



The Abdus Salam  
**International Centre  
for Theoretical Physics**

**Workshop on the Science of Climate Change:  
a focus on Central America and  
the Caribbean Islands**

# The experience of developing an Earth System Modeling in Brazil

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Brazil



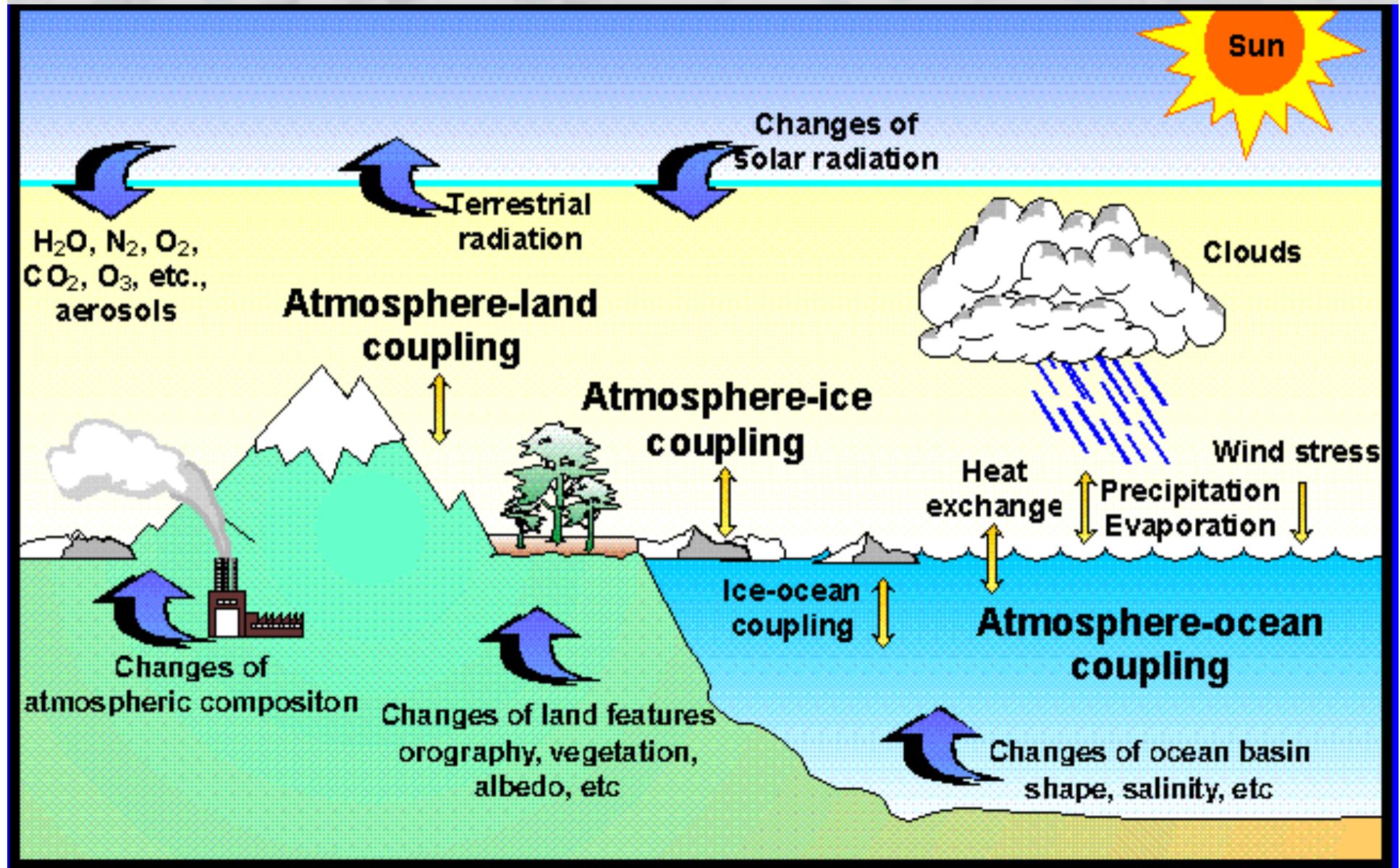
14 - 16 March 2017 Centro Cultural Tomas de Aquino  
Universidad San Carlos, Antigua, Guatemala

ICTP Workshop on the Science of Climate Change, Antigua, 15 March 2017

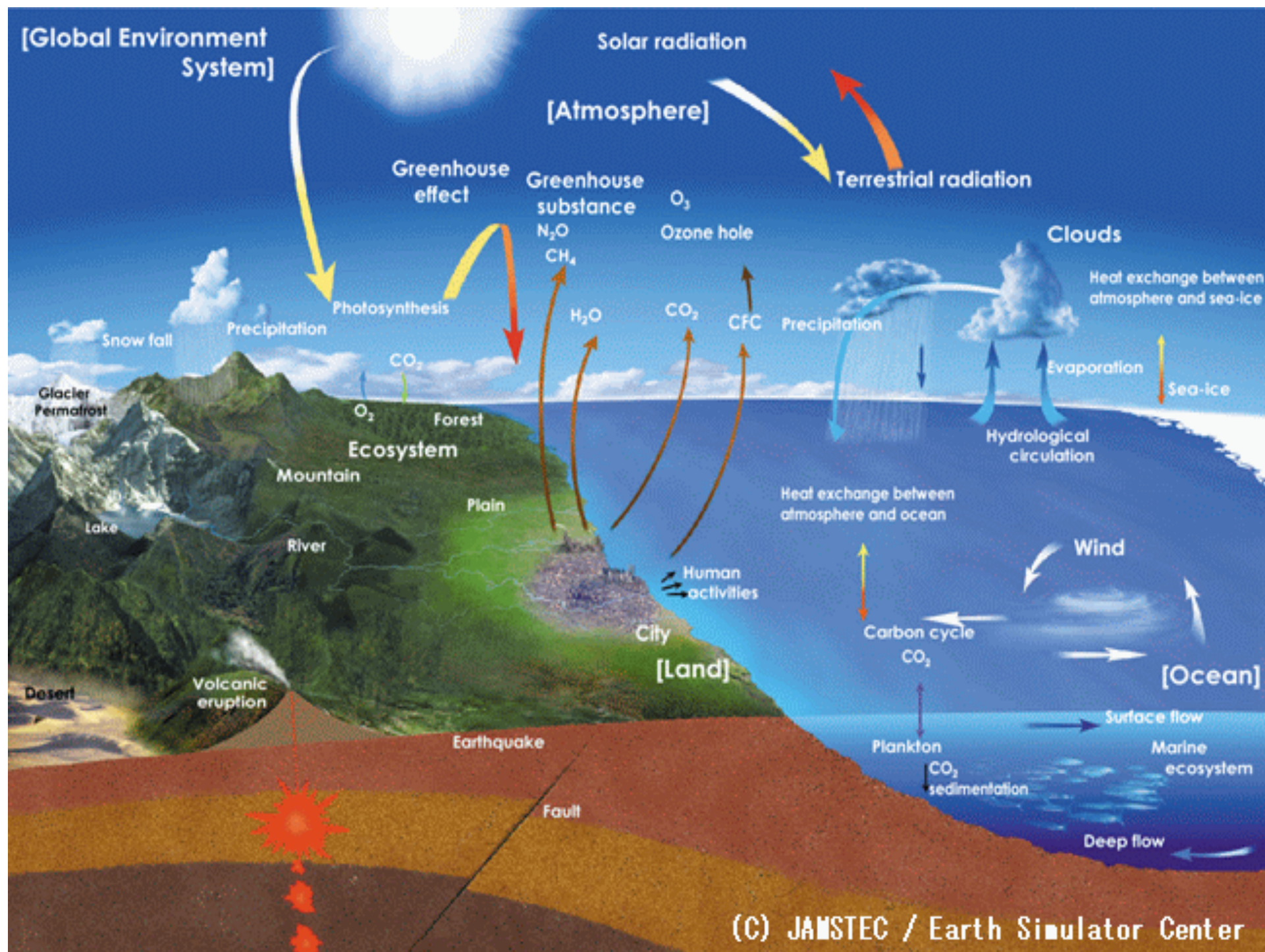
# Earth System Models

- **A climate model is a mathematical representation of the observed real world**
- **Purpose:** To obtain a theoretically or practically manageable representation of the Earth system by reducing its complexity and removing details that are not relevant for specific consideration.
- **Climate models** use quantitative methods to **simulate** the interactions of the atmosphere, oceans, land surface, and ice

## Modeling the Earth System









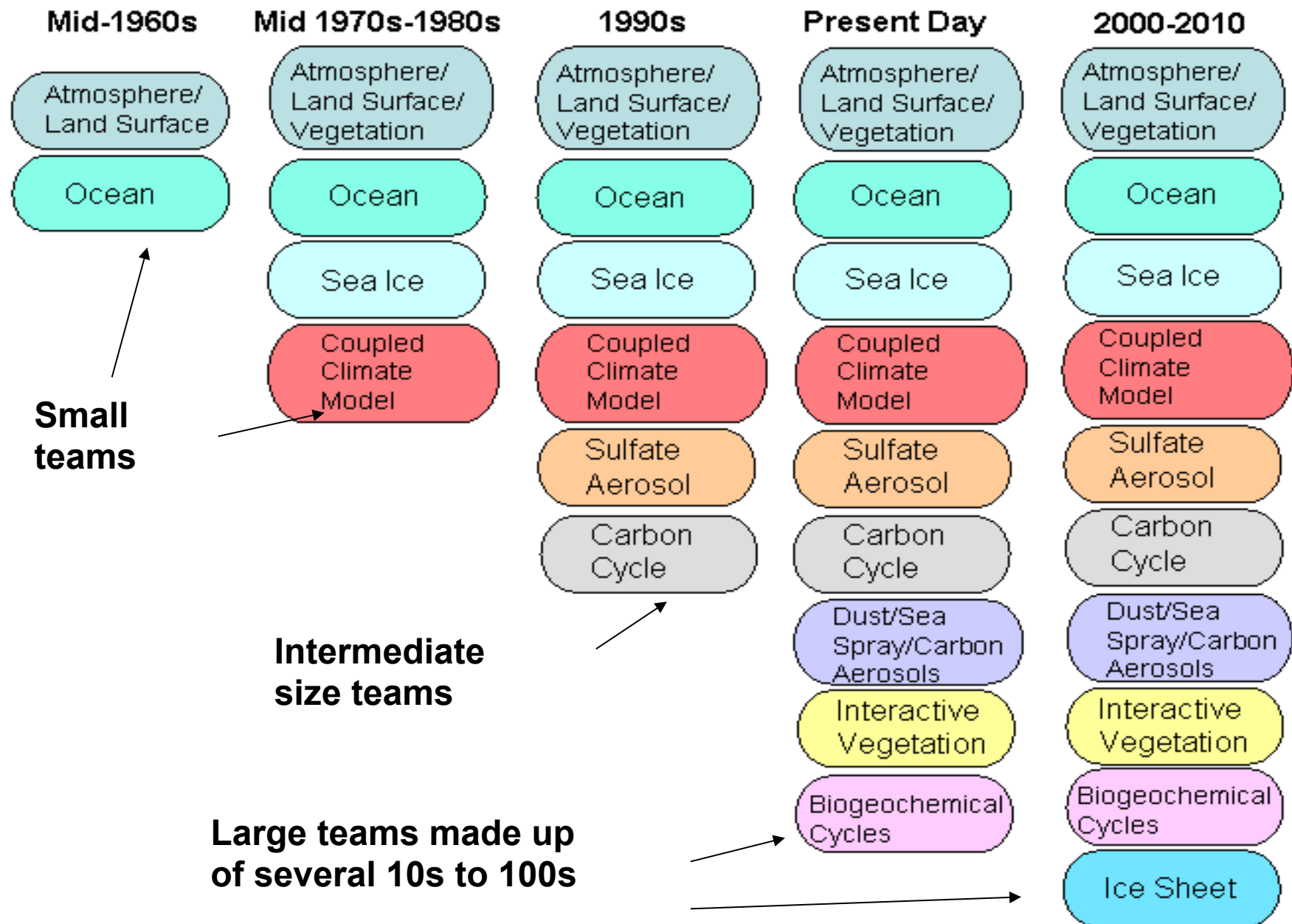
## Earth System Modeling: Some concrete Objectives

- Provide a **predictive** capability for the Earth System on time scales from days to seasons to decades
- Go **beyond the physical climate system** to include a predictive capability for **marine and terrestrial ecosystems**
- Require development of an **assimilative approach** to the coupled Earth System.
- Include an assessment of today's suite of Earth System **observations** within a predictive context and those observations needed to be sustained routinely
- Identify new **observations and algorithms** needed to **advance prediction skill**

# Earth System Modeling: Some concrete Objectives

- Include a predictive capability for **disease vectors**
- Focus on **regional aspects** (coastal region, megacities, tropical forest, Arctic, et and link with integrated field studies).
- Include **agricultural forecasts**
- **Education and training** in the development and use of such component
- Develop an advanced **forecasting capability** indicating aspects of the Earth system particularly vulnerable and prone to **disruption on lead times of weeks to seasons to decades**
- Provide **policy neutral** information on the implications and ramifications of environmental prediction.

