

From atmospheric to Earth System Models : a suite of numerical tools to understand, analyse and anticipate climate changes

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From atmospheric to Earth System Models :
a suite of numerical tools to understand, analyse and anticipate
climate changes
a suite of physical and biogeochemical processes that need to be
considered

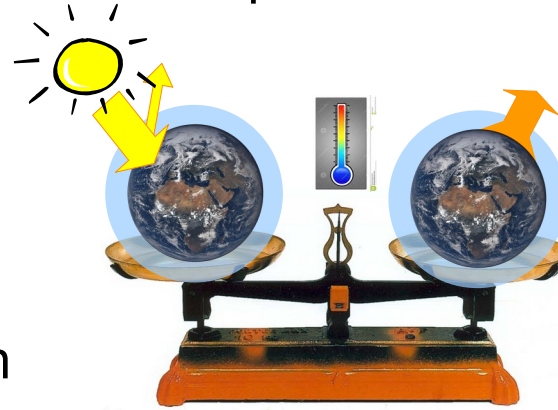
Outlook

- 1) The energy balance models
- 2) Atmospheric single column models
- 3) Atmosphere-Ocean global circulation models
- 4) Earth system models
- 5) km scale models
- 6) Conclusion & Perspectives

Emergence of climate physics

J. Fourier, 1824: *Mémoire sur les températures du globe terrestre et des espaces planétaires* (https://www.academie-sciences.fr/pdf/dossiers/Fourier/Fourier_pdf/Mem1827_p569_604.pdf)

- The **energy balance equation** drives the temperature of all the planets
- **The major heat transfers are**
 1. Solar radiation
 2. Infra-red radiation
 3. Diffusion with the interior of Earth



Joseph Fourier
(1768-1830)

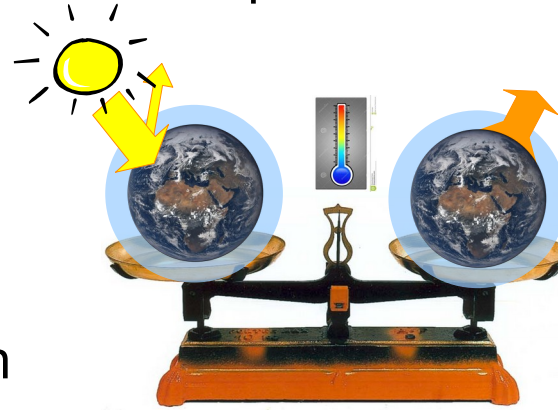
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➤ **The major heat transfers are**

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➤ The **heat diffusion** with the interior of Earth is **negligible**, that discards the thermal death of Earth predicted by Buffon

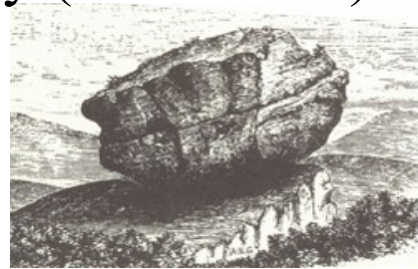
➤ Any change of Earth heat budget will leads to a temperature change

Paleo climate changes

The discovery (1840-1860)



J. de Charpentier



Erratic boulders



L. Agassiz

Cause of these global temperature variations: sun or CO₂? (1860-1900)



James Croll

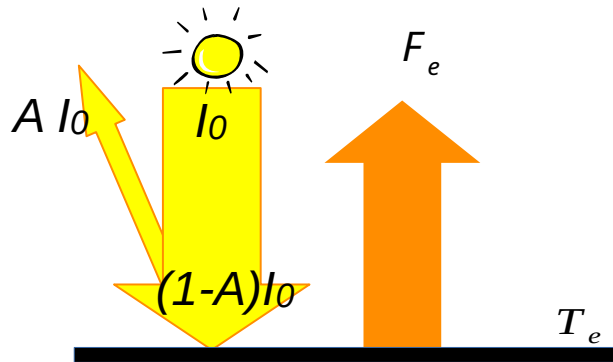
Svante Arrhenius



Emission temperature

I_0 : incoming solar radiation

A : planetary solar reflectivity (albedo)



Steady state: $(1-A) I_0 = F_e$

Stefan-Boltzmann: $F_e = \sigma T_e^4$

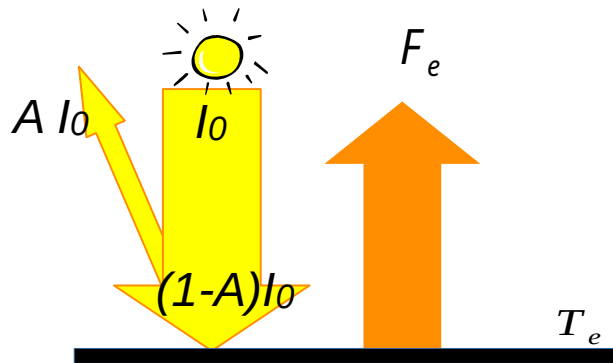
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On Earth : $T_e = 255\text{K} (-18^\circ\text{C})$

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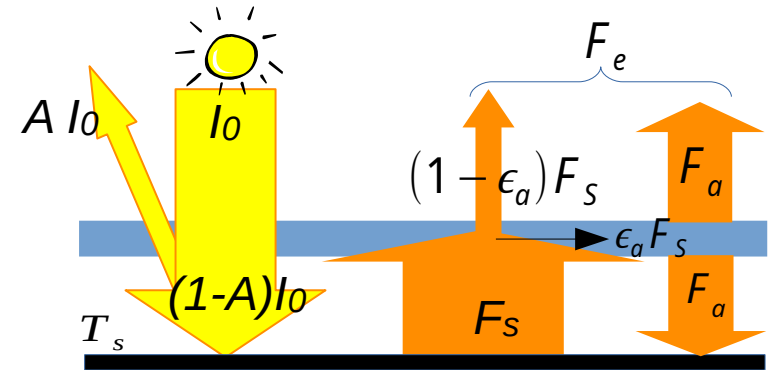
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Single layer model

ϵ_a : planetary emissivity/absorptivity

Isothermal homogeneous atmosphere



Surface temperature:

$$\sigma T_s^4 = \frac{(1-A) I_0}{1 - \epsilon_a/2}$$

Earth observed surface temperature :

$T_s \approx 288\text{K} (15^\circ\text{C})$

[Arrhenius 1896]

Single layer model

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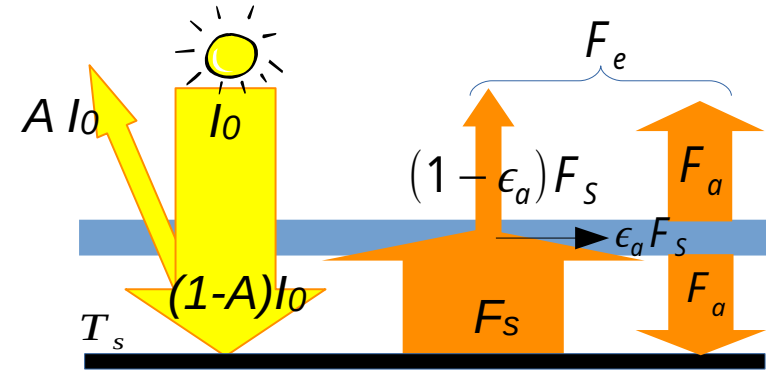
Arrhenius (1896):

δCO_2 concentration

$$\delta T_s = f(\delta I_0, \delta A, \delta \epsilon_a)$$

A doubling of the CO_2 concentration
 $\Rightarrow \delta T_s \approx 4\text{K}$

Energy Balance Models are still used, e.g.
for climate sensitivity feedback analysis



Surface temperature:

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[Arrhenius 1896]

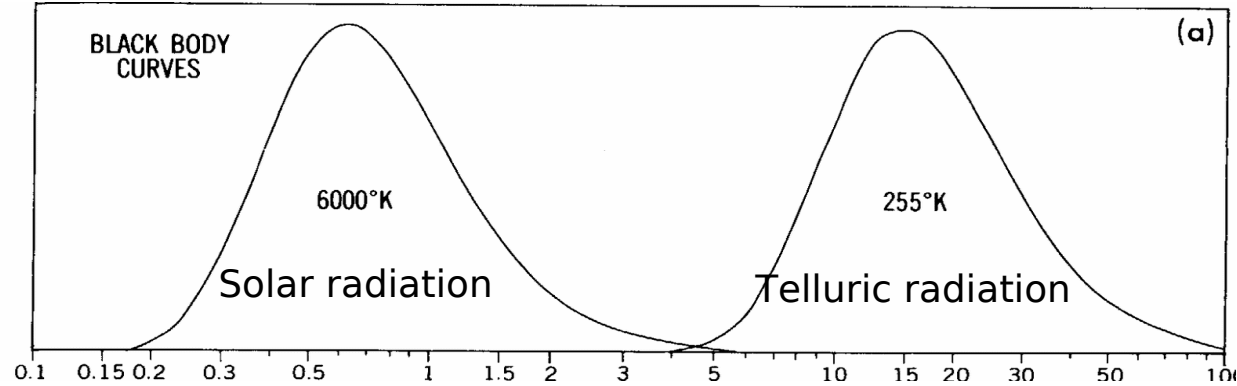
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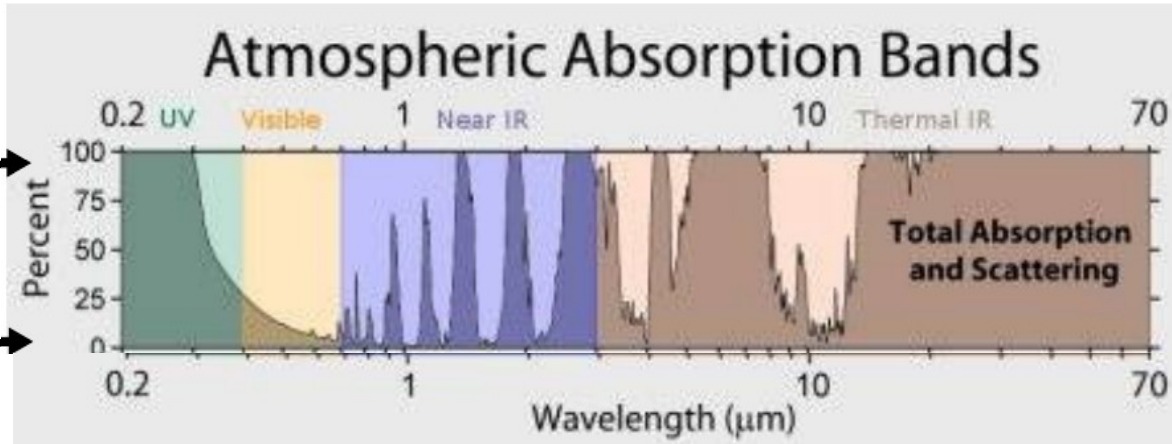
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Absorption by the Earth atmosphere

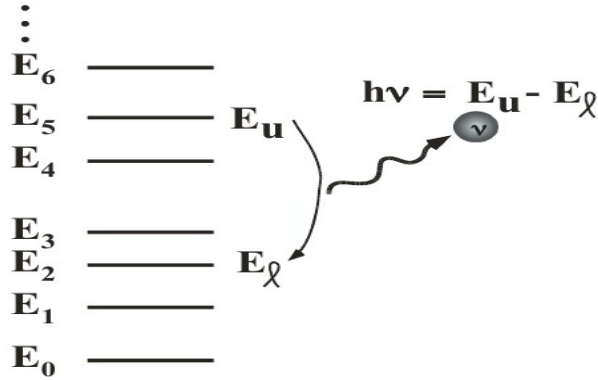


Opaque

Transparent

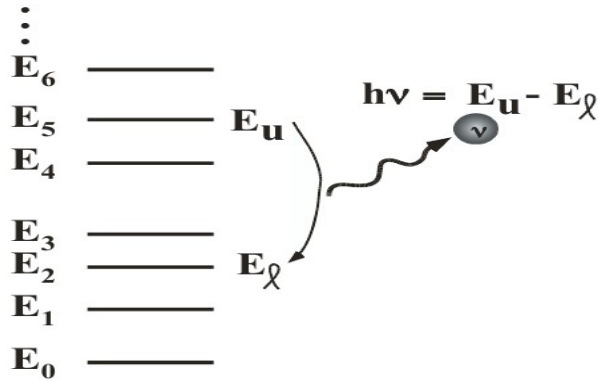


Absorption by gases



- **Line emission and absorption** by transition between states of different energy
- In the infra-red: level of energy correspond to change in vibration and vibration-rotation of molecules
- Complex molecules are better absorbing

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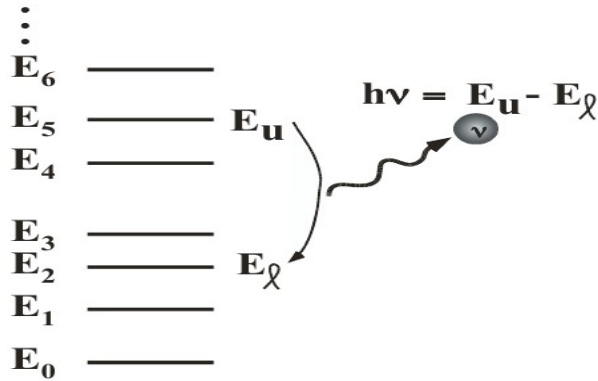
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Line profile:

- Spontaneous emission: negligible (long lifetime)
- Collision between molecules: most important. Lorentz profile
- Doppler effect: negligible except tant in the high atmosphere

The lines widen as the pressure increases. Lines are very thin in the stratosphere and above.

