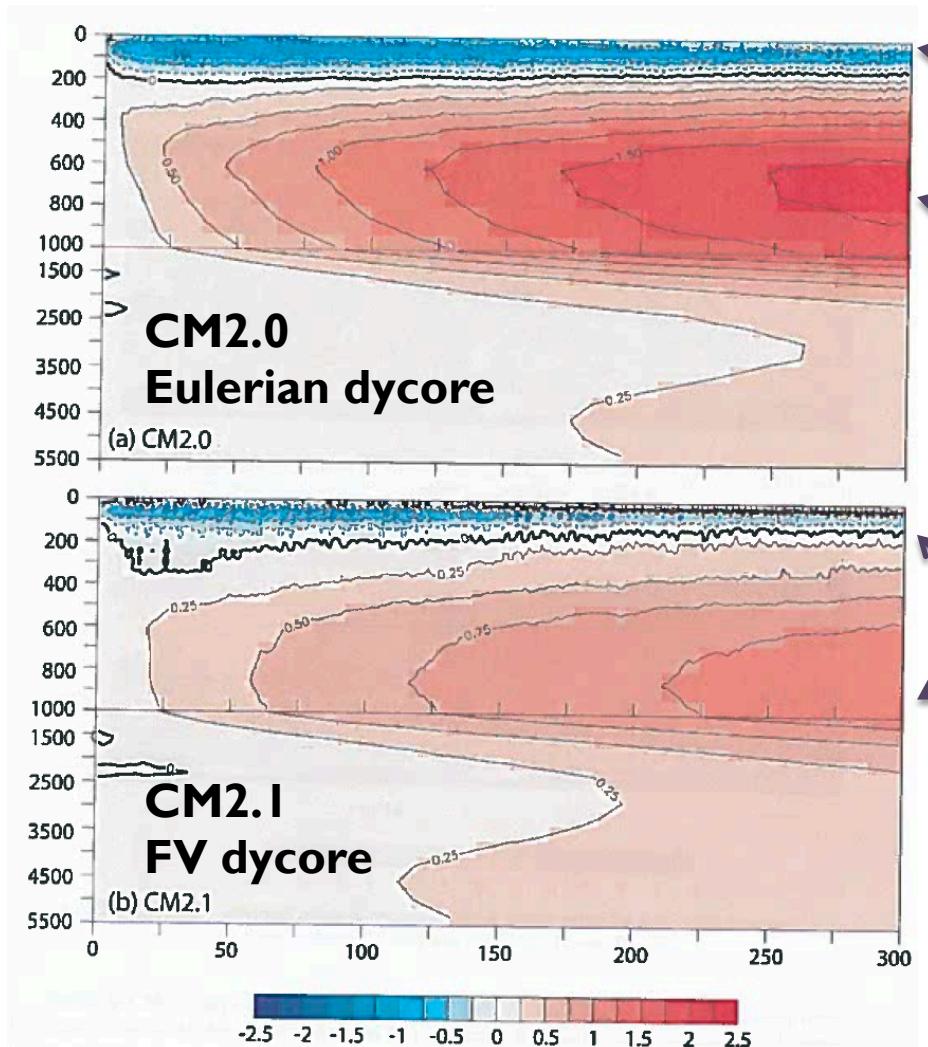


SST anomaly from CORE



Changes in **location of upwelling zones** associated with **ocean circulation** is responsible of the **SST cooling**

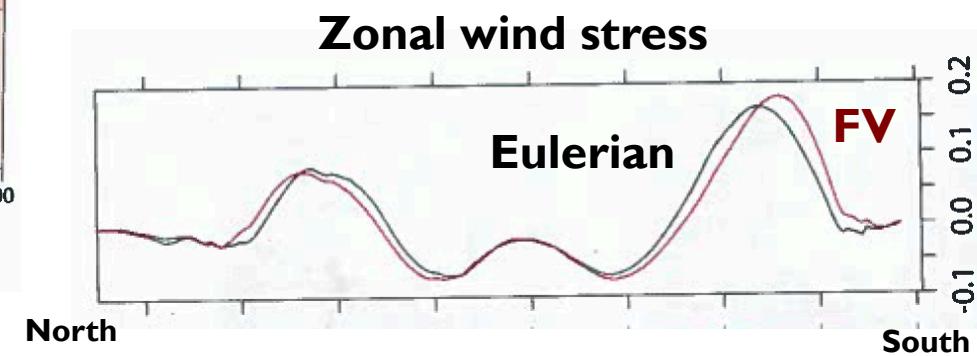
# Similar behavior in GFDL model



SST cooling

warm layer at  
750m

Reduced  
biases in FV



**We completed the recipe to include  
a new parameterization**



**Developing the parameterization**



**Assessing the parameterization**



**Tuning the model**



**Bon appétit**

# We are ready for a new model



**Questions ?**