# Timeline of Climate Model Development



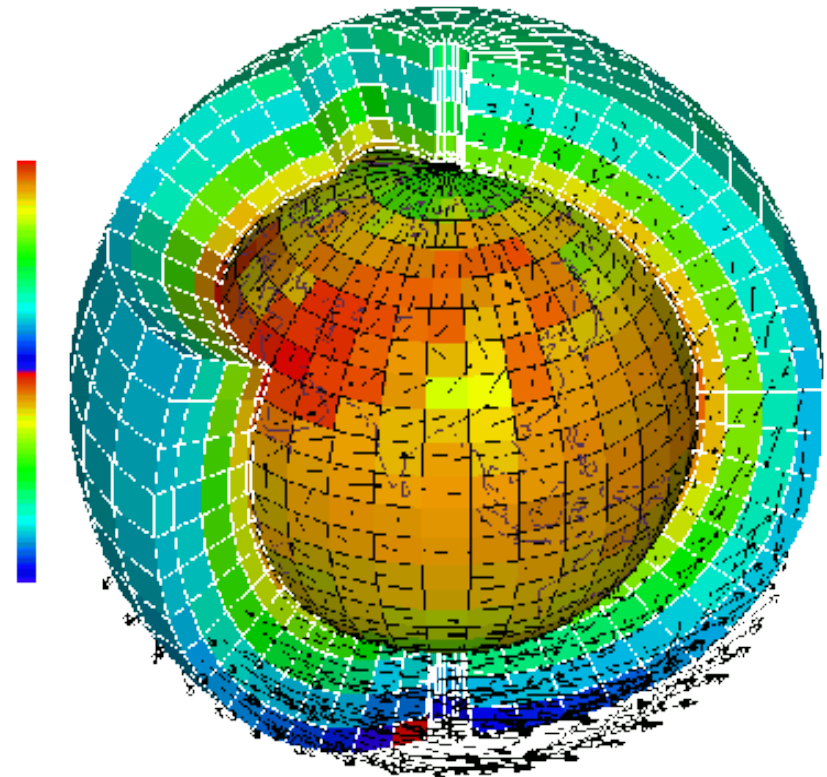


# From Weather Modeling to Climate Modeling

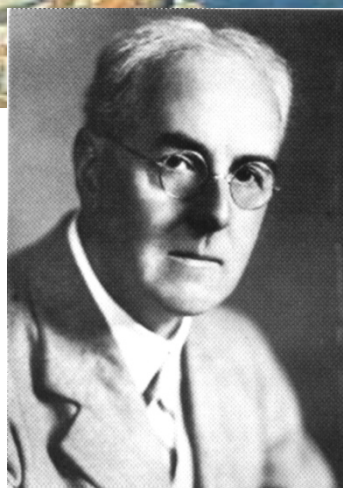
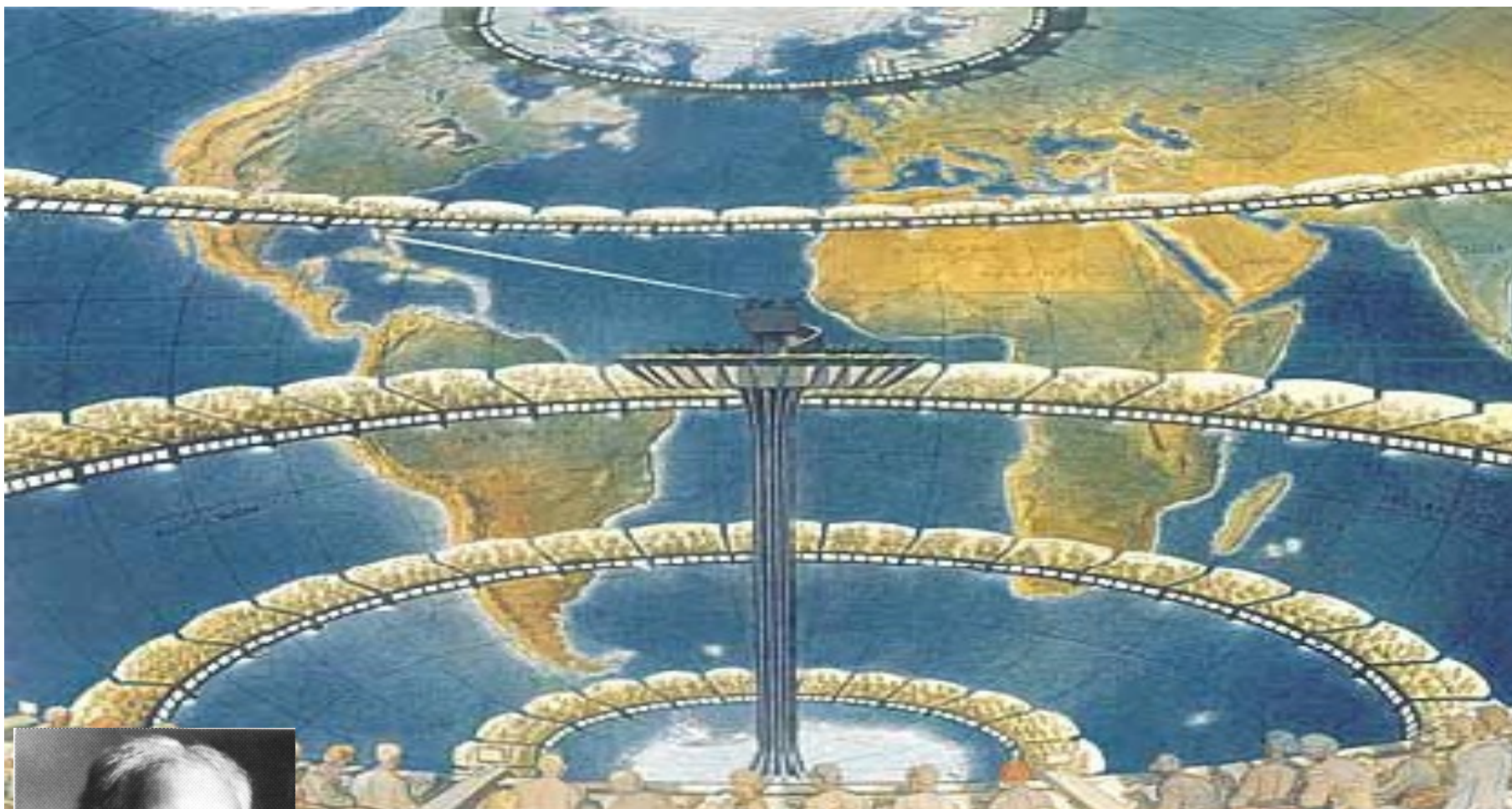
Richardson (1922)



The weather machine



An artist view of recent climate models  
(L. Fairhead /LMD-CNRS)

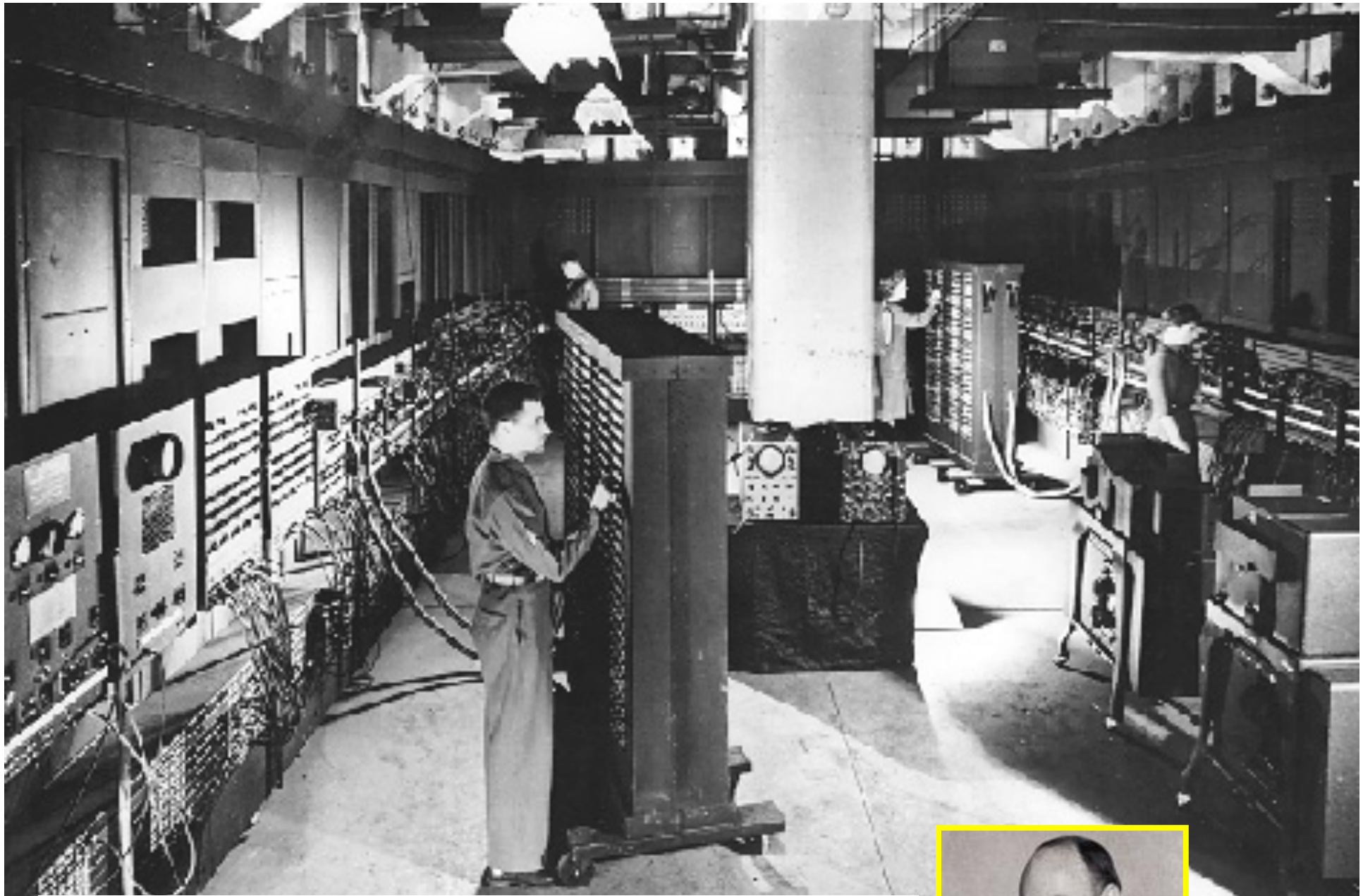


## **Before the Age of Computing**

In 1922, Lewis Fry Richardson, a British mathematician and meteorologist, proposed an immersive giant globe to numerically forecast weather. This “factory” would employ 64,000 human computers to sit in tiers around the interior circumference of a giant globe.