Absorption by gases



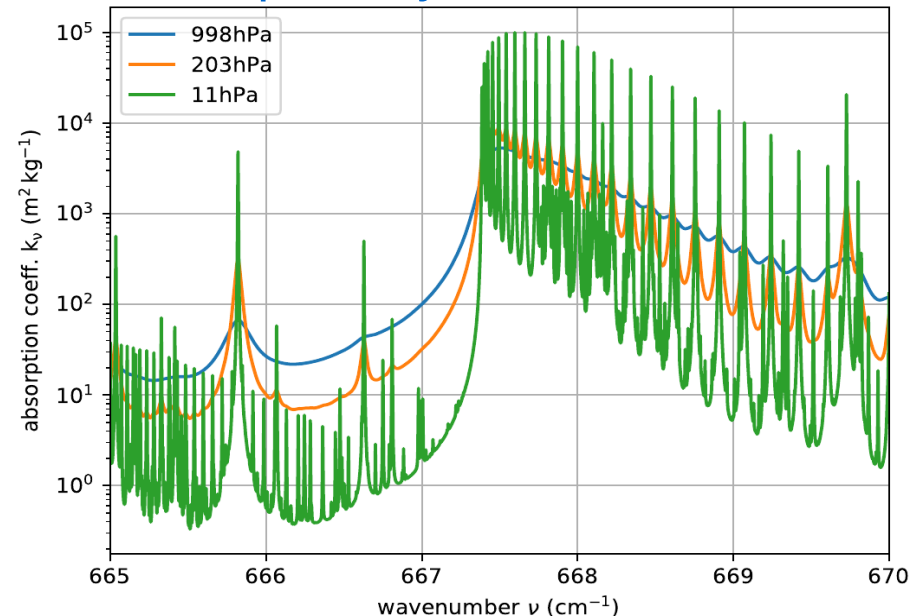
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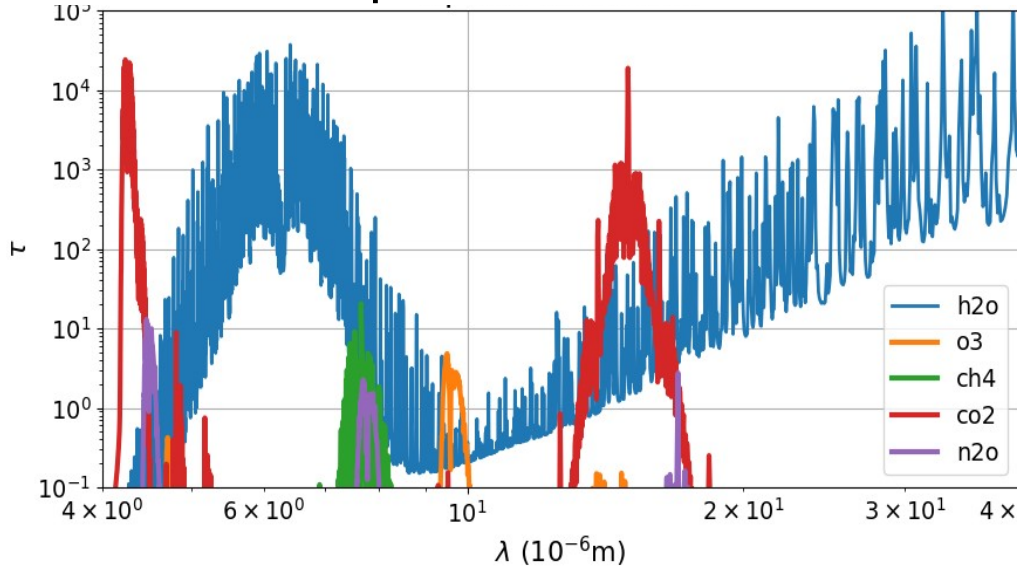
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Absorption by CO₂ near 667cm⁻¹

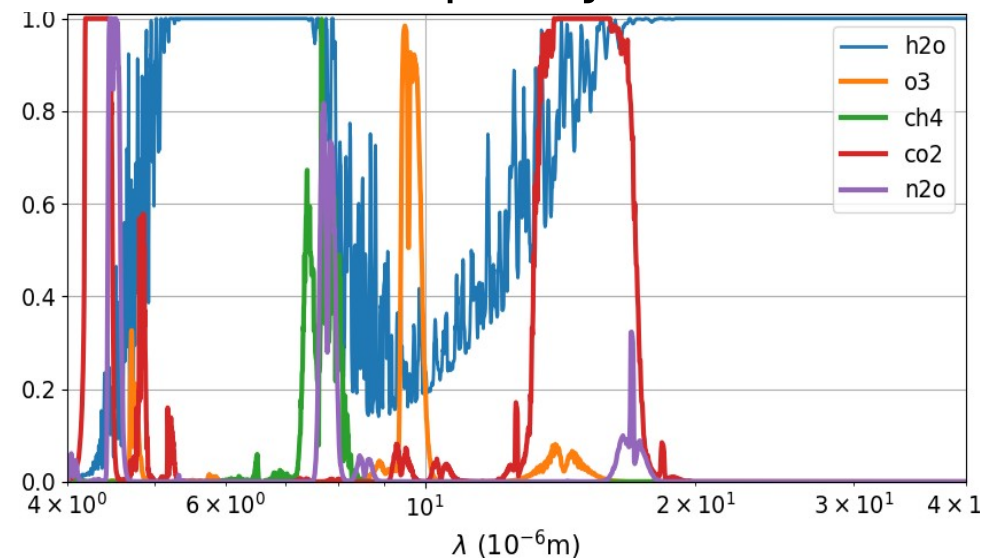


Atmospheric absorption in the infrared

Optical thickness



Absorptivity



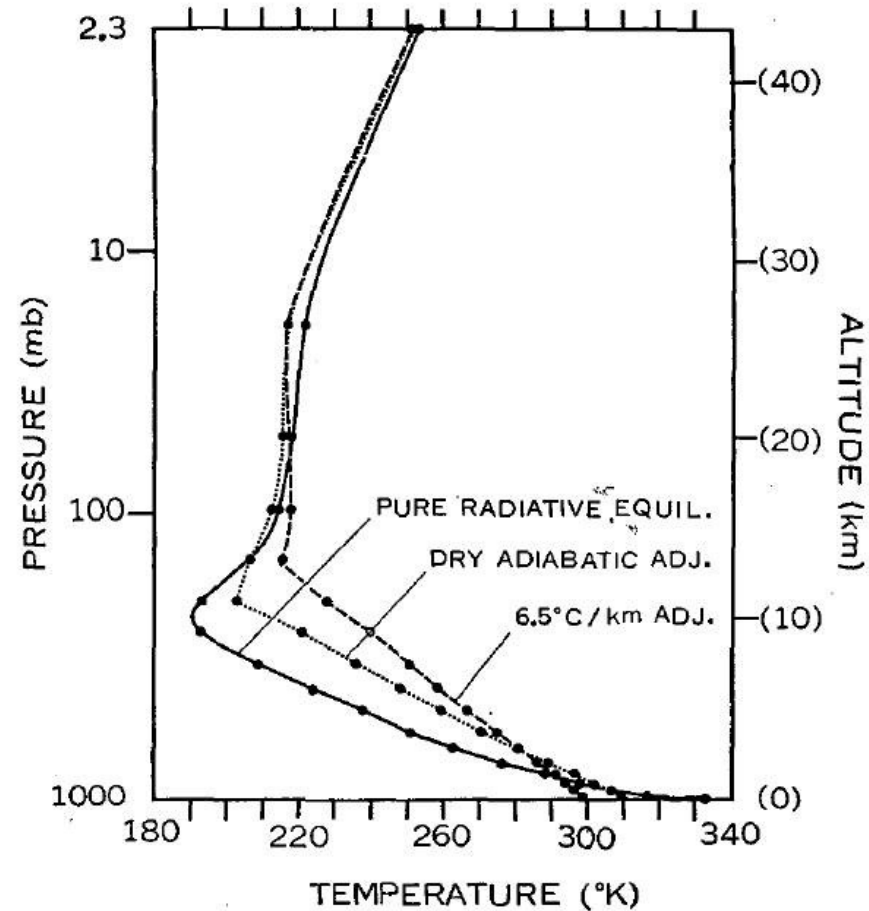
In the 50-60s:

- experimental and theoretical progress in gas spectroscopy
- direct numerical integration over frequencies are very expensive because of absorption lines ("line by line" models used as reference)
- statistical modelling of absorption lines makes radiative transfer calculations in the atmosphere possible (wide or narrow band statistical models)

Single column model (from the 60's)

Manabe and Strickler, 1964: *Thermal Equilibrium of the Atmosphere with a convective adjustment*

- The atmosphere is cooled by the emission of infrared radiation into space
- This cooling destabilizes the atmosphere and creates convection
- **Convection** tends to bring the vertical temperature profile towards the **critical profile** (convective adjustment)



[Manabe and Strickler, 1964]

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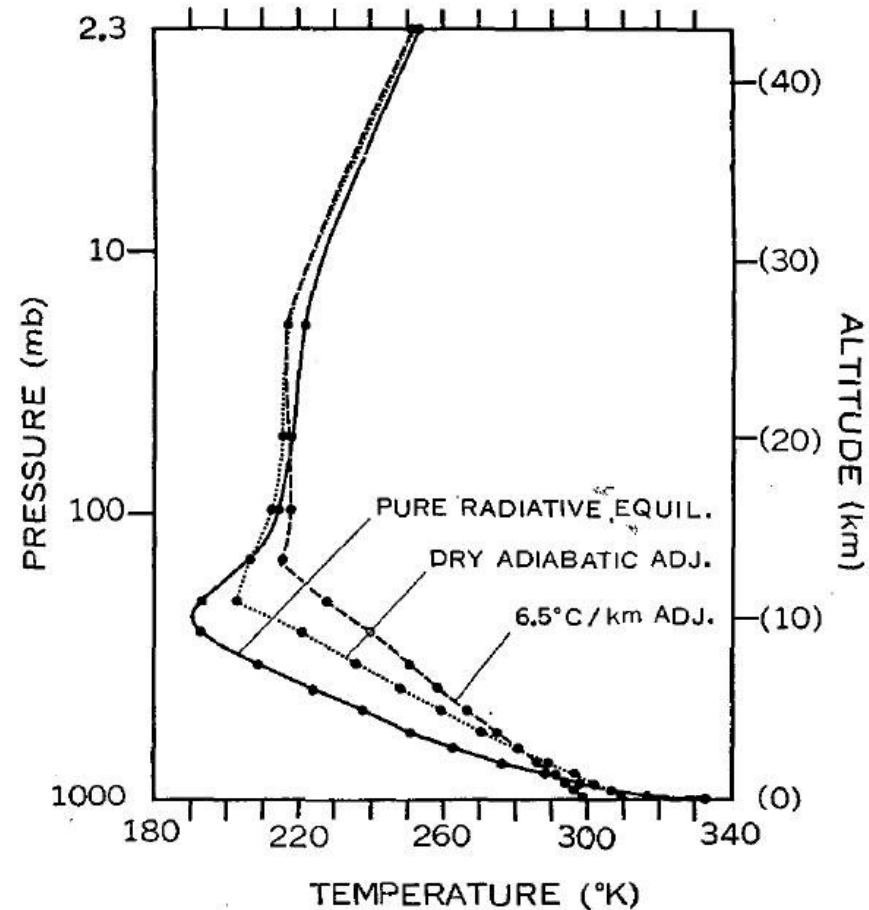
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Critical profile: **dry air** parcel moving up or down:

- Energy conservation, Perfect gas, Hydrostatic equilibrium, No heat exchanges (adiabatic)

$$\Rightarrow \frac{dT}{dz} = -\frac{g}{C_p} = \Gamma_a \approx -10 \text{ K/km}$$



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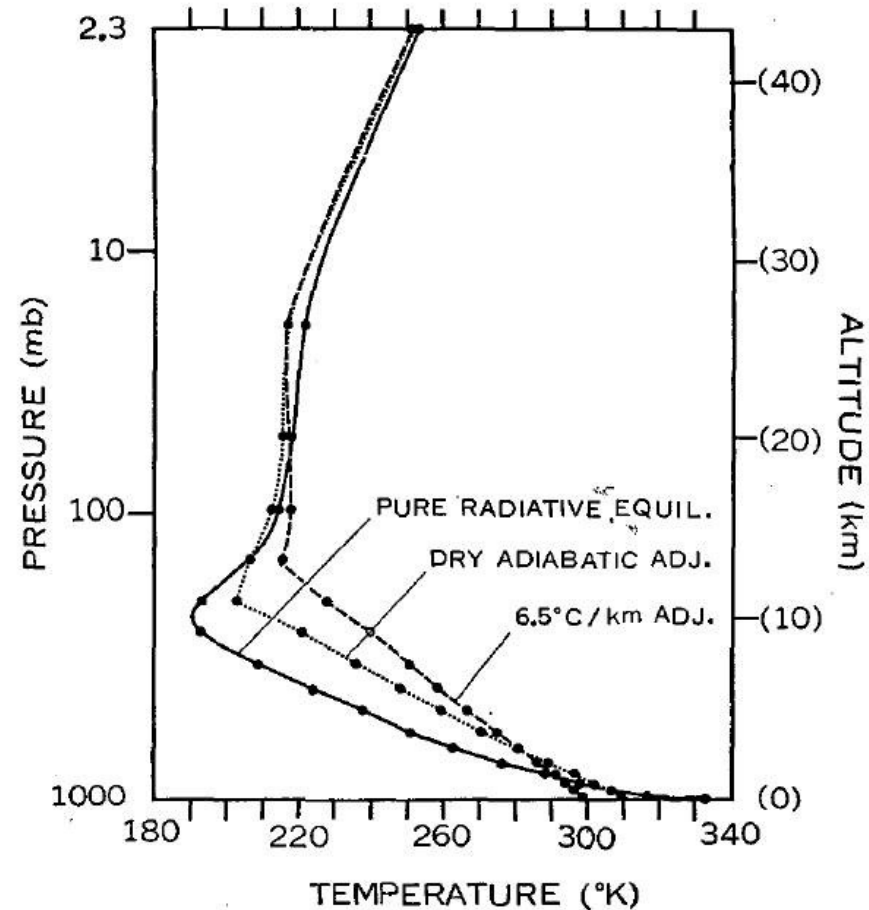
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Humid air: including latent heat: $\Gamma \approx -7 \text{ K/km}$



[Manabe and Strickler, 1964]

Vertical profile of the atmosphere

Fraction of the total
mass of air below
this altitude

99.9%

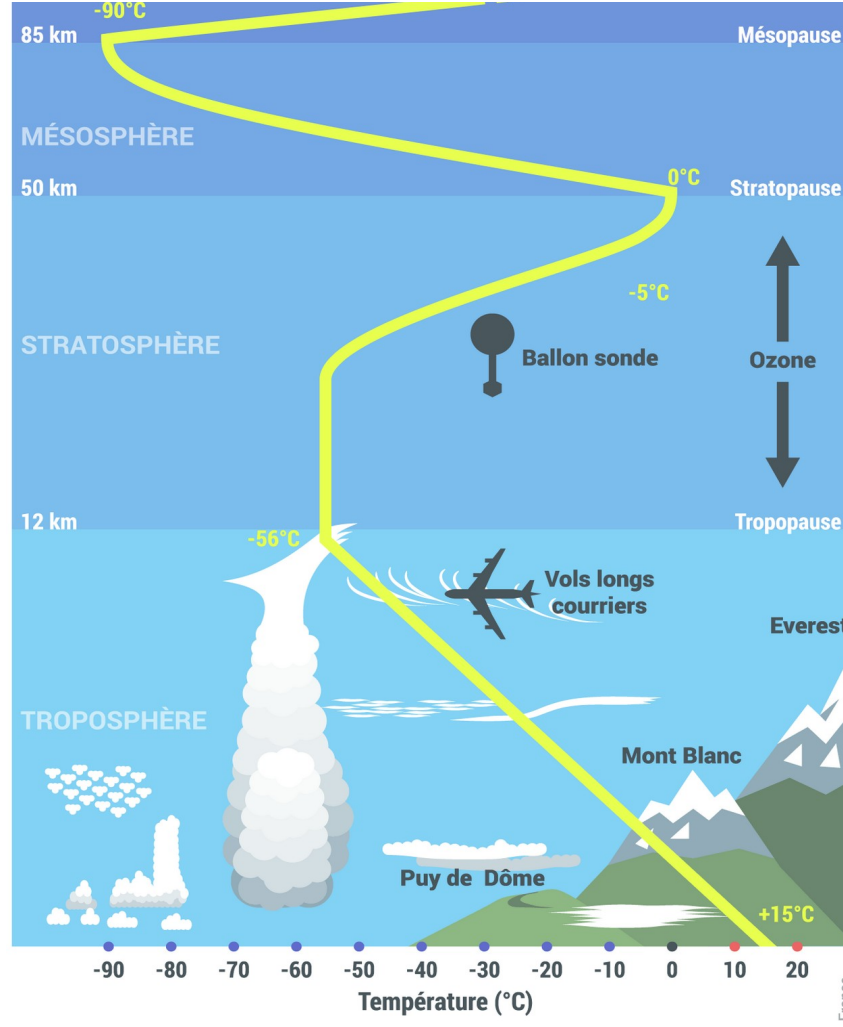
80-90%

Stratosphere:

- *Radiative equilibrium*
- Temperature driven by radiation

Troposphere:

- Radiative-convective equilibrium
- **Temperature profile driven by the thermodynamic**

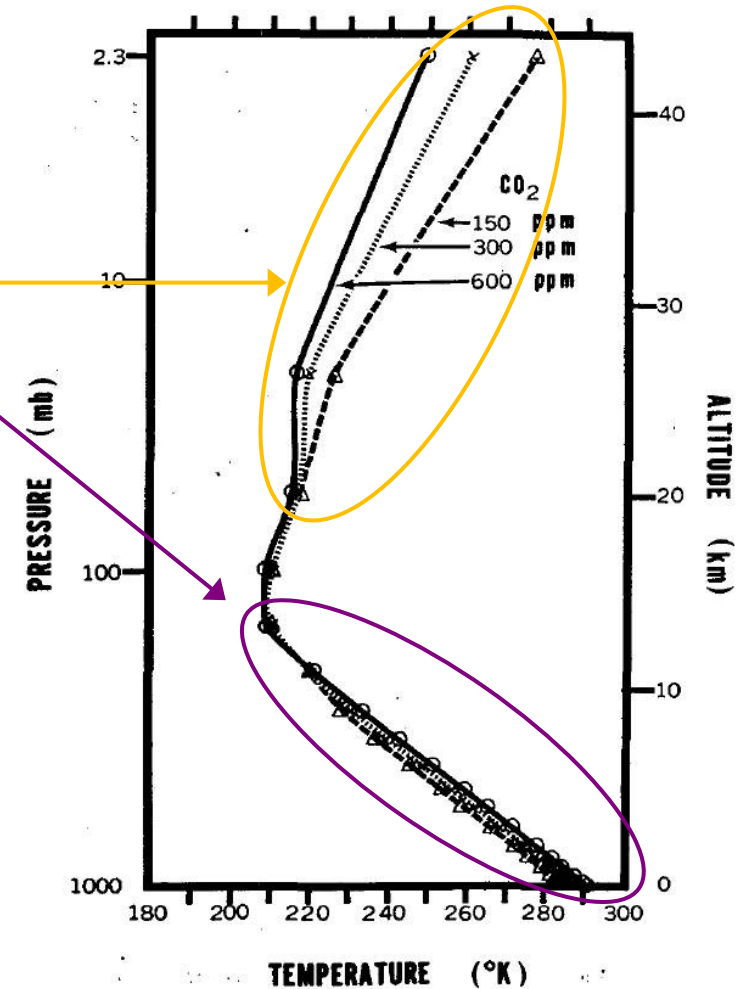


Single column model (from the 60's)

Manabe and Wetherald, 1967: *Thermal Equilibrium of the Atmosphere with a Given Distribution of Relative Humidity*

Sensitivity experiment: **doubling of CO₂ concentration:**

- Decrease of the stratospheric temperature
- Increase of the surface and tropospheric temperature



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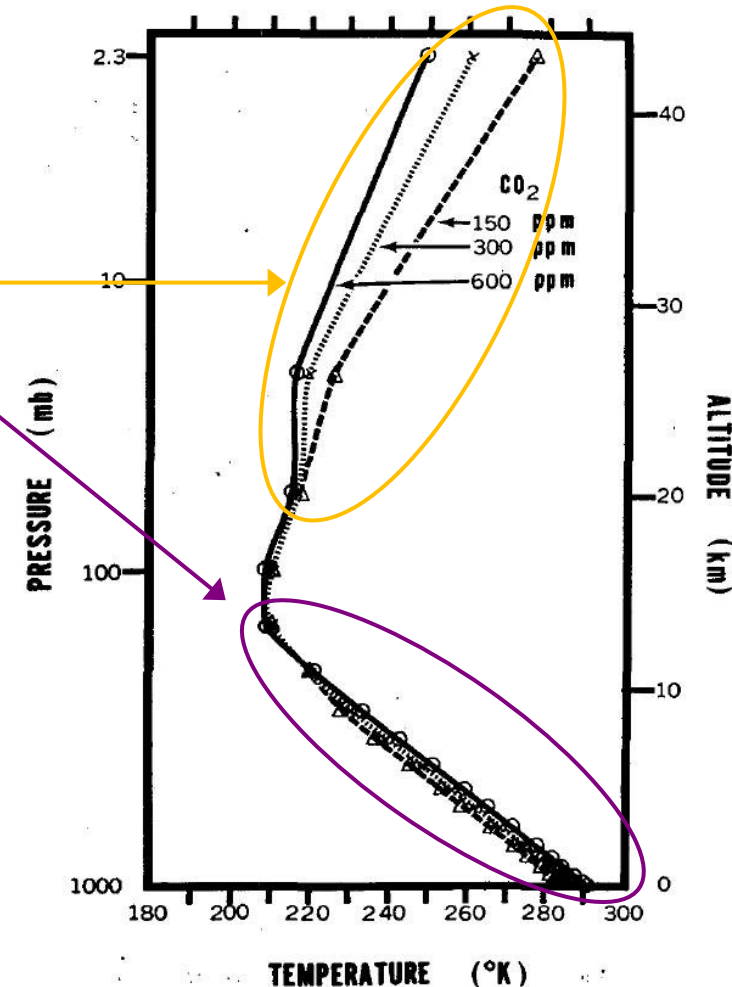
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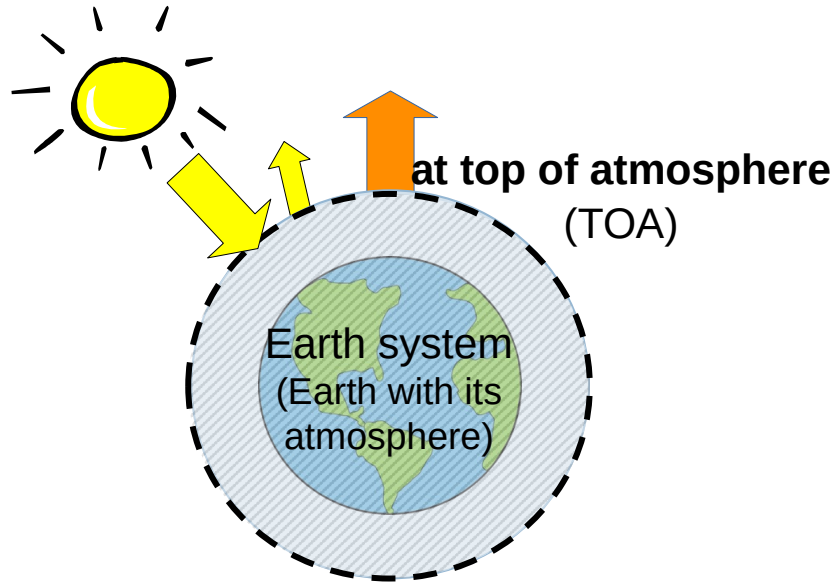
The temperature increase highly depends on water vapour evolution. At the surface:

- with **fixed absolute humidity** $\Delta T_s = 1.4K$
- with **fixed relative humidity** $\Delta T_s = 2.9K$



Energy budget at the surface or at the top of atmosphere?

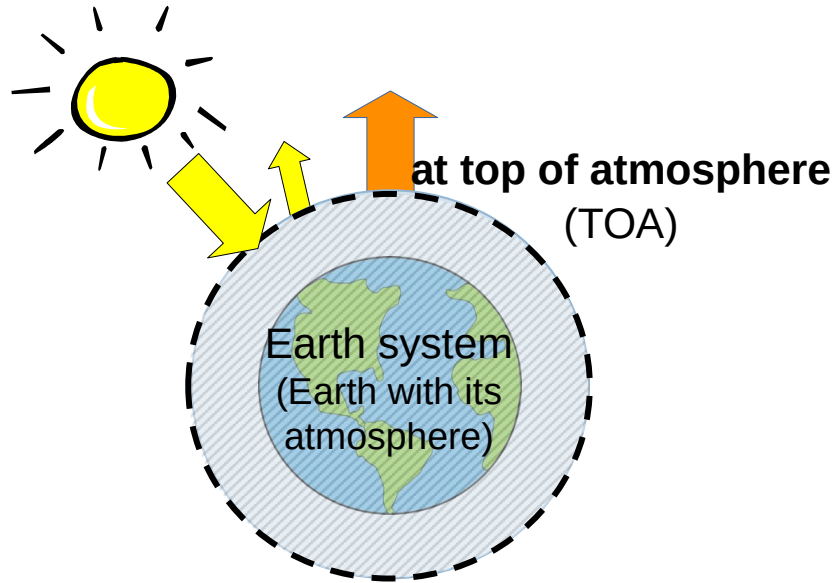
Steady state (energy equilibrium): the energy balance is zero at both interfaces.