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**Rossby et al. (1950) → First successful attempt to forecast weather numerically**





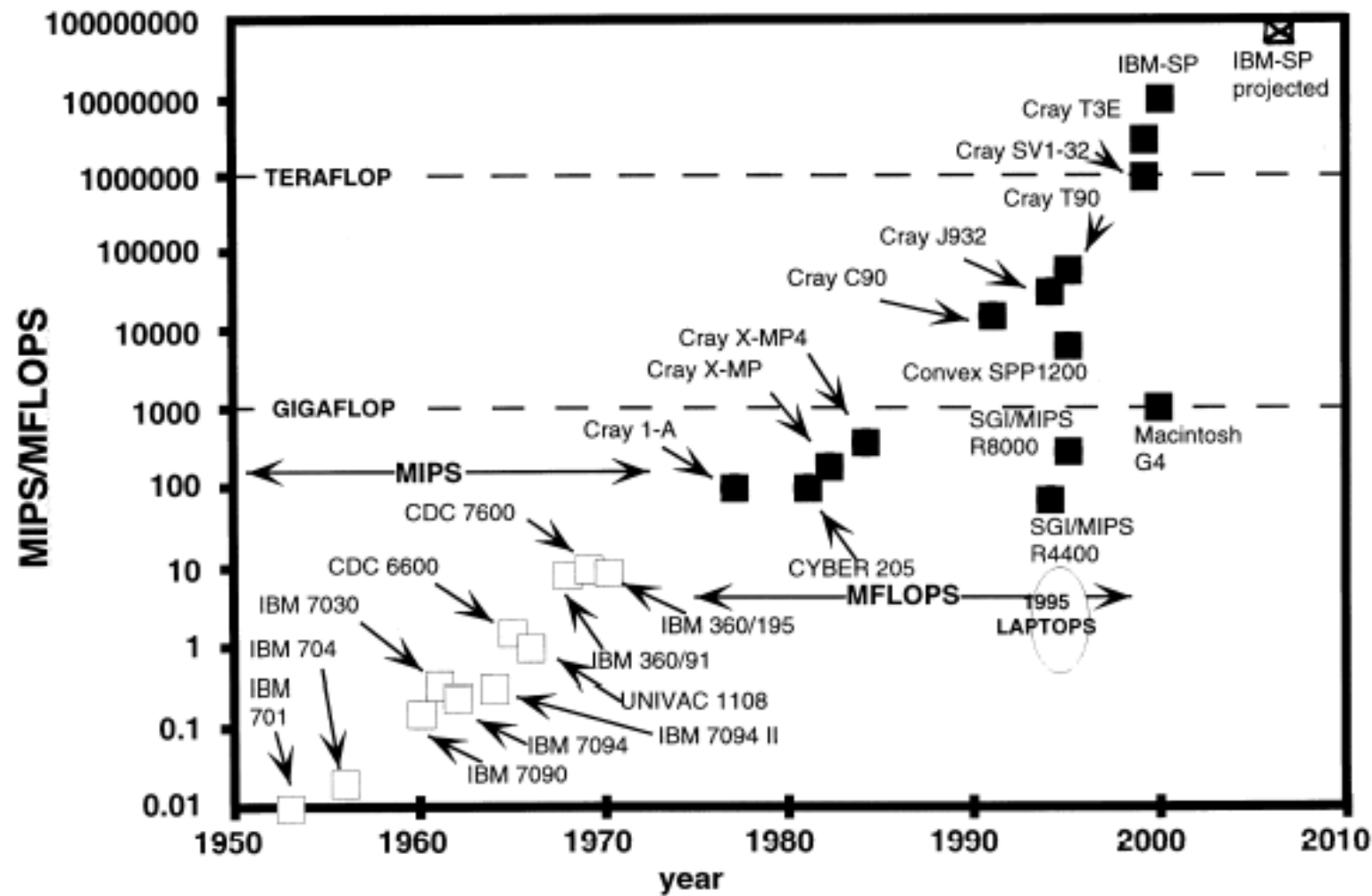
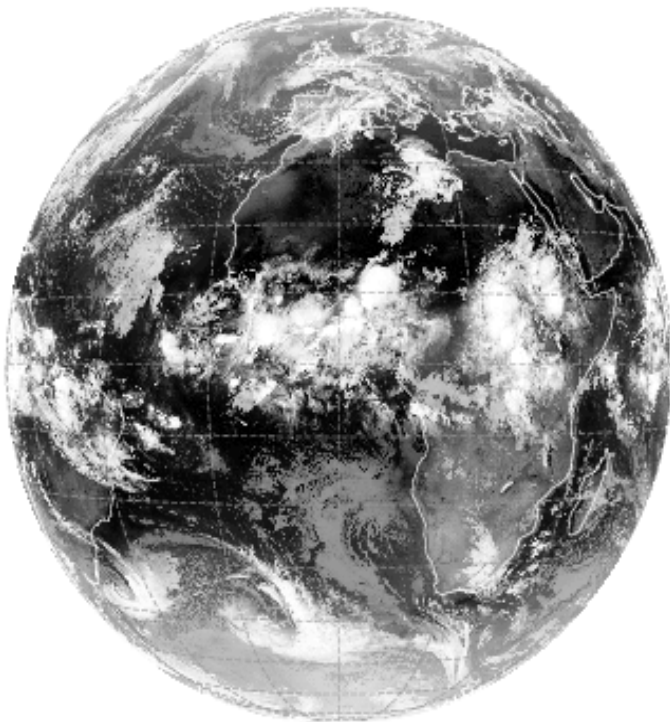


Figure 5. Development of computer power since 1950. Speeds are shown in millions of instructions per second (MIPS) up to 1974 and in millions of floating point operations per second (MFLOPS) from 1975 onwards. The rate of increase is exponential and shows no signs of tailing off (modified from *A Climate Modelling Primer*, by K. McGuffie and A. Henderson-Sellers, 1997, reproduced by permission of John Wiley & Sons, Ltd)

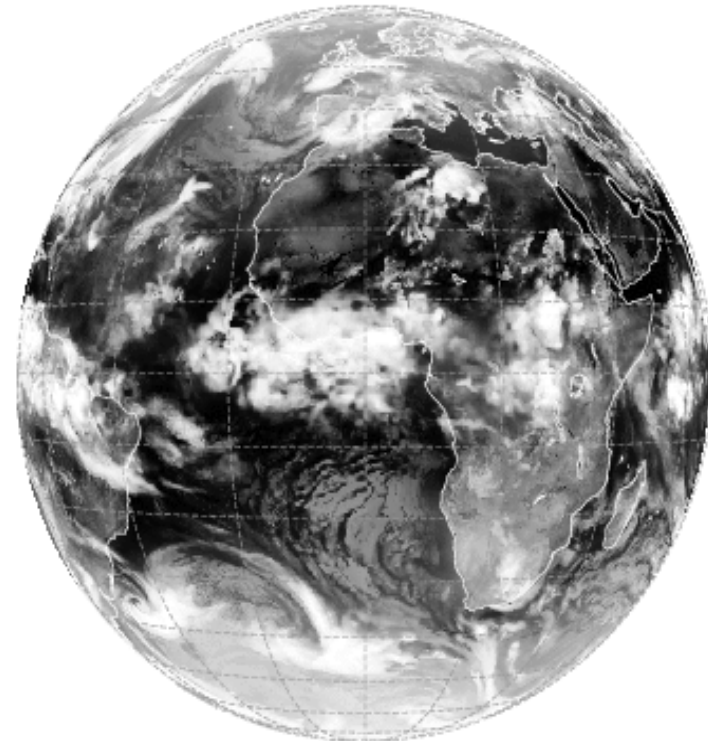
# Weather Prediction compared with Satellite Observations

ECMWF predictions and Meteosat observations

**Meteosat 9 IR10.8 20080525 0 UTC**



**ECMWF Fc 20080525 00 UTC+0h:**



# Atmospheric Models

Atmospheric dynamics  
(+chemistry)

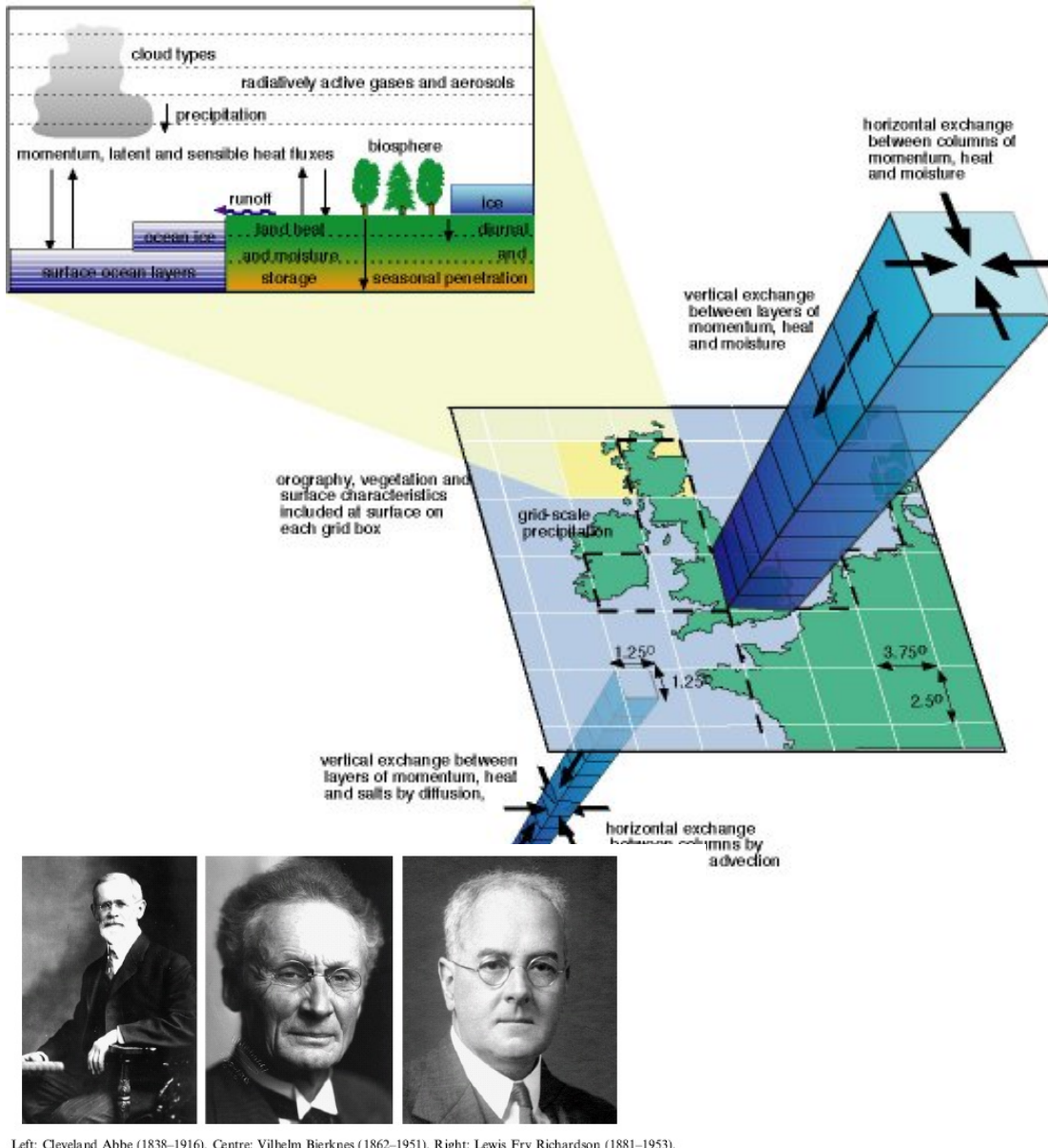
Ocean dynamics  
(+salinity)

Sea ice

Land surface

+vegetation (+CO<sub>2</sub>)

Simplified  
representations based  
on **physical laws**



Left: Cleveland Abbe (1838–1916). Centre: Vilhelm Bjerknes (1862–1951). Right: Lewis Fry Richardson (1881–1953).

(Lynch, 2007)

Courtesy: Prof. Guy Brasseur (2011)



# Numerical Weather Prediction: Atmospheric Primitive Equations

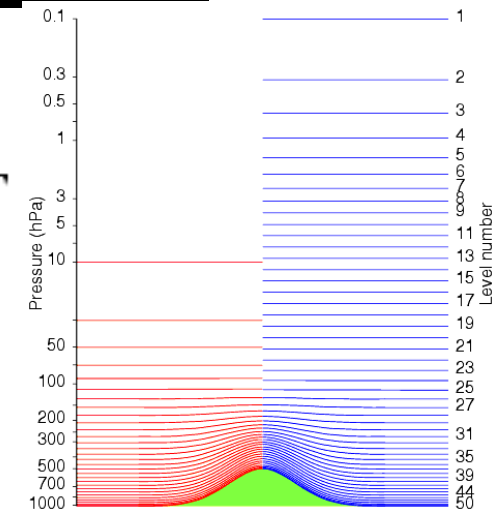
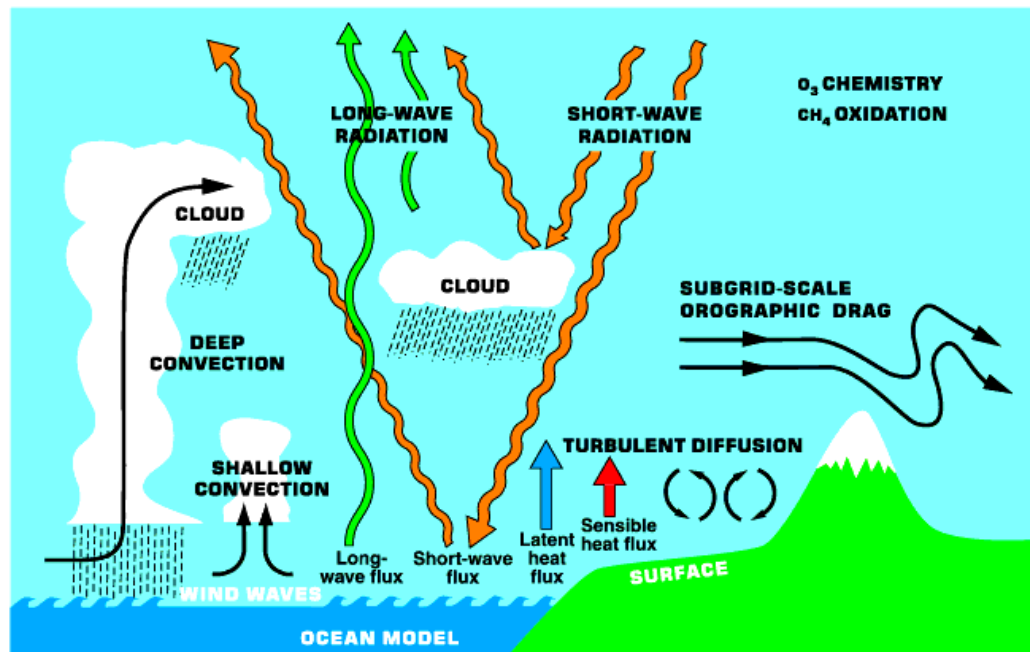


$$\begin{aligned}\frac{du}{dt} &= -\frac{1}{\rho a \cos \varphi} \frac{\partial p}{\partial \lambda} + f v + u v \frac{\tan \varphi}{a} + F_{\lambda} \\ \frac{dv}{dt} &= -\frac{1}{\rho a} \frac{\partial p}{\partial \varphi} - f u - u^2 \frac{\tan \varphi}{a} + F_{\varphi} \\ \frac{\partial p}{\partial z} &= -\rho g\end{aligned}$$

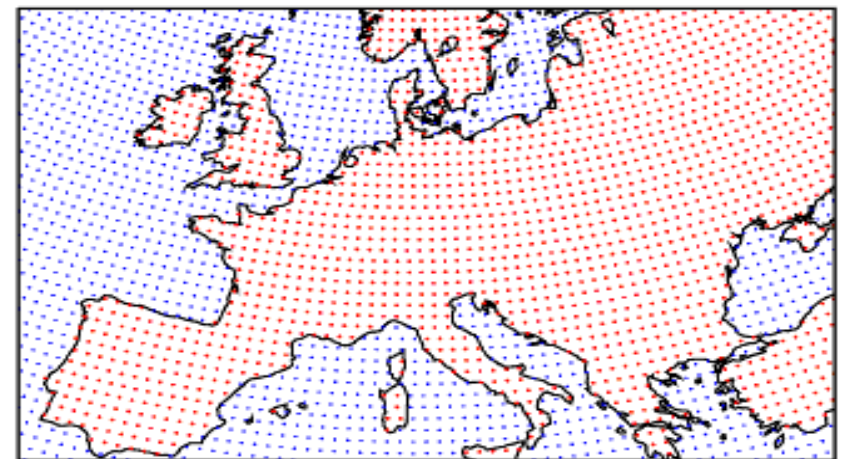
$$\begin{aligned}\frac{\partial \rho}{\partial t} &= -\nabla \cdot \rho \mathbf{V} \\ p &= R \rho T \\ C_p \frac{d\Theta}{dt} &= \frac{\Theta}{T} Q\end{aligned}$$

$u, v, w, p, \rho, T$

Primitive equations



Discretization

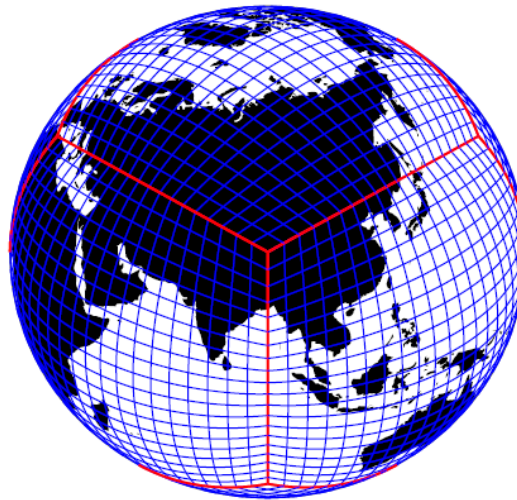


# Grids: Lat-long, Cubed-Sphere, icosahedral (hexagons and pentagons)

**(a)**



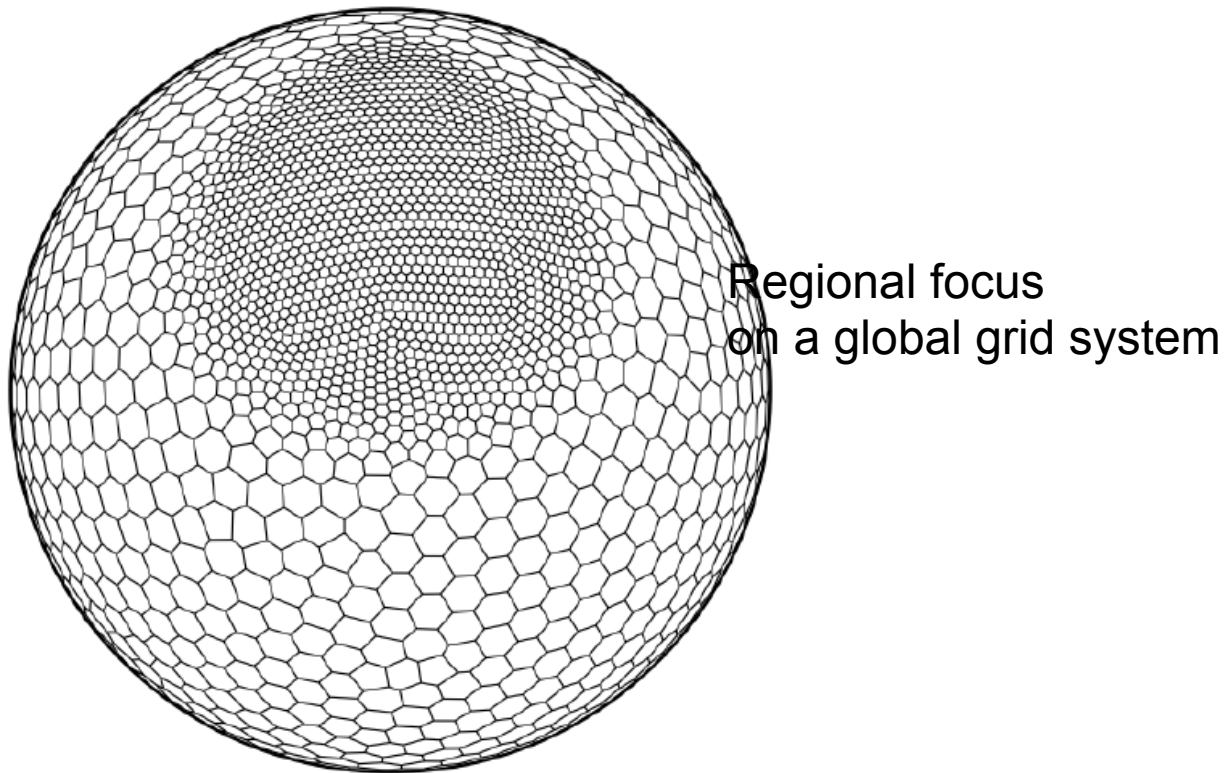
**(b)**



**(c)**

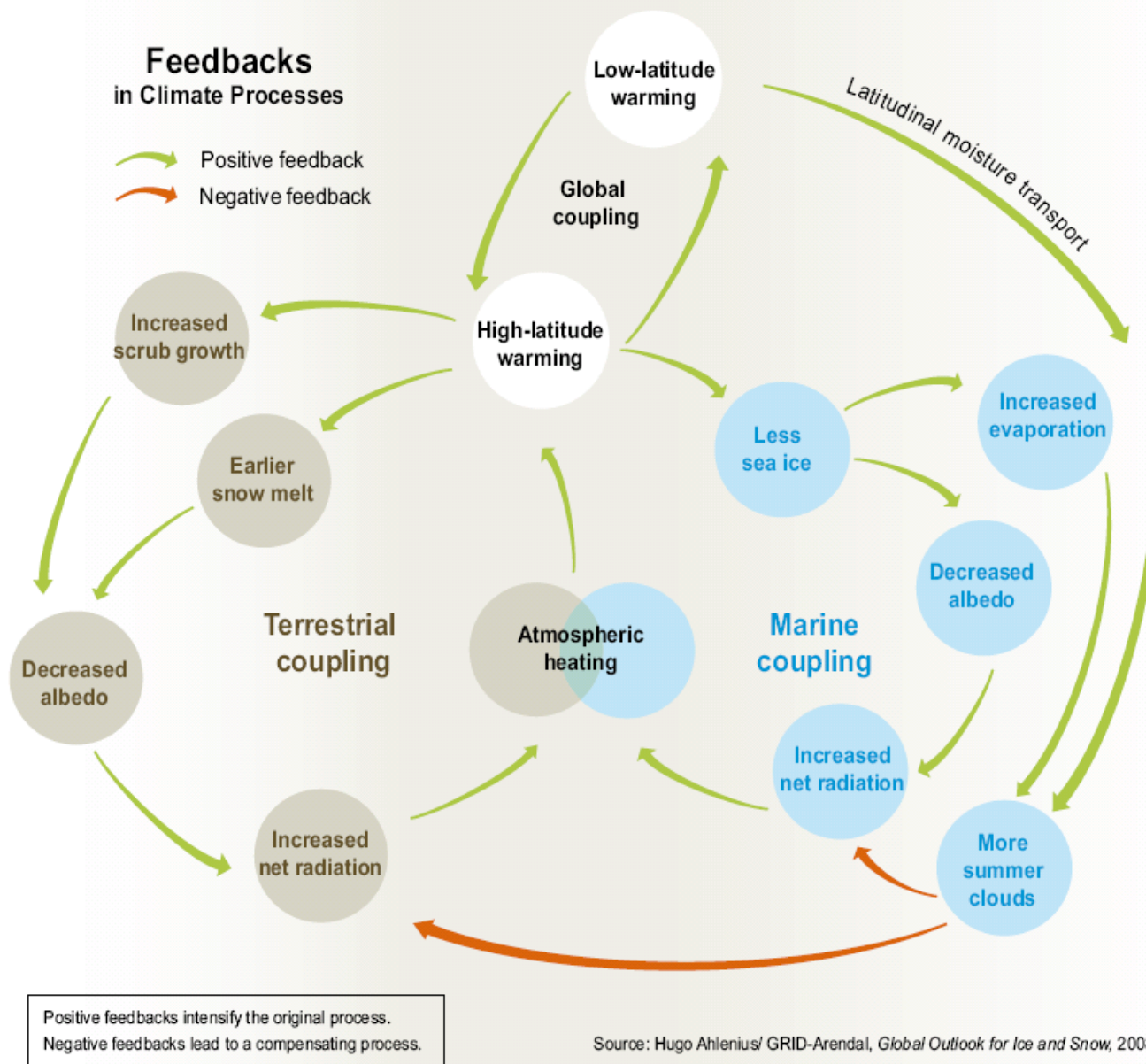


# Adaptive Grid to highlight processes in a given region (From T. Ringler, LANL)



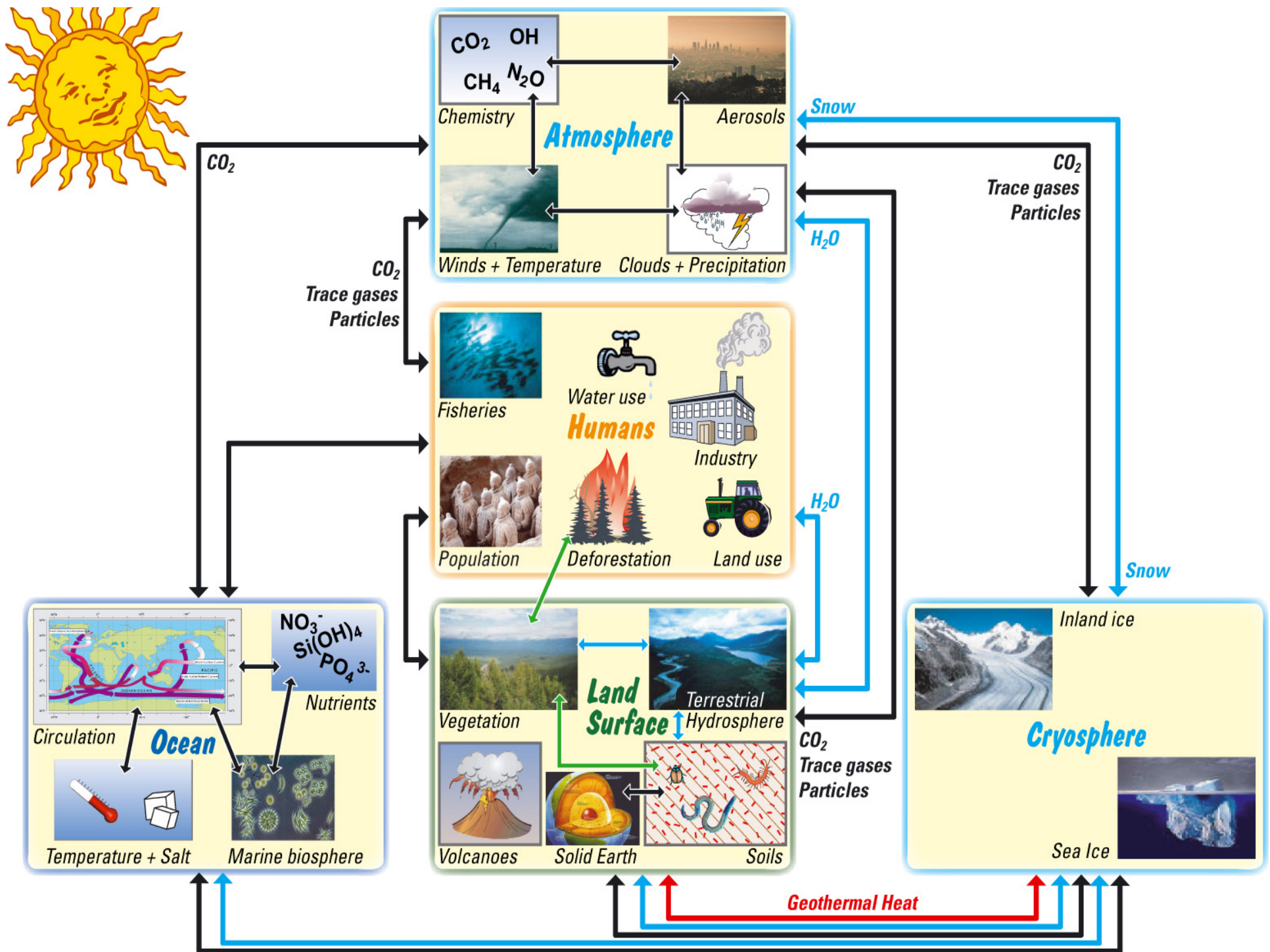
**Figure V.1. A variable resolution grid based on a Spherical Centroidal Voronoi Tessellation.**





Climate system  
is highly  
nonlinear  
Strong coupling  
among  
subsystems  
with different  
time scales

Models needed!