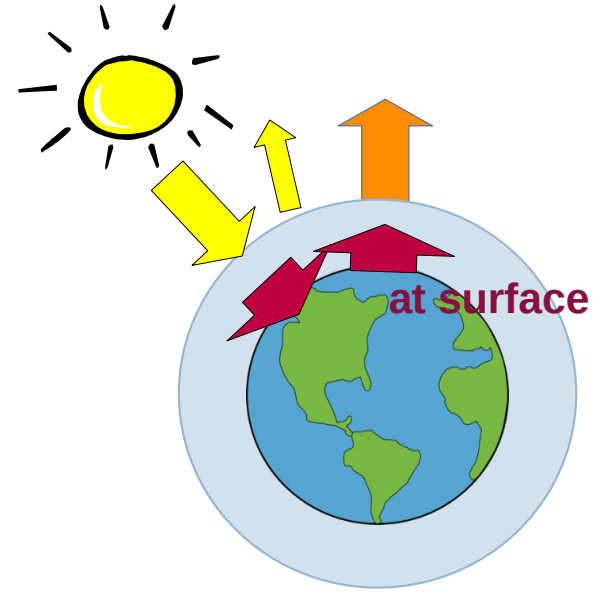
- The Earth (and other planets) is an open system with the rest of the universe
- Radiation is the only process of energy transfer
- Incoming solar radiation is independent of the radiation emitted by the Earth

Energy budget at the surface or at the top of atmosphere?

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- Atmosphere and surface are two open systems
- Strong energy coupling between surface and atmosphere
- Many energy exchange processes

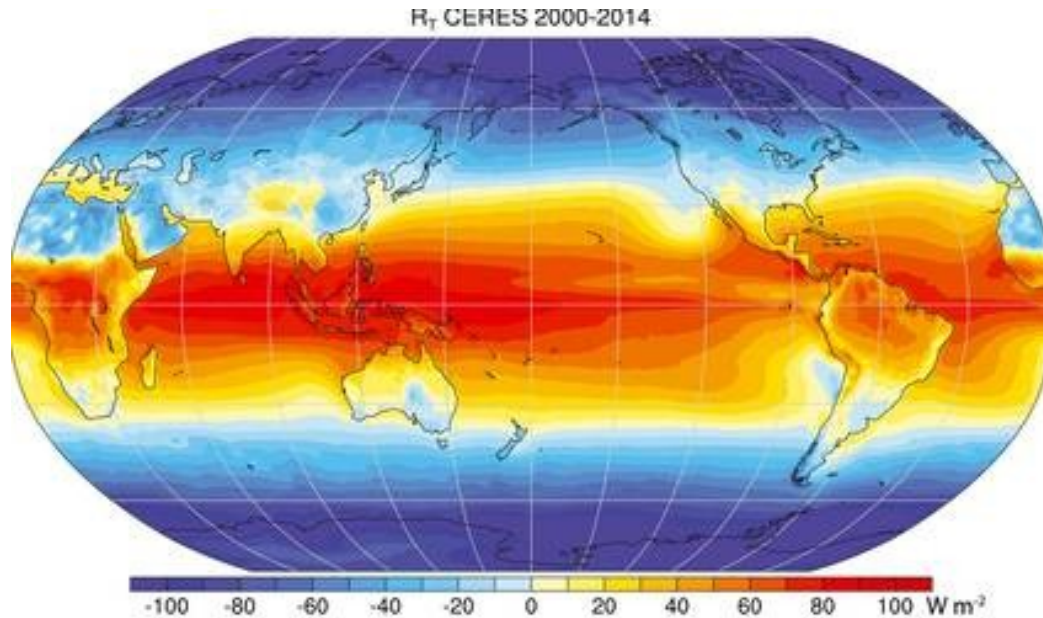
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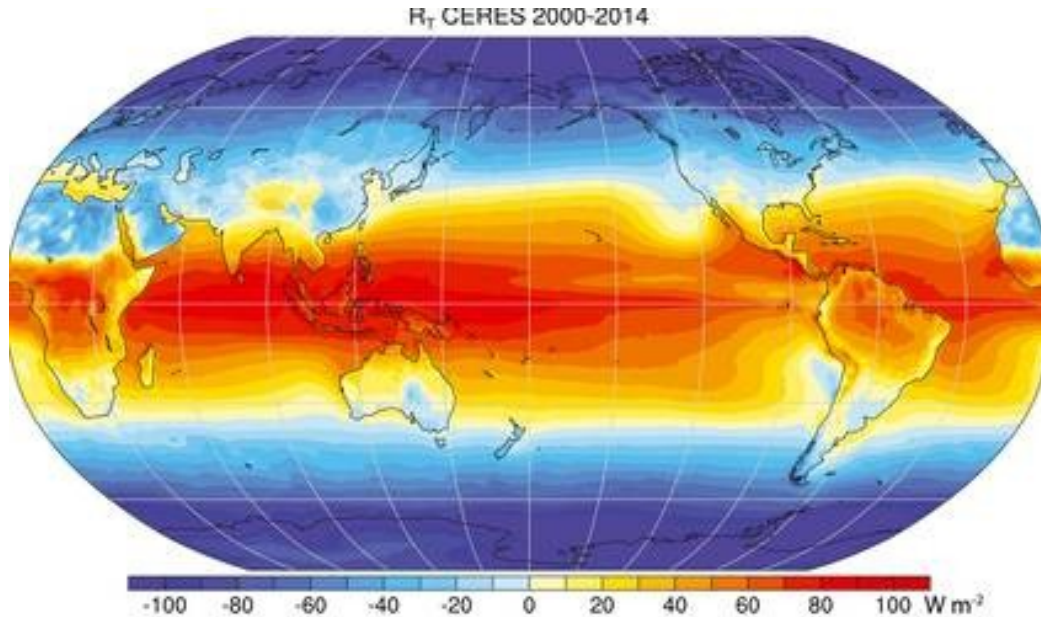
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Average annual mean TOA net radiation



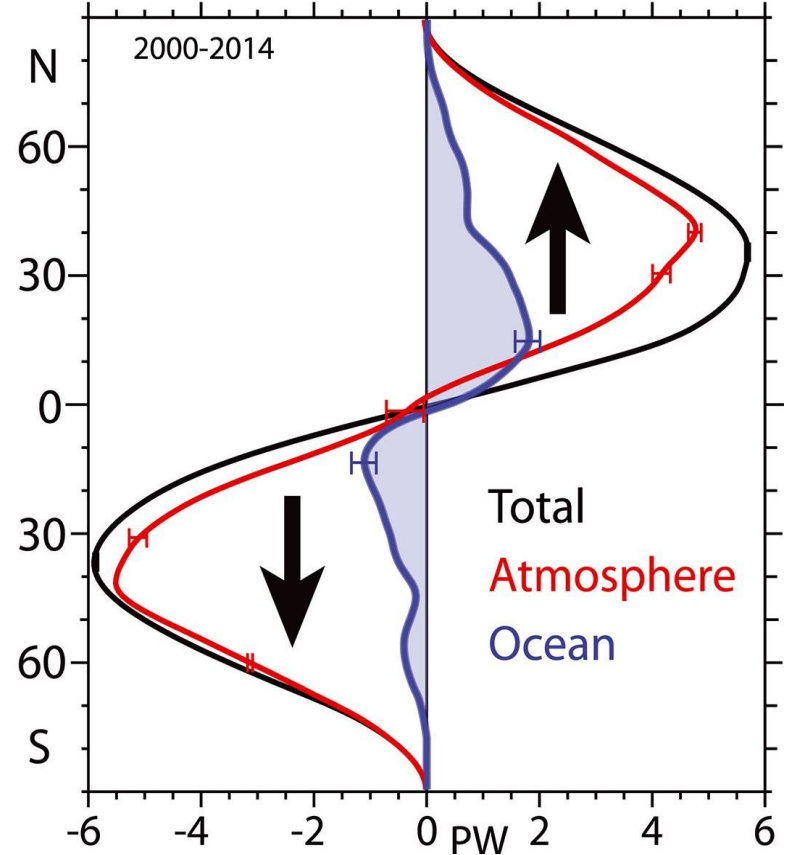
[from CERES mission, NASA]

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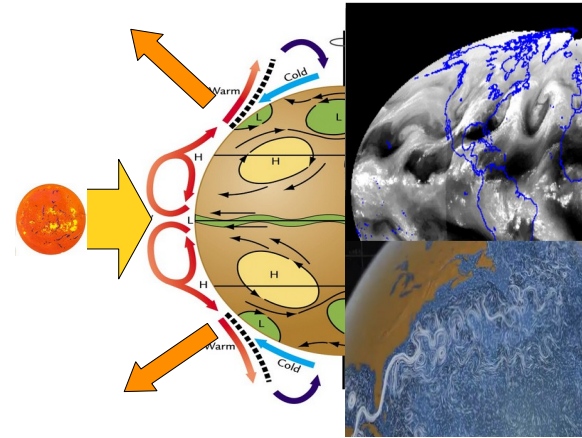
[from CERES mission, NASA]

Annual and zonal means northward energy transports

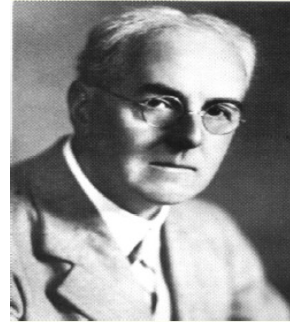


[Trenbert & Fatsulo, 2017]

Numerical climate models (from the 60's) (numerical weather simulators)



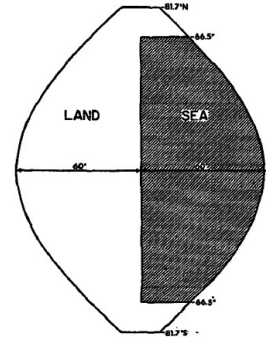
W. Bjerknes
(1862–1951)



L. F. Richardson
(1881–1953)



J. von Neumann
(1903–1957)



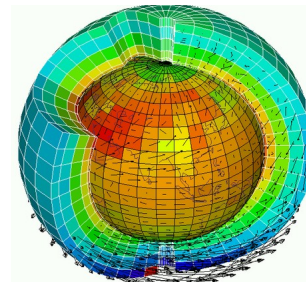
J. Charney
(1917–1981)



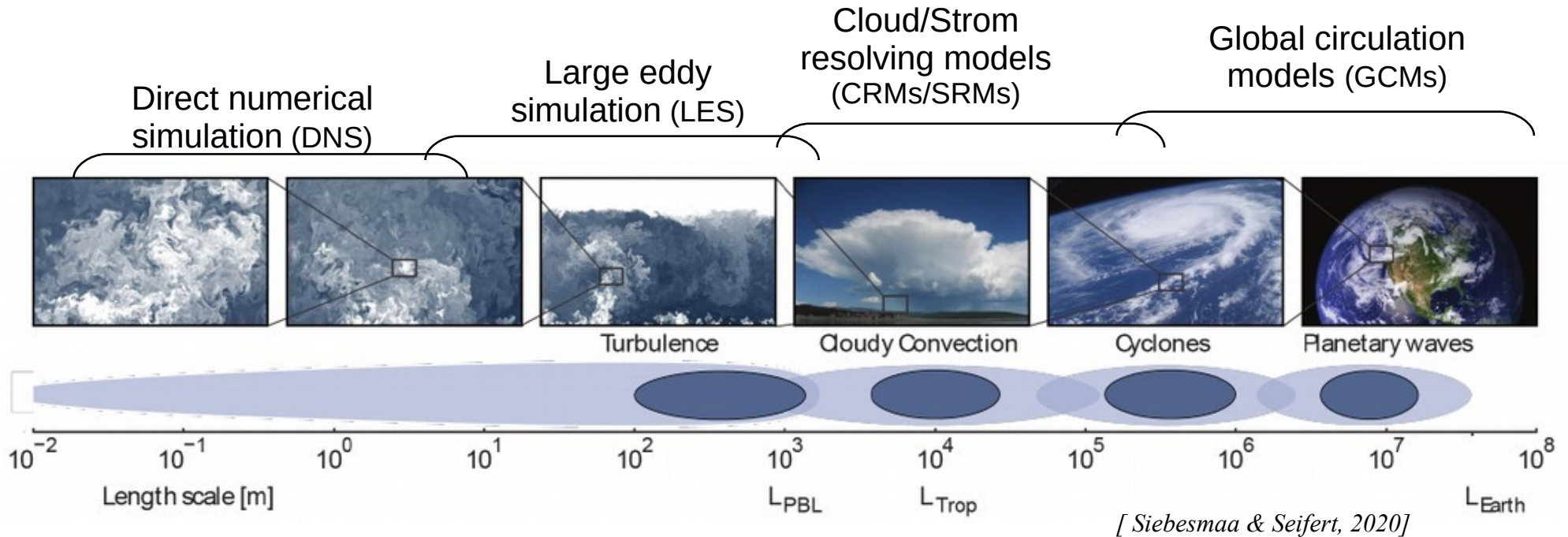
J. Smagorinsky
(1924–2005)



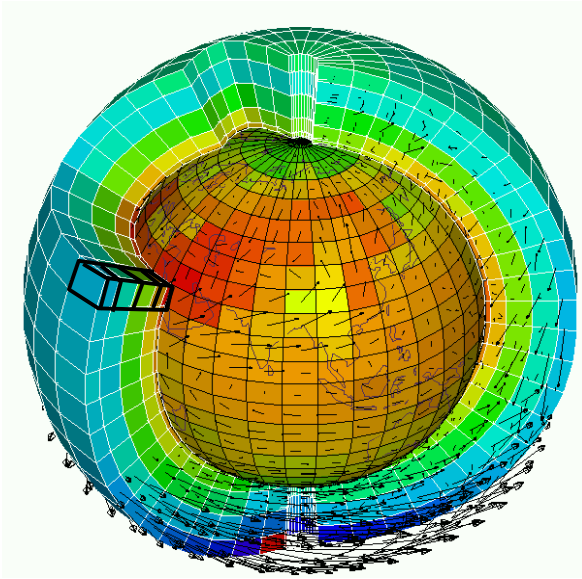
S. Manabe
(1931–)



A variety of numerical models to handle the wide range of time and space scales involved



General circulation models (GCMs)



Dynamical core : discretized version of the equations of fluid mechanics

- Mass Conservation

$$D\rho/Dt + \rho \operatorname{div}\underline{U} = 0$$

- Energy Conservation

$$D\theta / Dt = \textcolor{red}{Q} / C_p (p_0/p)^\kappa$$

- Momentum Conservation

$$D\underline{U}/Dt + (1/\rho) \operatorname{grad}p - g + 2 \underline{\Omega} \wedge \underline{U} = \textcolor{red}{F}$$

- Conservation of Water (and other species)

$$Dq/Dt = \textcolor{red}{S}q$$

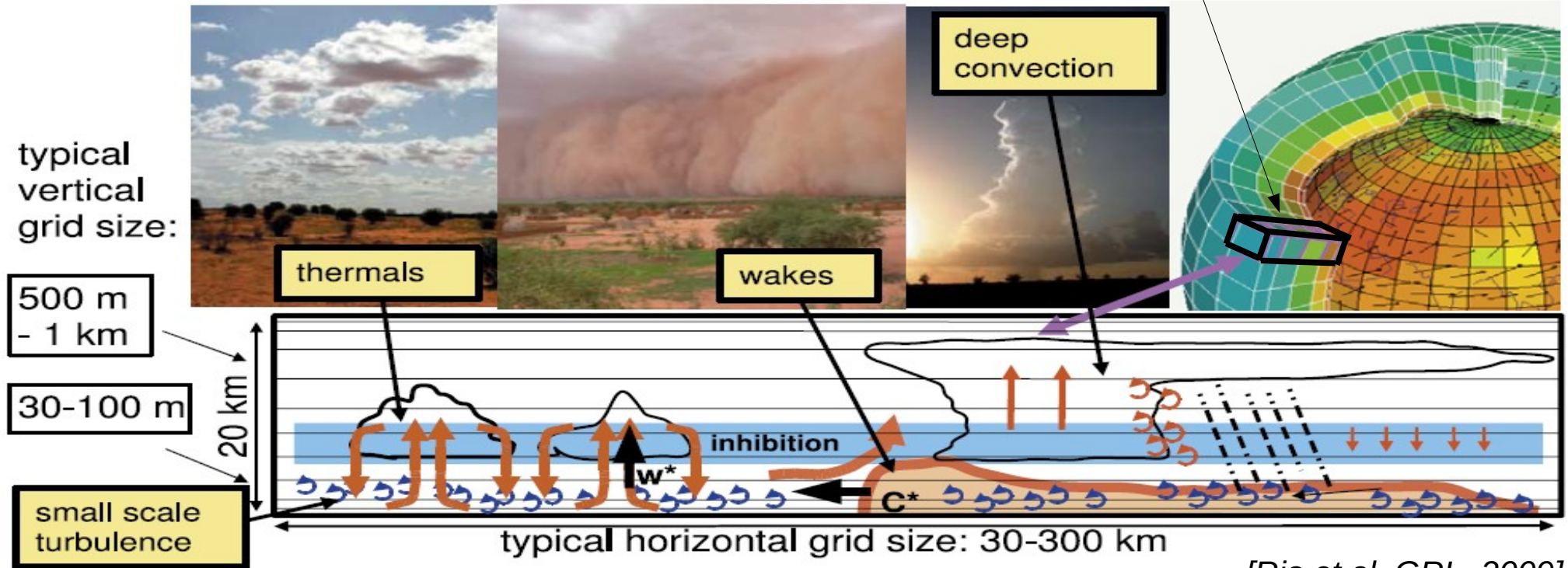
In red, source terms : other than fluid mechanics and unresolved scales

General Circulation Models

- Developed in the 60s for the purpose of weather forecast
- Based on a discretized version of the « primitive equations of meteorology »
- On the Earth but also very rapidly on other planets
- A number of important process are subgrid scale and must be parameterized

Modeling of unresolved scales with sub-models (parameterization)

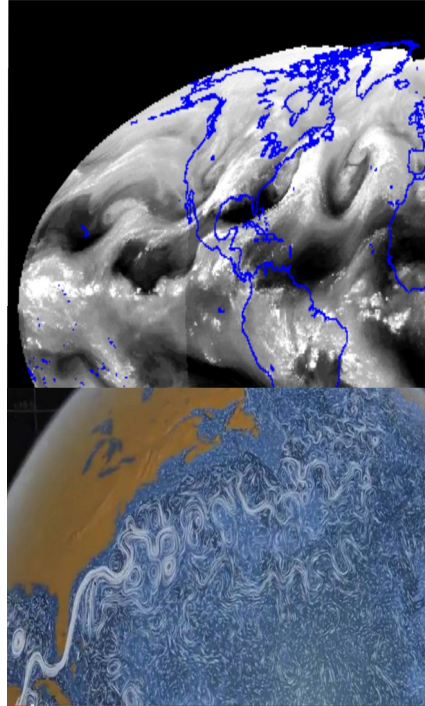
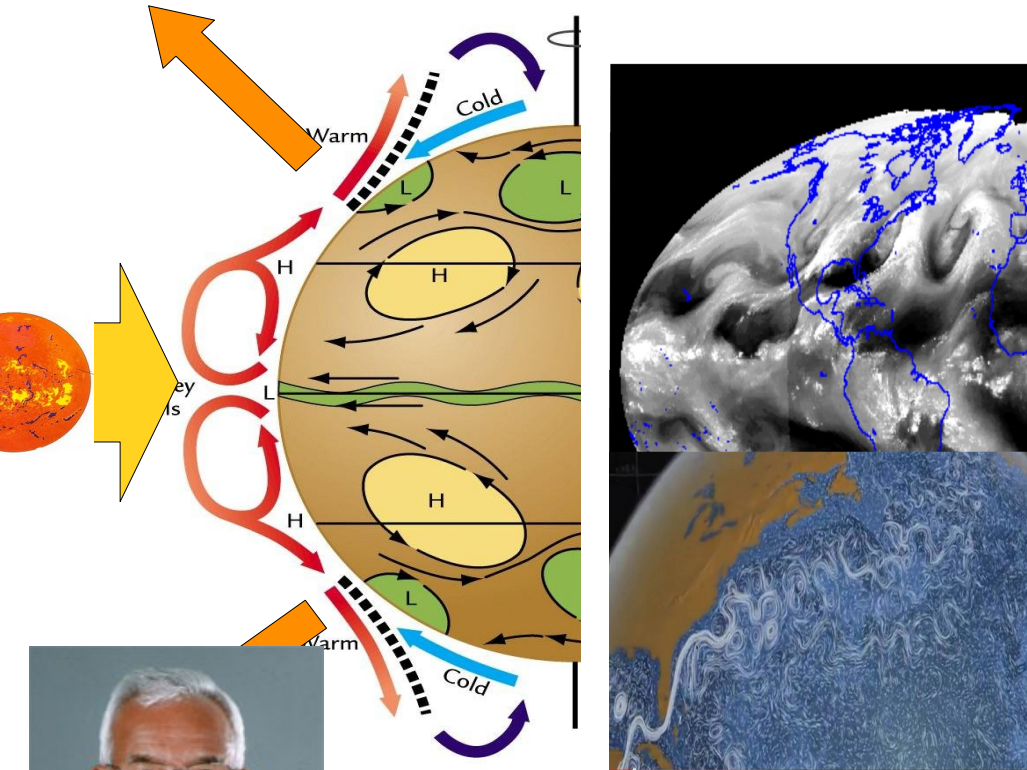
A typical vertical atmospheric column



Typical time step : a few minutes to half an hour

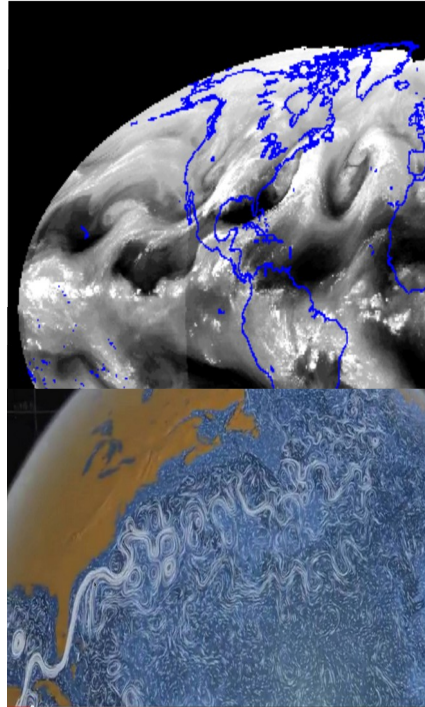
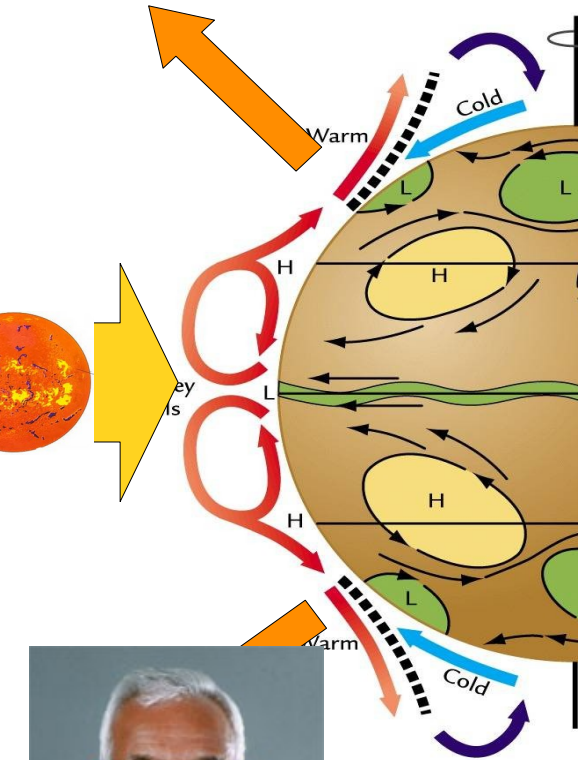
[Rio et al, GRL, 2009]

Climate: from radiation, rotation, circulation



Syukuro Manabe (1931-)
Nobel prize in Physics 2021

Climate: from radiation, rotation, circulation to dynamical systems



- Atmospheric circulation, water vapor, clouds, snow, surface ocean, sea ice, etc.
- Same + ocean circulation, CO_2 continental biosphere, CH_4 , etc.
- Ice sheets, continental CO_2
- Geological" CO_2 (continental erosion, volcanism)

Time constant
(years)

10

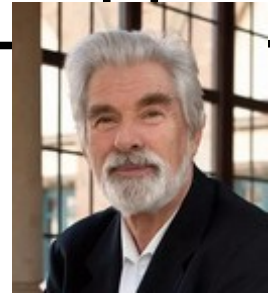
100

1000

$>10^6$



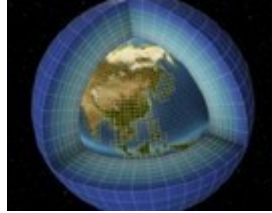
Syukuro Manabe (1931-)
Nobel prize in Physics 2021



Klaus Hasselmann (1931-)
Nobel prize in Physics 2021

Use of Climate models

e.g. the IPSL

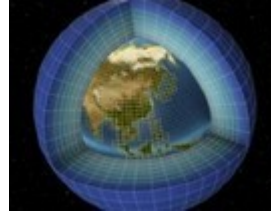


Climate model

3D representation of the atmosphere, ocean, sea-ice, land-surface (coupling of different models)

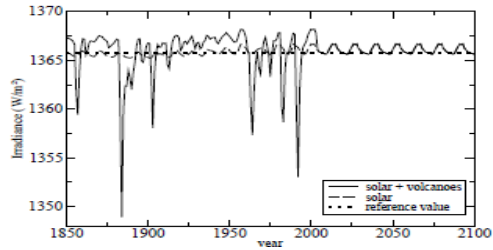
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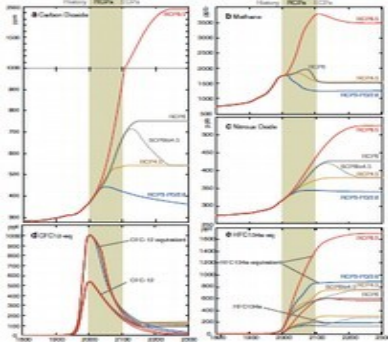