# Introducing Life into Earth System Models

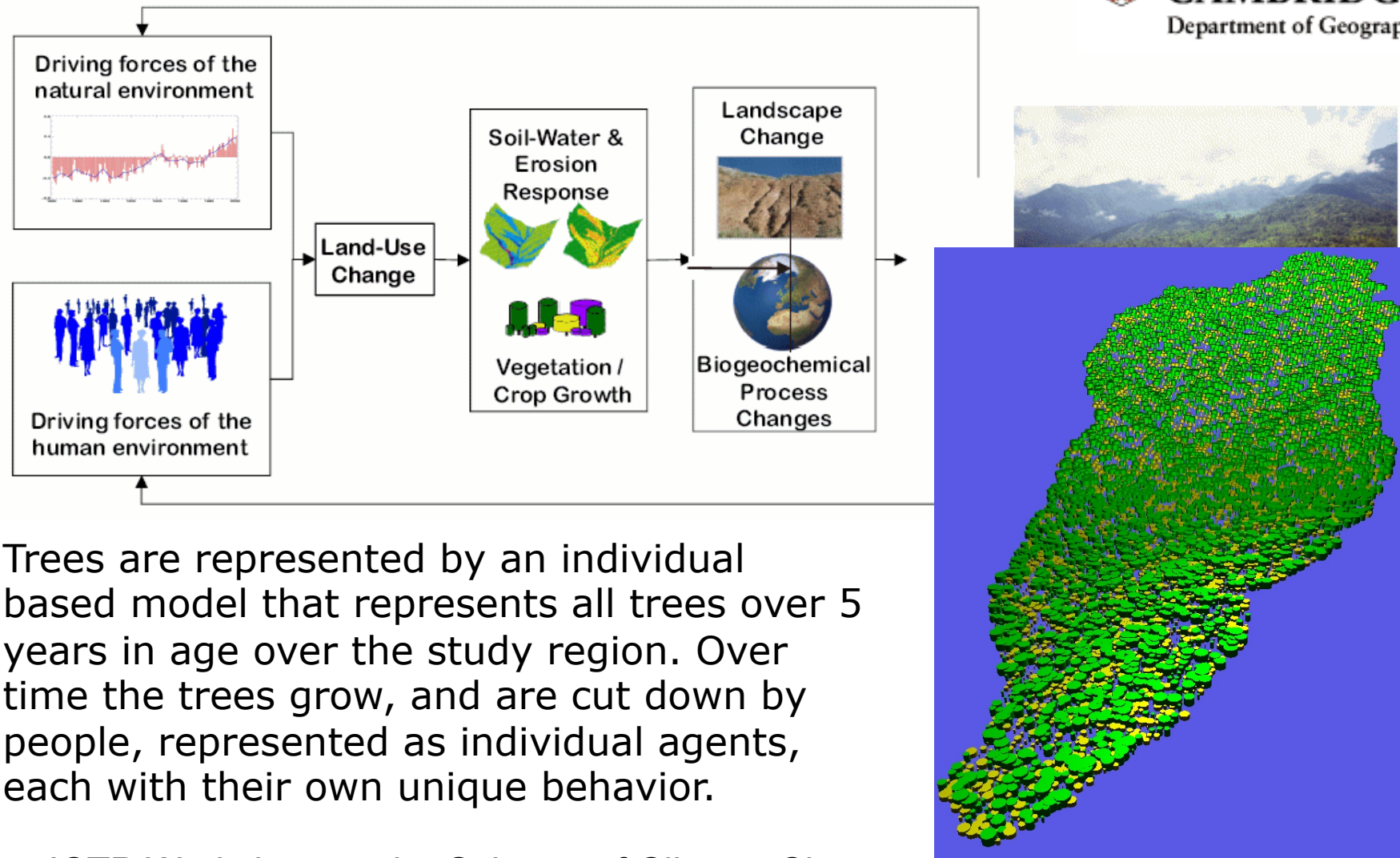
Theoretical bases for modelling the physical system are much firmer than for natural ecosystems.

The challenge is:

- To develop a modelling system for the **biosphere** broadest terms, which can represent in **functional form** how it is influenced by, and itself influences, human activities and the climate system
- To establish a **modelling framework** that allows such a modelling system to be fully **coupled** with the physical system.



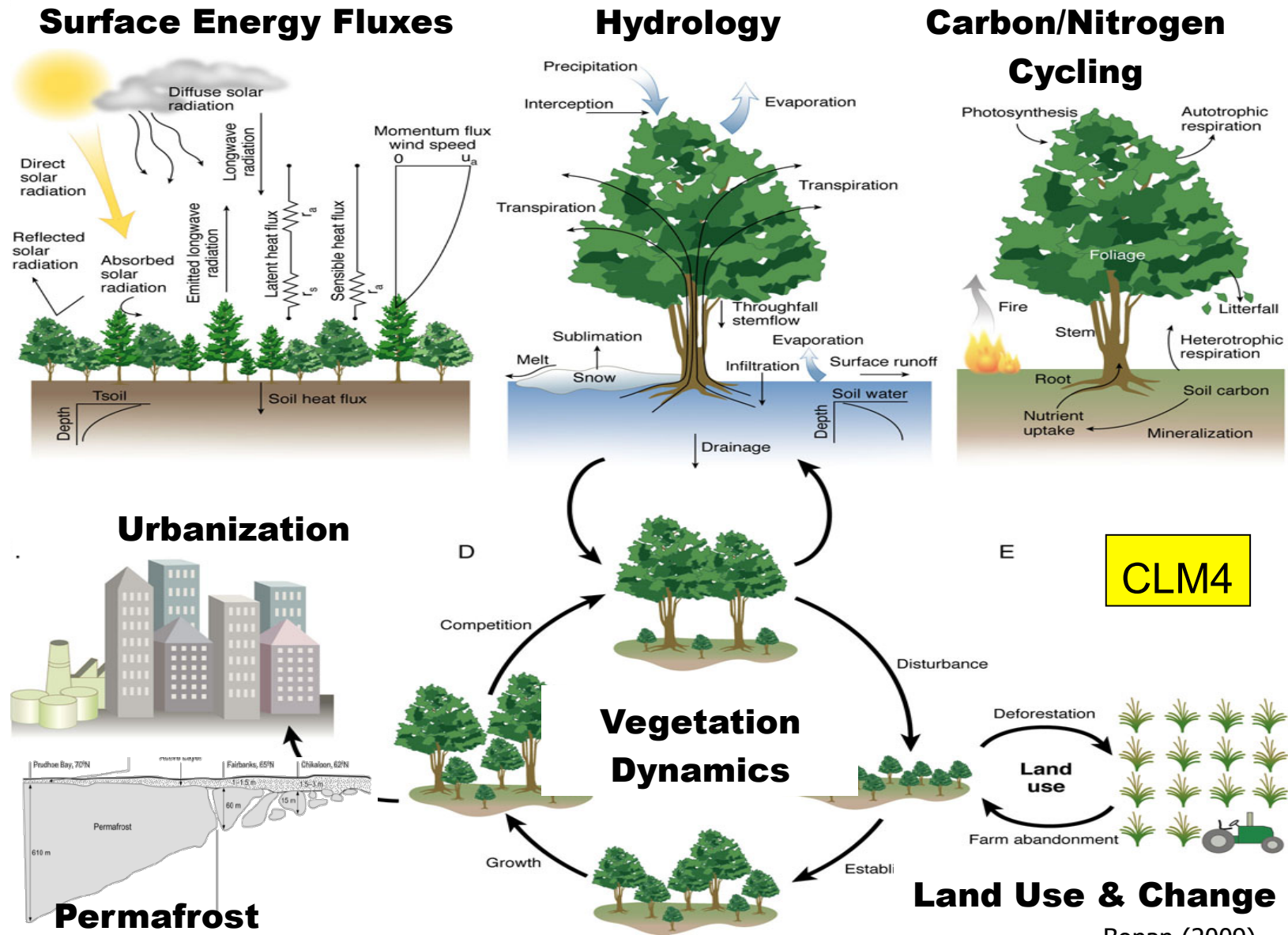
# Example of **Individual Based Models** for representing ecosystems and **Agent Based Models** for representing human behaviour



Trees are represented by an individual based model that represents all trees over 5 years in age over the study region. Over time the trees grow, and are cut down by people, represented as individual agents, each with their own unique behavior.