Natural and anthropogenic forcings

Sun and volcanos



Greenhouse gases

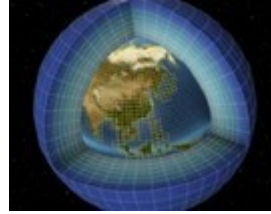


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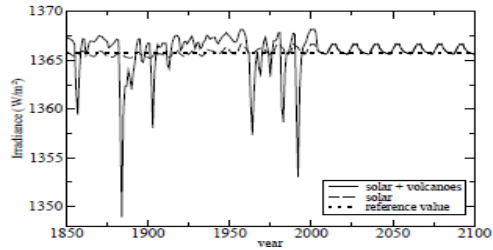


Climate model

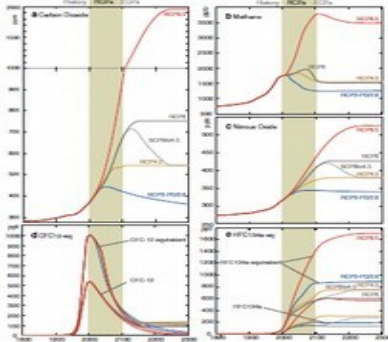
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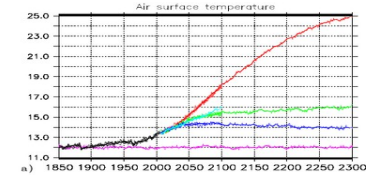
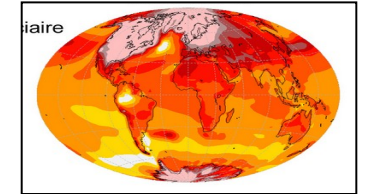
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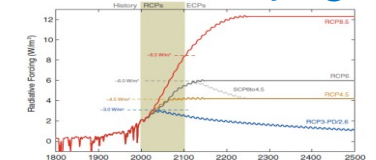
Greenhouse gases



Results Climate changes

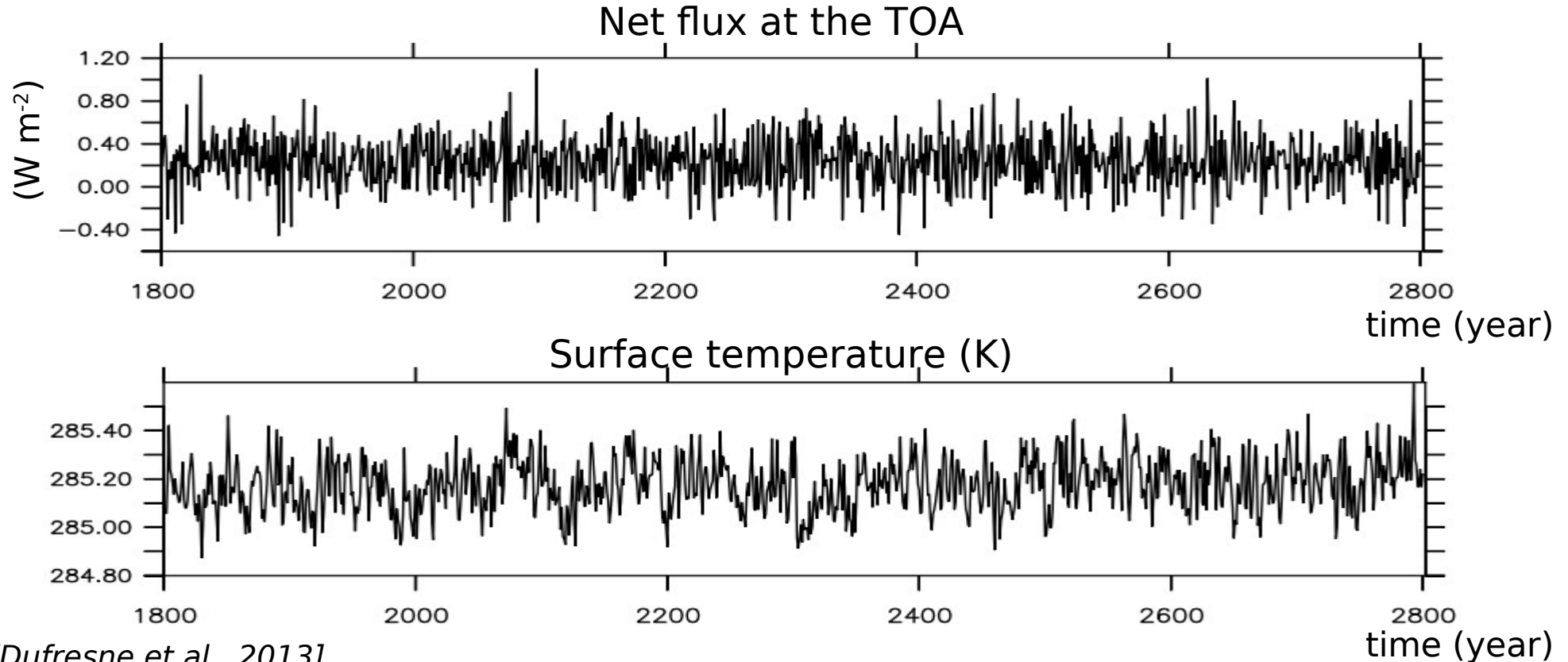


Radiative forcings



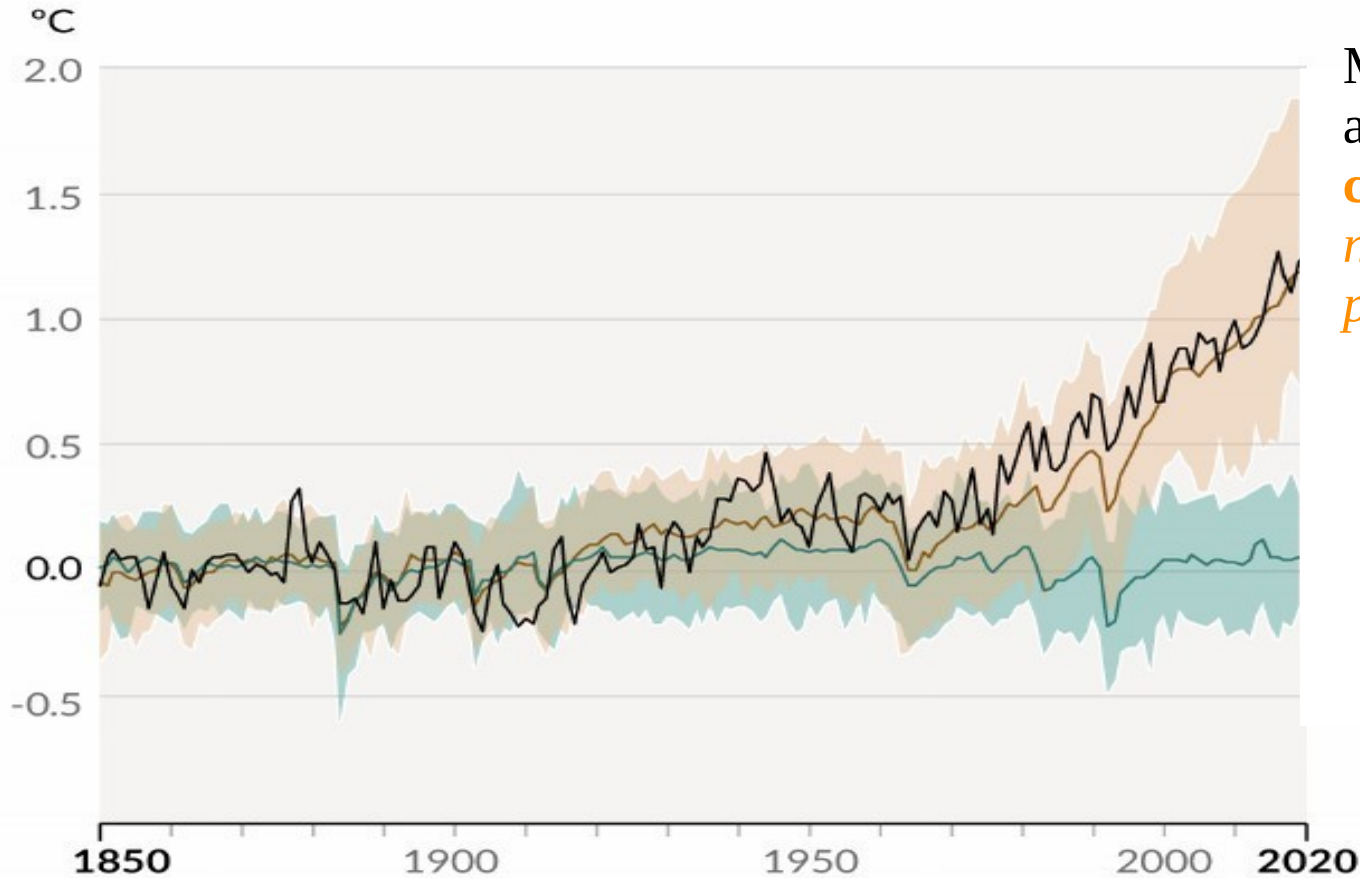
Performing a control run to obtain a stationary reference simulation

IPSL-CM5A-LR model, preindustrial control run



[Dufresne et al., 2013]

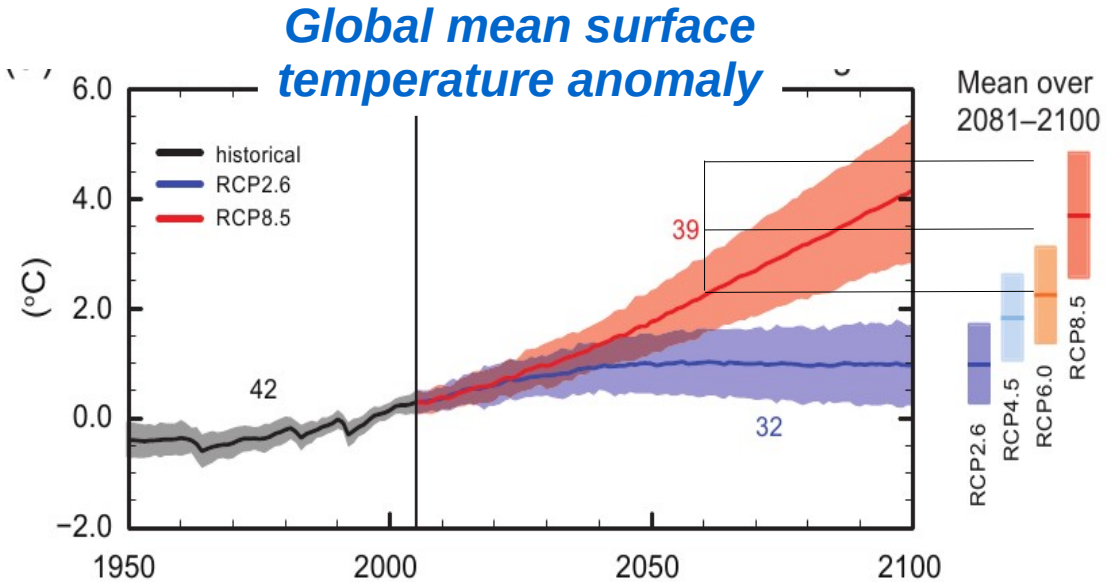
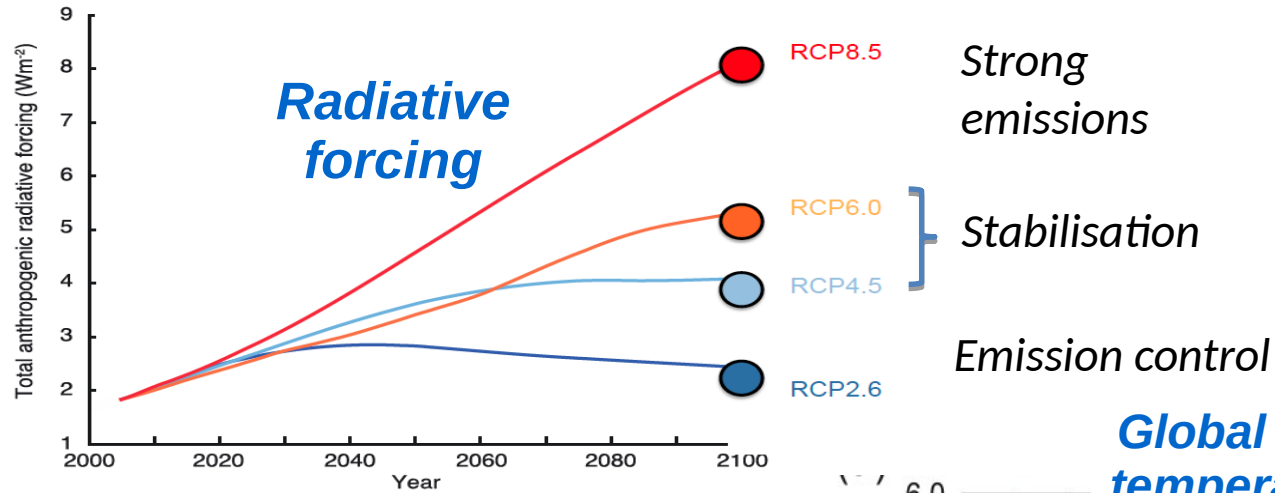
Human activities and recent global warming



Mean surface temperature anomalies **observed** and **computed** considering *both the natural and anthropogenic perturbations*