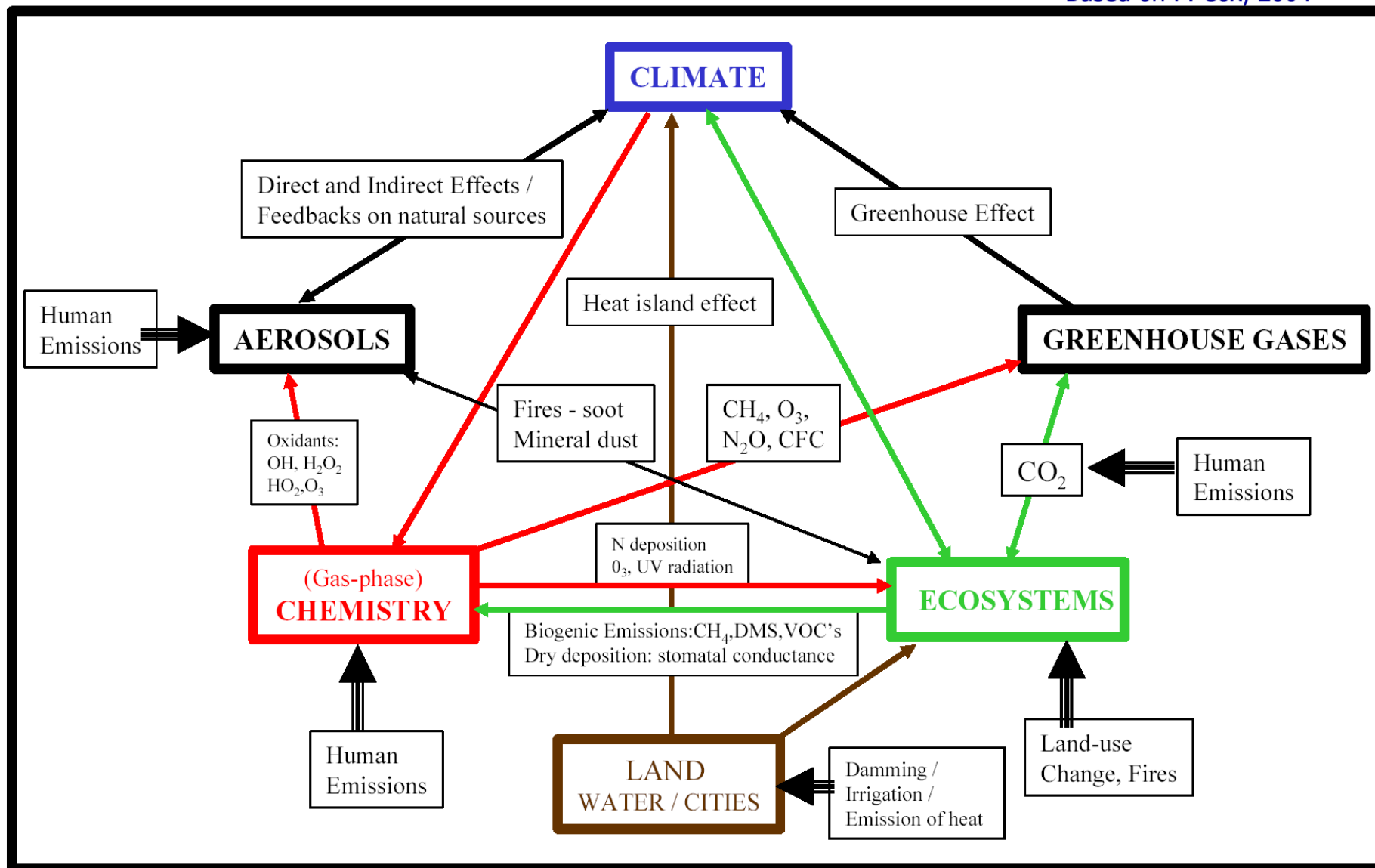


# Community Land Model 4



# Climate/Chemistry/Ecology/Hydrology

Based on P. Cox, 2004



# The Brazilian ESM - BESM development strategy: One-Model: From Weather Forecasting to Global Climate Change Scenarios

Extreme Events Hit Brazil



T062L28

Climate Change

1 century

1 year

Government, Public Policies, Strategic Planning

T126L42

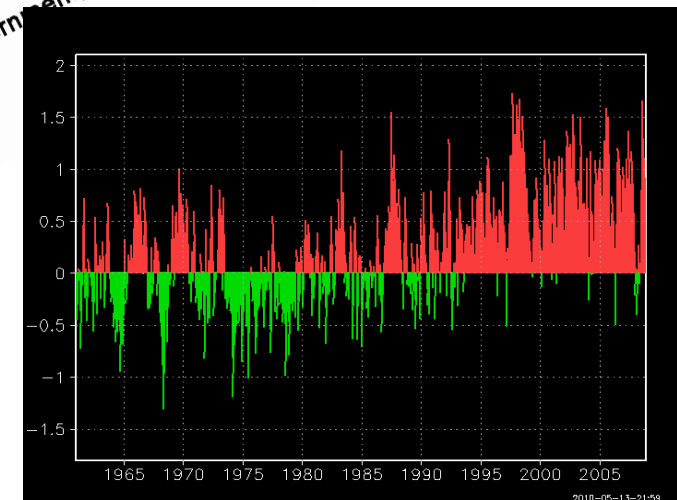
Seasonal Climate  
Industry (clothing, beverages, ice creams)  
Agriculture, Water Resources, Energy