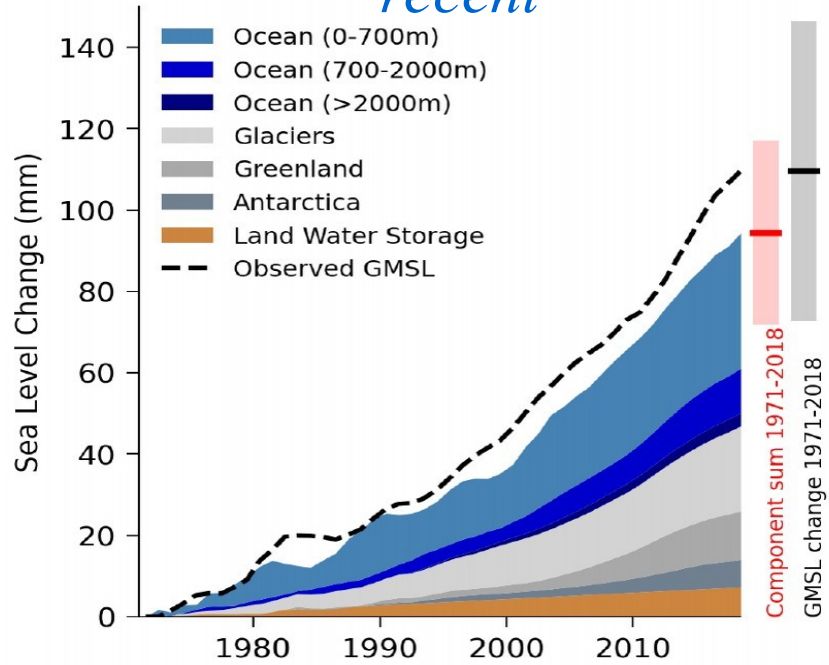
Mean surface temperature anomalies **observed** and **computed** considering *only the natural perturbations*

Scenario of futur evolutions



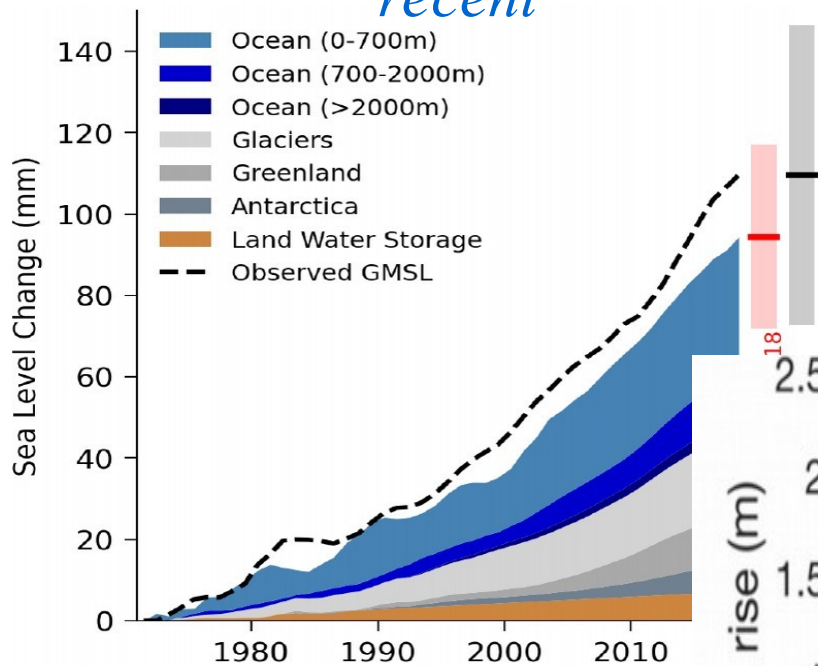
Sea level change

recent



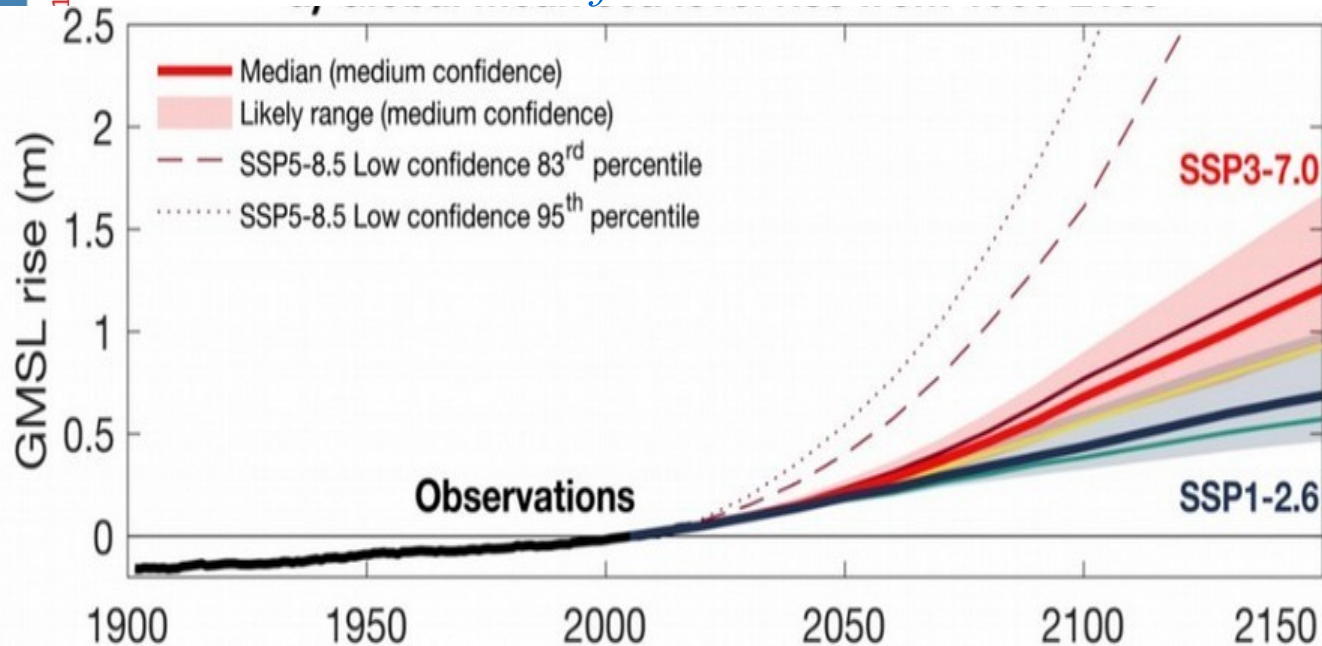
Sea level change

recent



[IPCC 2021, AR6-WG1]

future



Internal variability and variations due to forcings

Climate variations have different origins:

$$\underbrace{\Delta T}_{\text{variation}} \approx \underbrace{\Delta T_{int}}_{\text{Internal variability}} + \underbrace{\frac{\partial T}{\partial Q} \Delta Q_{nat}}_{\text{Response to natural forcings}} + \underbrace{\frac{\partial T}{\partial Q} \Delta Q_{ant}}_{\text{Response to anthropogenic forcings}}$$

Natural variability

- The relative importance of these various terms depends on the spatial and time average considered, and on the amplitude of the forcings
- The differences between observations and models or between model results can include part or all of these terms, depending on the experimental setup

From atmospheric to Earth System Models :

a suite of numerical tools to understand, analyse and anticipate climate changes

Outlook

- 1) The energy balance models
- 2) Atmospheric single column models
- 3) Atmosphere-Ocean global circulation models
- 4) **Earth system models**
- 5) km scale models
- 6) Conclusion & Perspectives

From GCM to ESM

GCM (General Circulation Models):

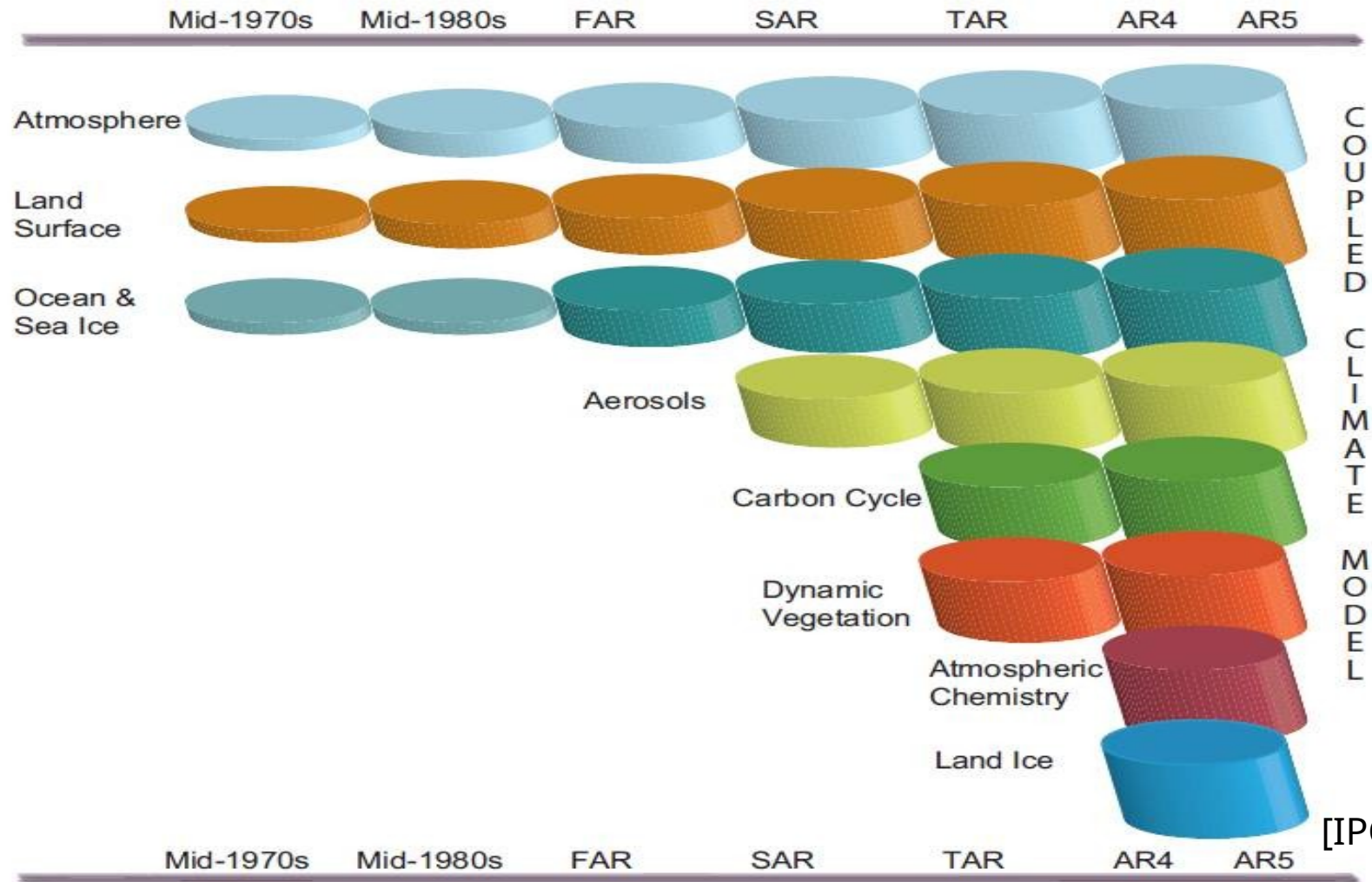
externally prescribed variables (boundary conditions):

- topography, solar-activity, sun-Earth position, etc...
- atmospheric composition: Gas and aerosols concentrations
- surface properties (albedo, roughness, etc.)