T213L64

T666L96

30min 3 days  
NWP

General Use  
Agriculture  
Planning  
Water Resources  
Energy  
DERF

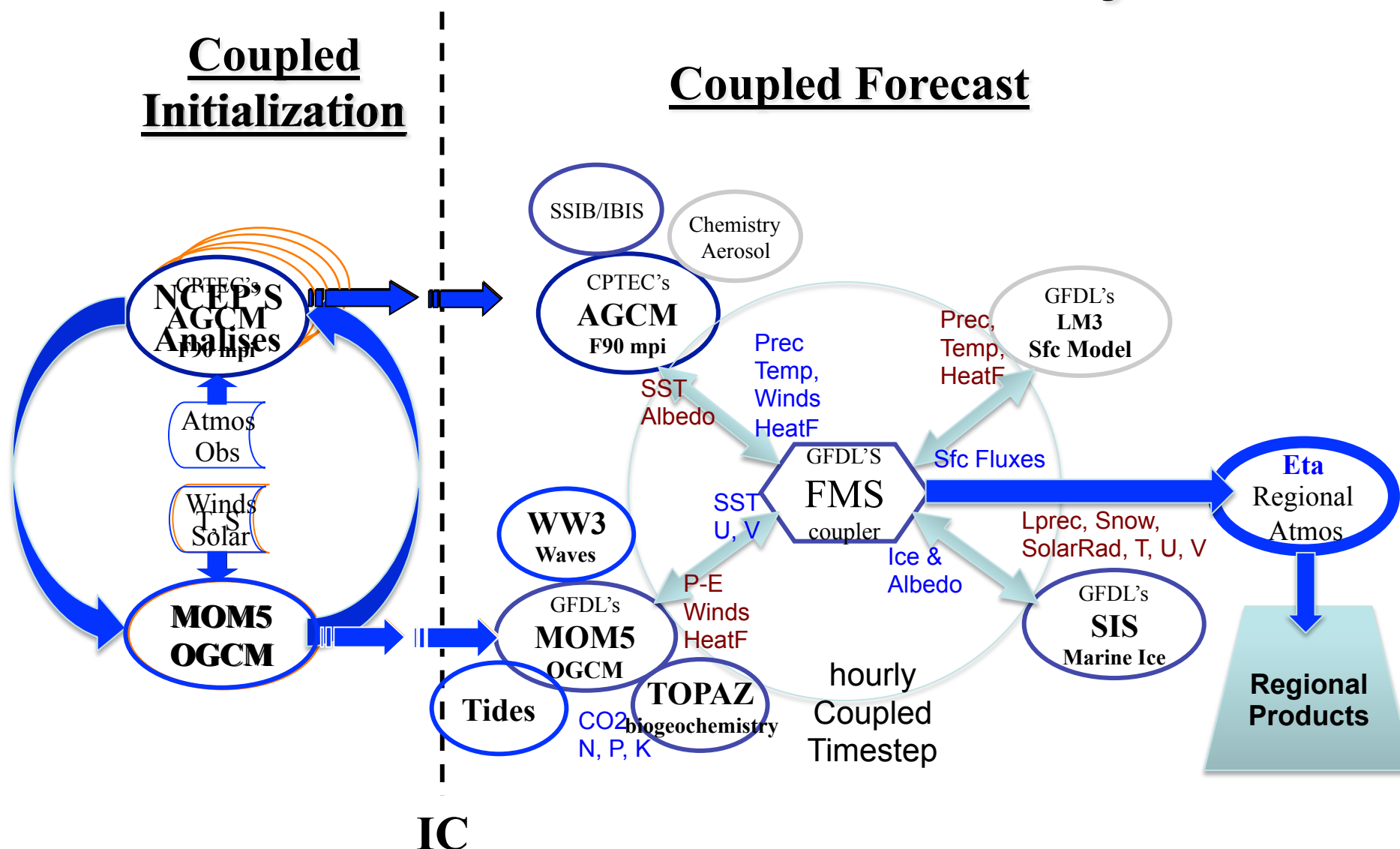




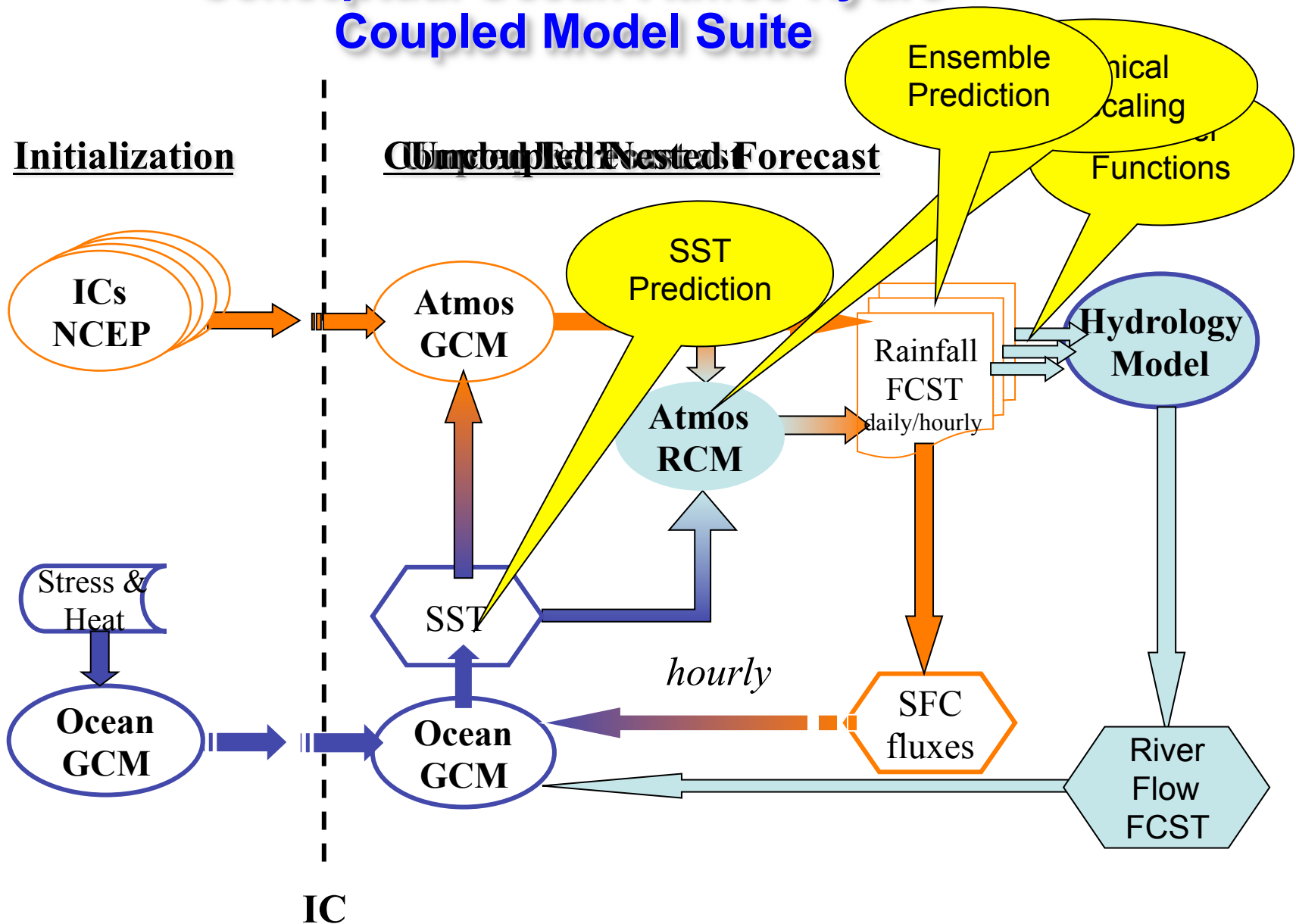


# BESM

## Climate Forecast System



# Conceptual Ocean-Atmos-Hydro Coupled Model Suite

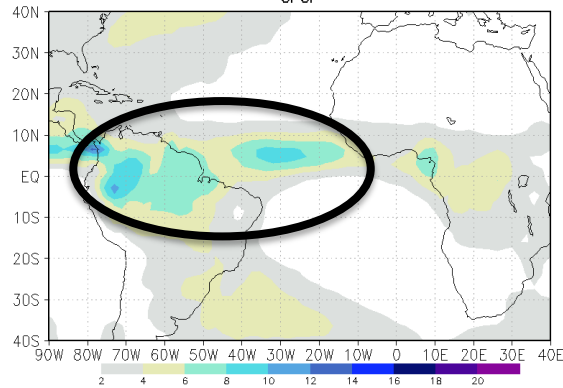




# Cloud Cover Parameterization in BESM & Amazon Rainfall-Circulation

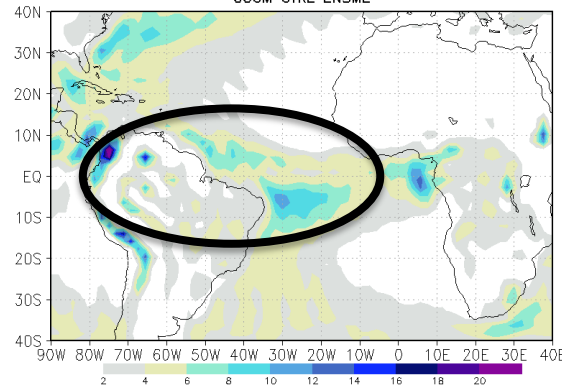
GPCP

Precipitacao (mm/day): 2005–2008  
GPCP



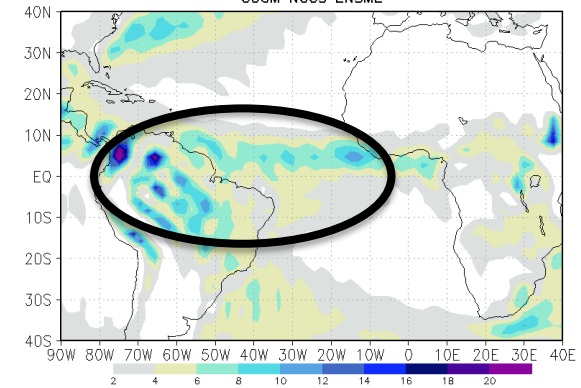
BESM 2.3

Precipitacao (mm/day): 2005–2008  
CGCM CTRL ENSME



BESM 2.3.1

Precipitacao (mm/day): 2005–2008  
CGCM NCCS ENSME



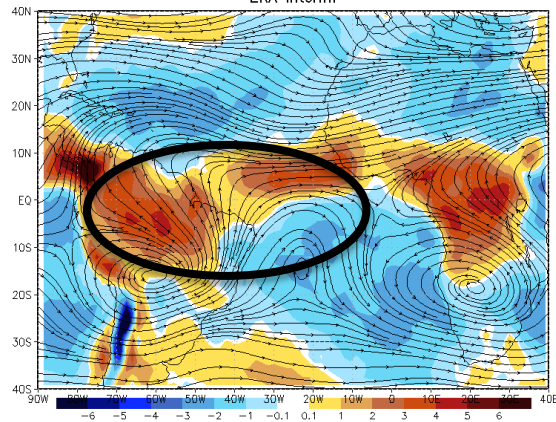
## BESM UPPER LEVEL FLOW

ERA interim REANALISYS

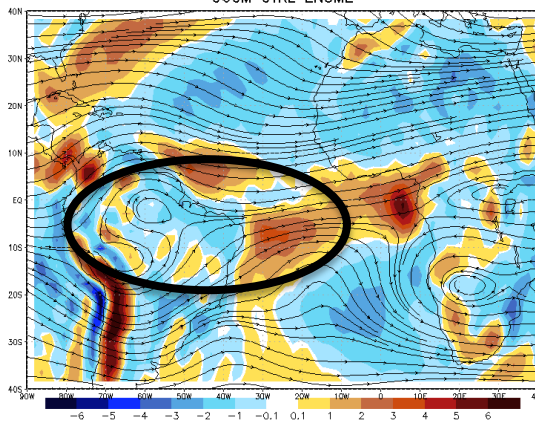
BESM 2.3

BESM 2.3.1

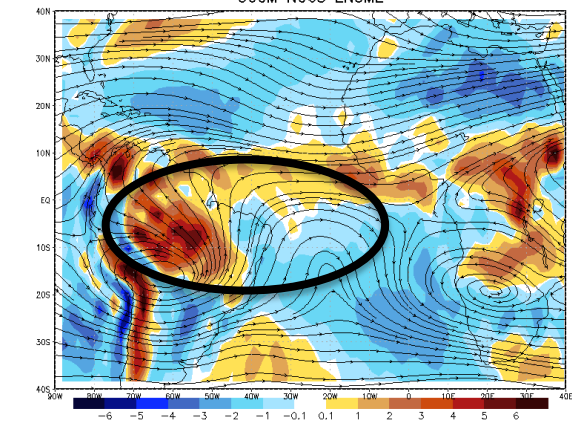
Divergencia do Vento a 200hPa ( $10^{-6} \text{ s}^{-1}$ ): 2005–2008  
ERA interim



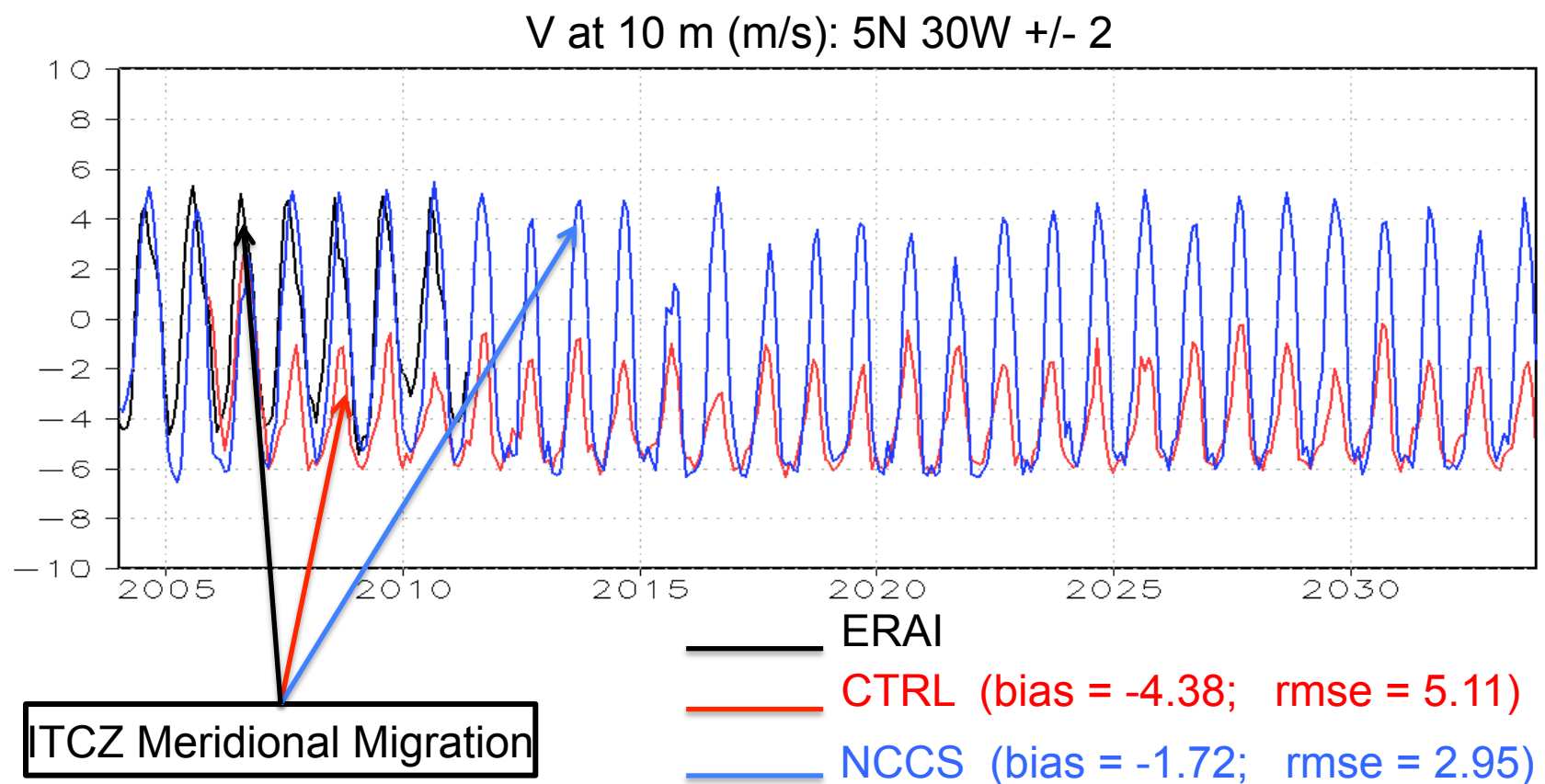
Divergencia do Vento a 200hPa ( $10^{-6} \text{ s}^{-1}$ ): 2005–2008  
CGCM CTRL ENSME



Divergencia do Vento a 200hPa ( $10^{-6} \text{ s}^{-1}$ ): 2005–2008  
CGCM NCCS ENSME



# BESM Atlantic ITCZ simulations



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## BESM version 2.7 – under construction

**SPECTRAL DYNAMICS:** Semi\_Lagrangian ( $\leq 25\text{km}$ ) Eulerian ( $>25\text{km}$ )

**S-L RADIATION:** RRTMG

**PBL:** dry MY2.0; moist Park

Deep **CONVECTION** Grell

**Cloud MICROPHYSICS:** Ferreir-1M

**CHEMIMSTRY:** <MOZART>

**AEROSSOLS:** <MAM>

**ATMOSPHERE**

**FMS  
COUPLER**

**LAND**

**VEGETATION:** SSiB, LM3

**HIDROLOGY:** THMB <HAND>

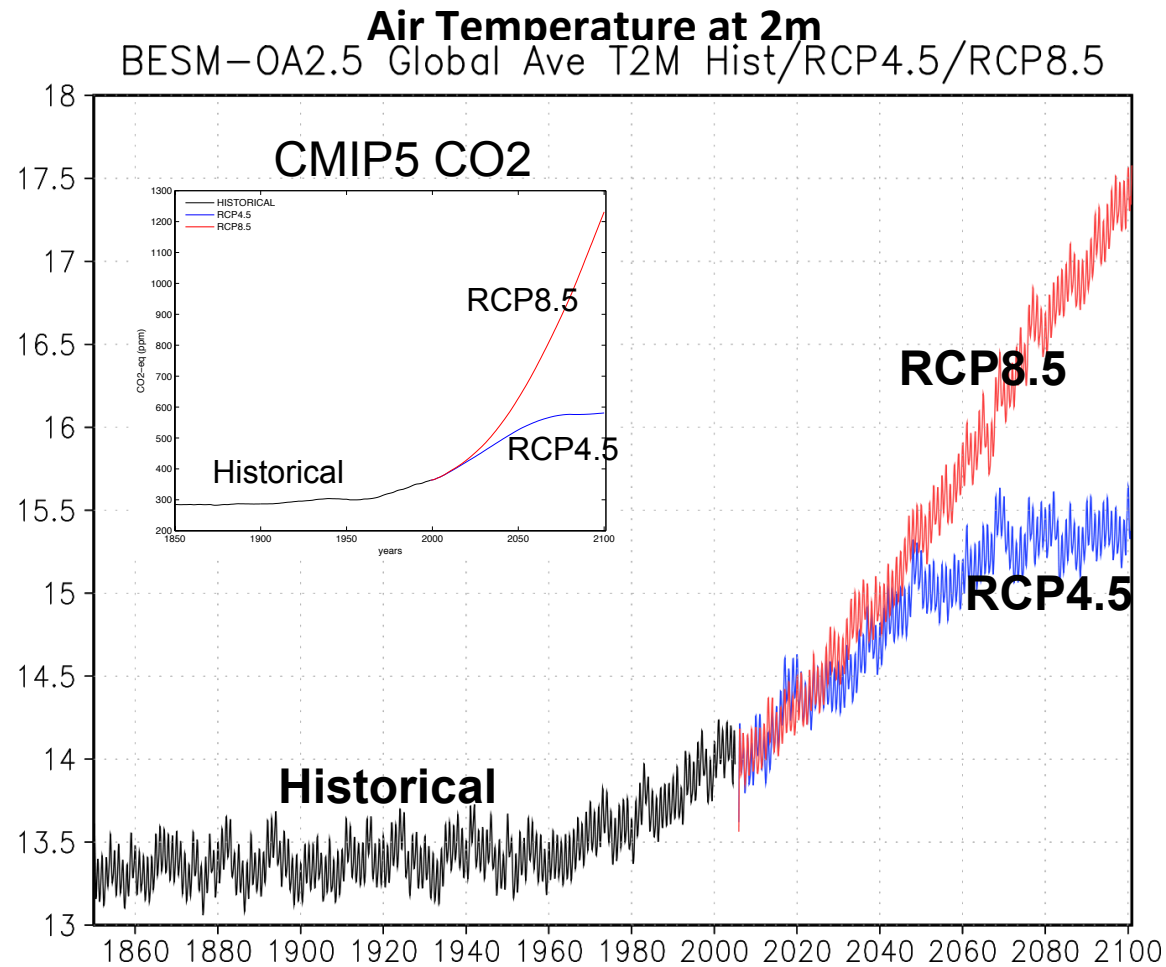
**OCEAN**

**MOM5:** KPP <GISSVM>

**MOM5:** TOPAZ, SIS



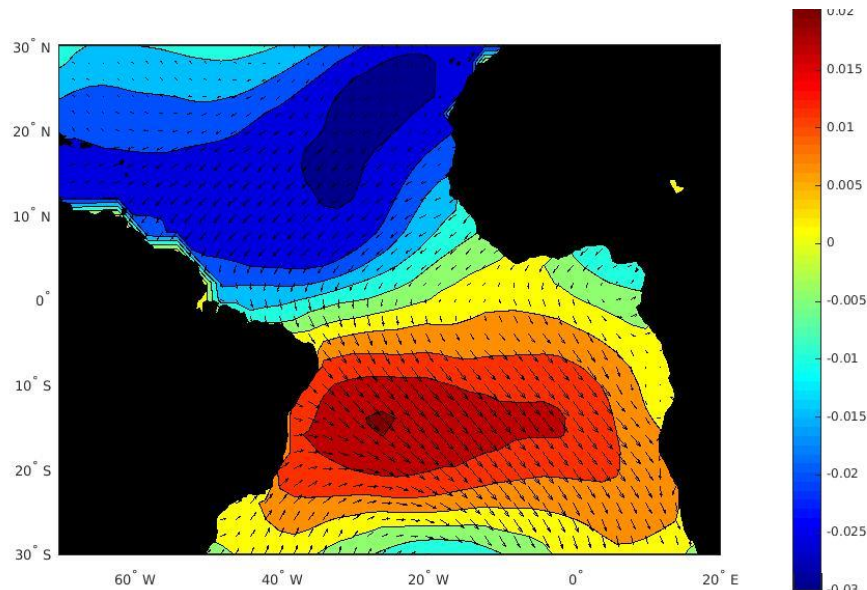
# BESM2.5 CMIP5 Runs 1850-2100



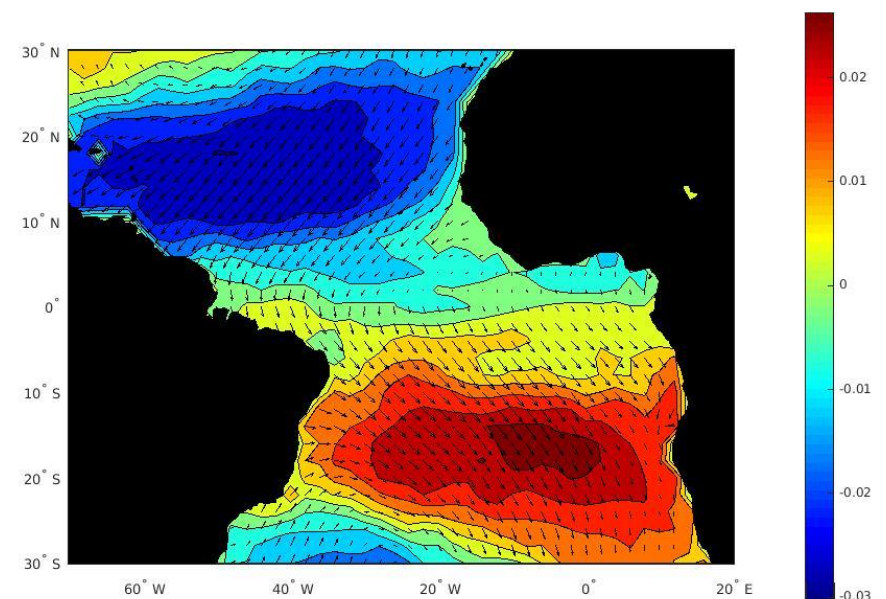
# Atlantic Meridional Mode

SST, Taux, Tauy Joint EOF1

**ERSSTv4 (9.3%)**



**BESM2.5 historical run (11.4%)**

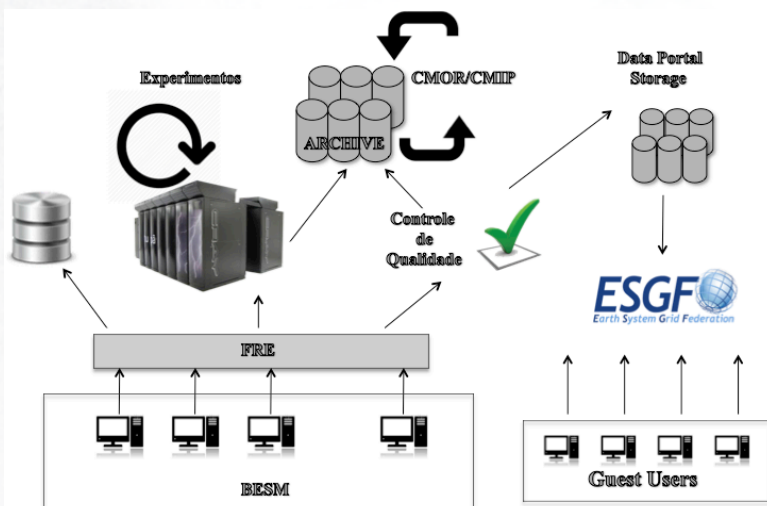


S. Veiga et al (2017) in preparation

# BESM CMIP5 scenarios

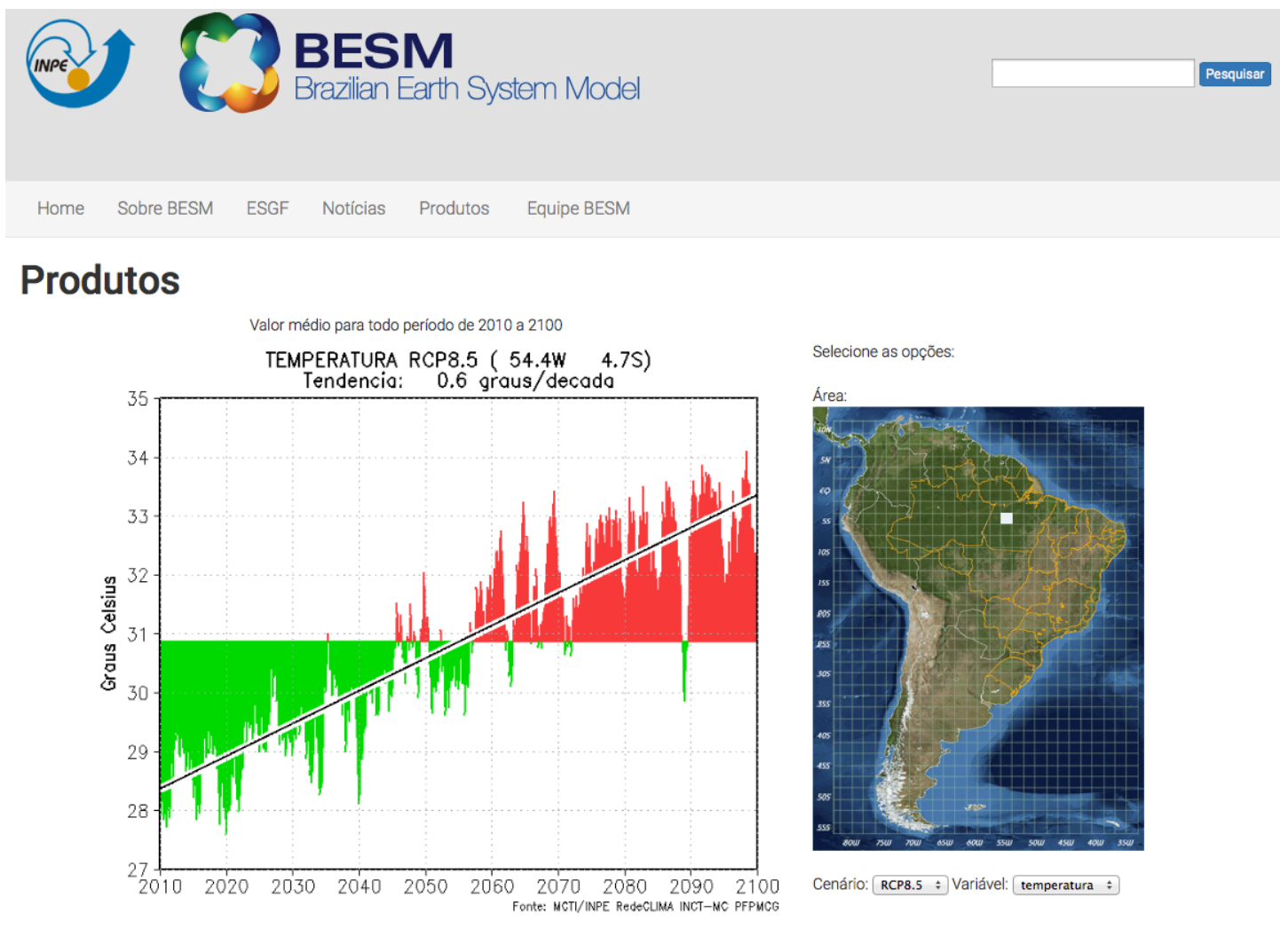
available through ESGF at:

**<https://dm2.cptec.inpe.br/projects/esgf-inpe/>**



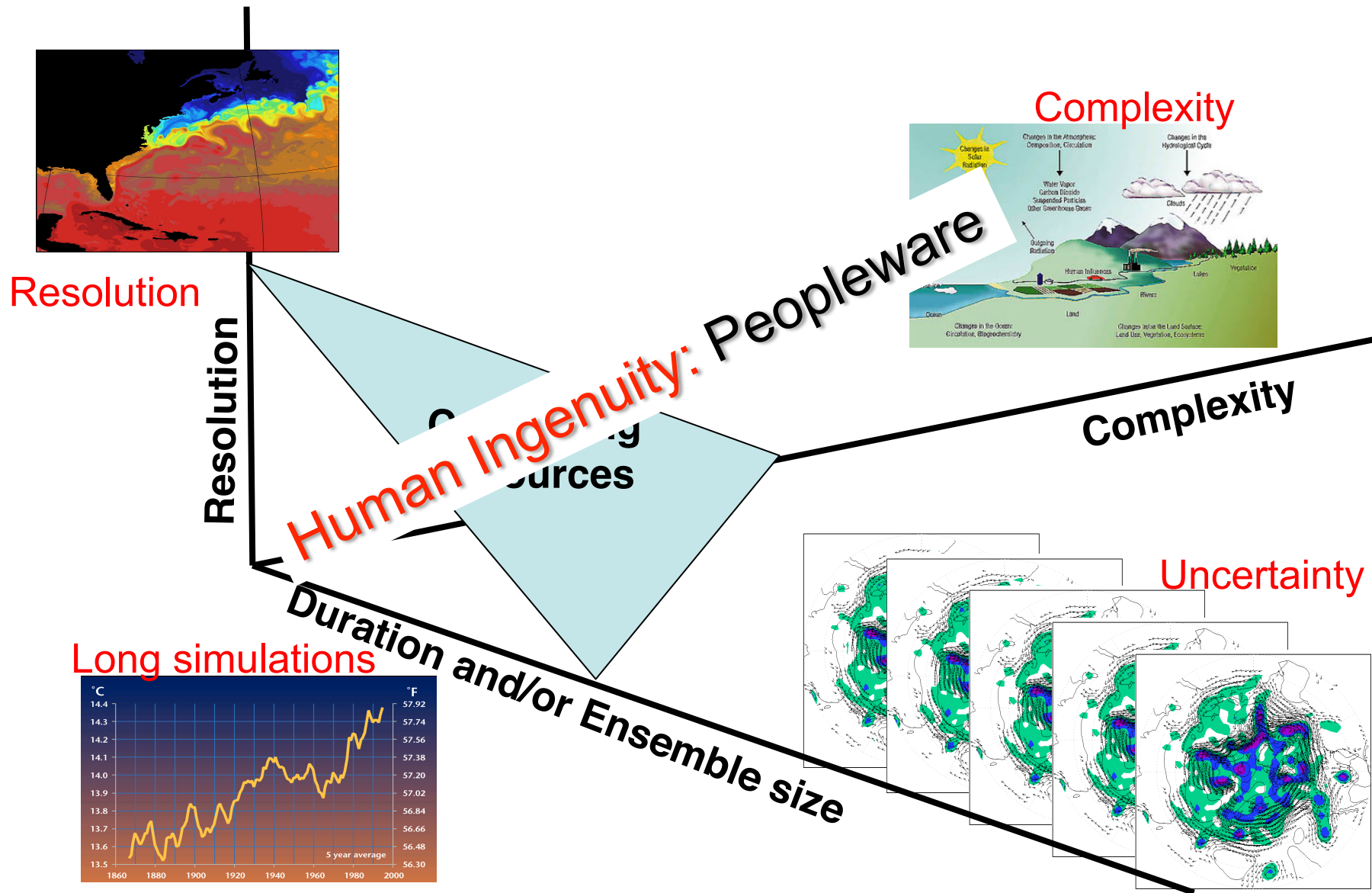


<http://besm.ccst.inpe.br/produtos/>



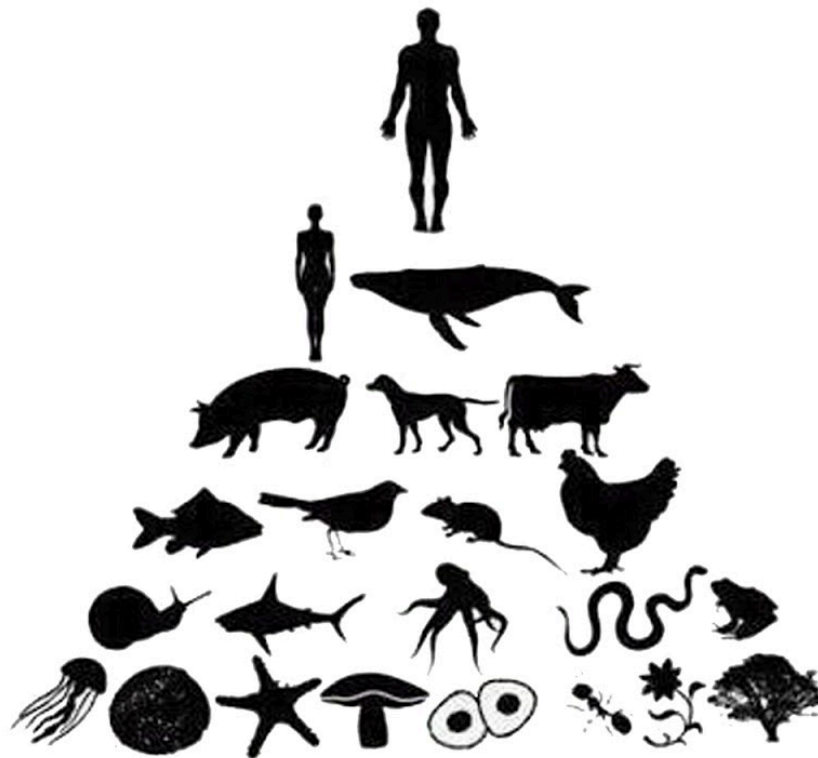
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# Competing demands of resolution, complexity, uncertainty, and long integrations in Climate System Modelling:



# Cooperation: a superior form of evolution.

## EGO



## ECO





*Thank you for your attention*

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