ESM: (Earth System Model):

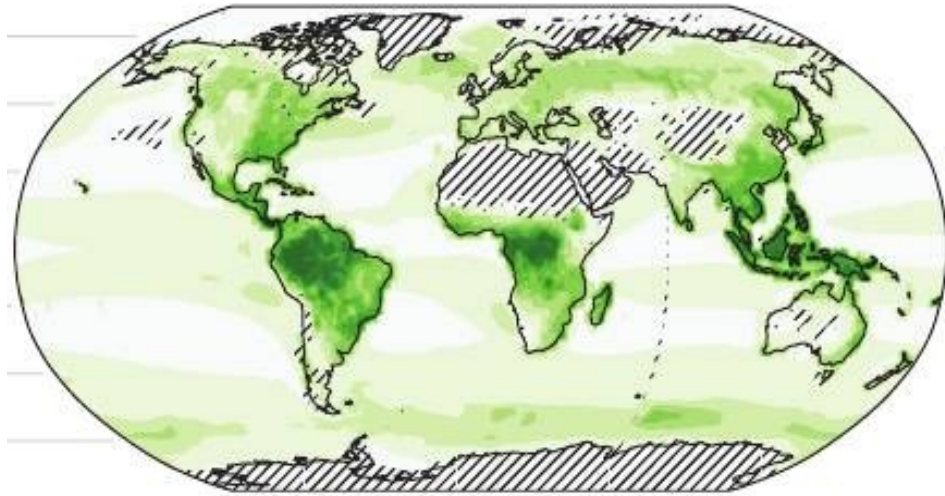
- models to compute gas and aerosols concentrations and surface properties are included (to some extent)
- boundary conditions may change, i.e. from gas concentration to gas emission

From GCM to ESM

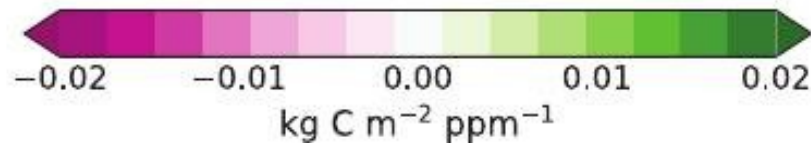


Carbon cycle

Carbon uptake response to CO_2

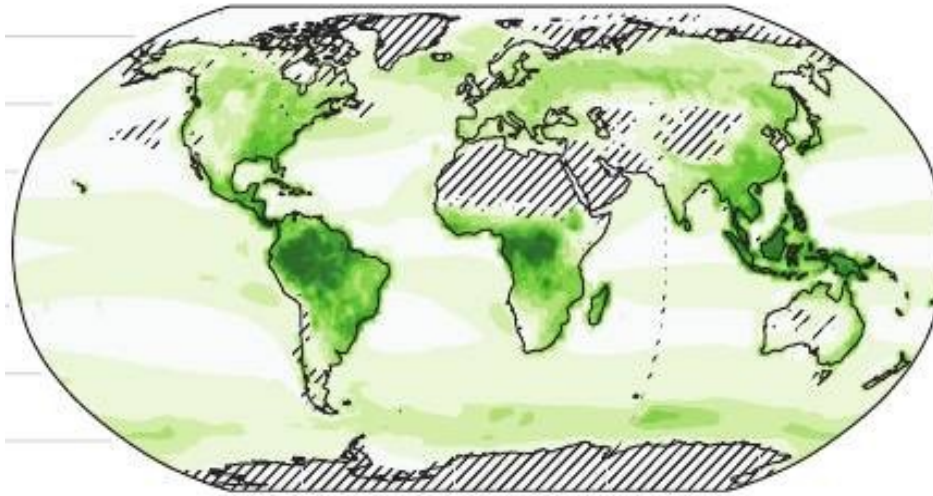


Colour High model agreement

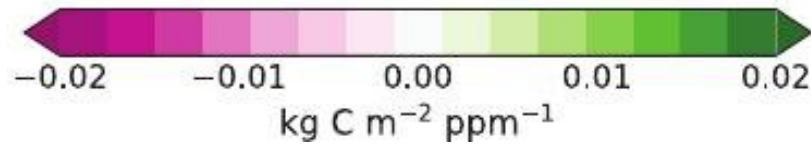


Carbon cycle

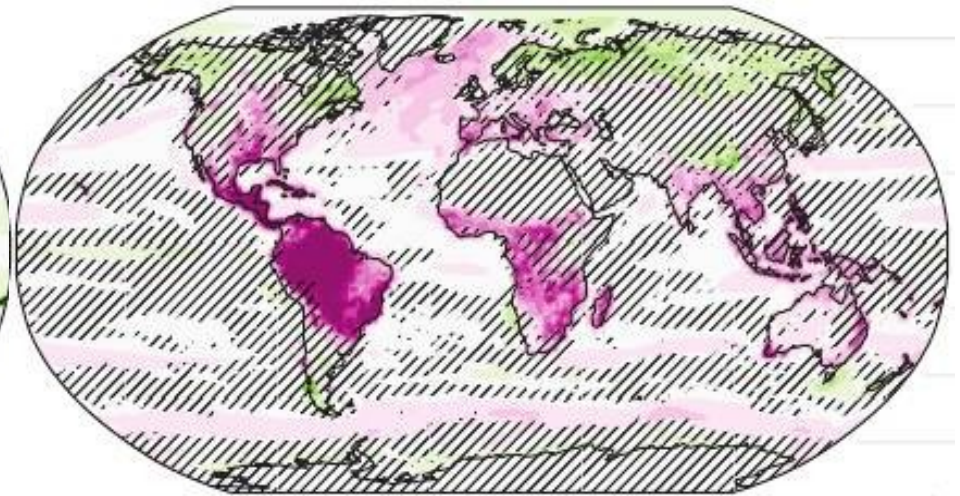
Carbon uptake response to CO_2



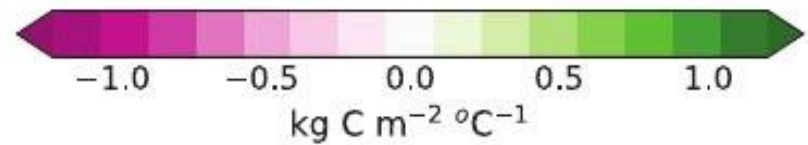
Colour High model agreement



Carbon uptake response to climate change

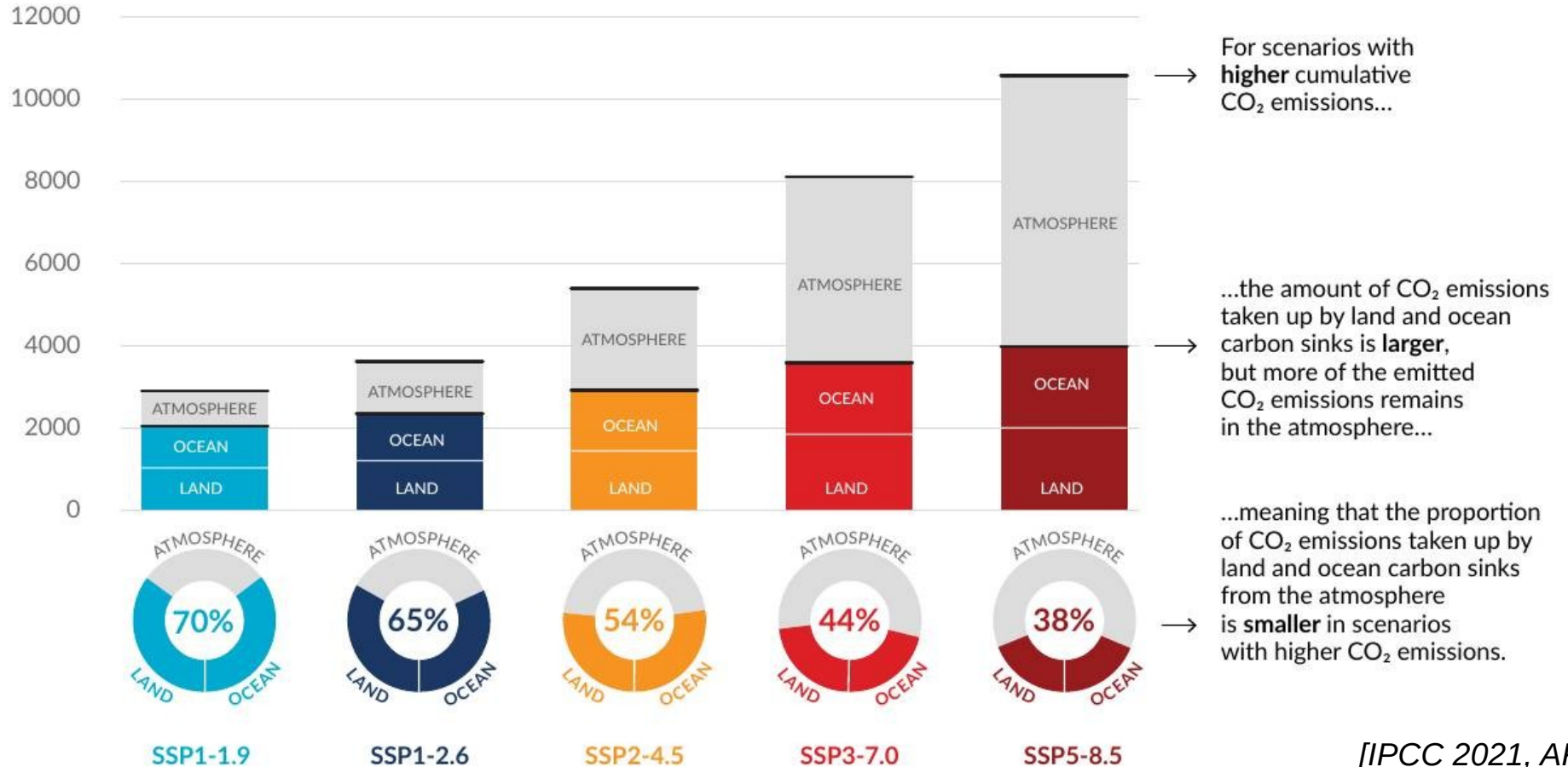


Low model agreement

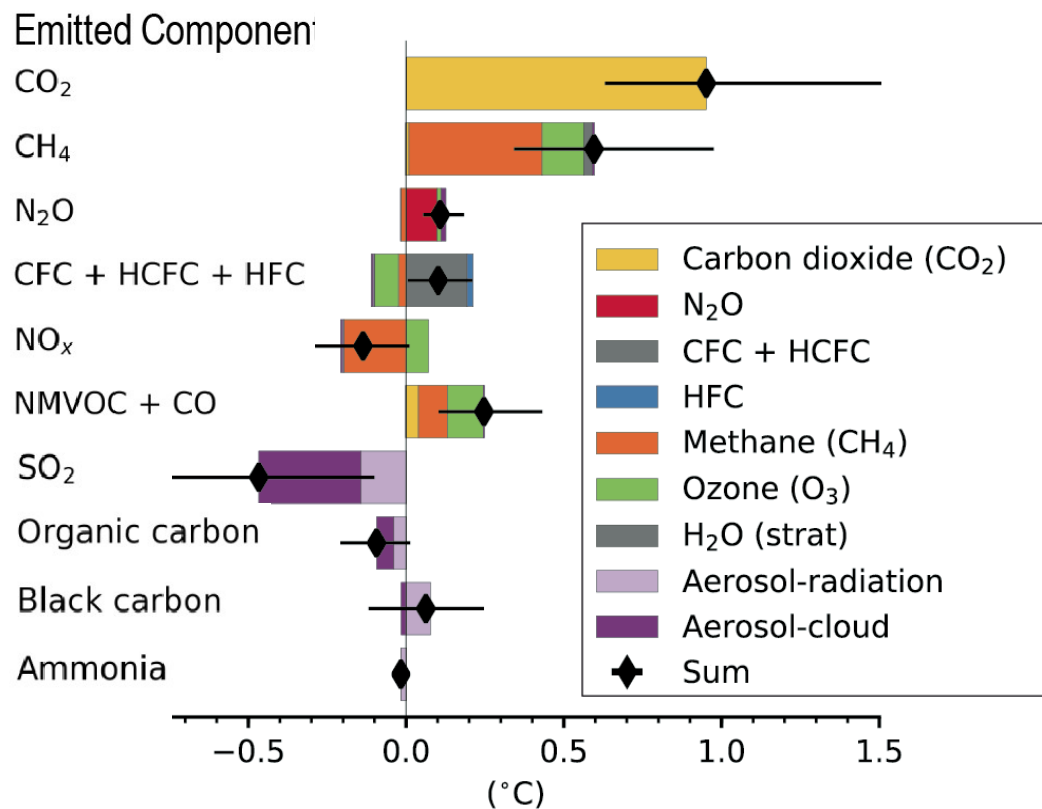


k1

Total cumulative CO₂ emissions absorbed by land and oceans (colors) and remaining in the atmosphere (gray) according to five scenarios (from 1850 to 2100)



Contribution from component emissions



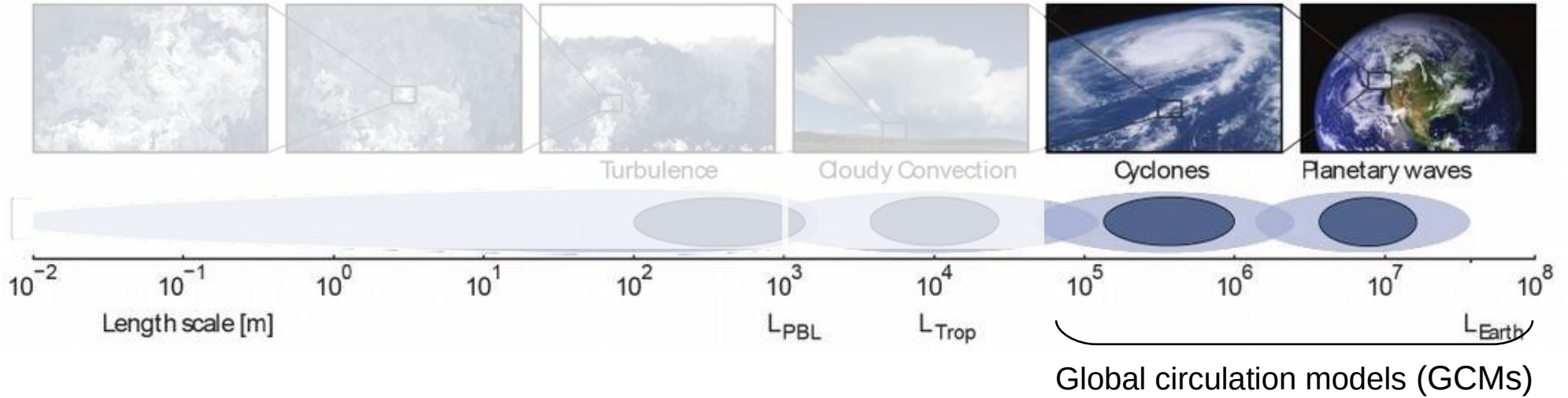
From atmospheric to Earth System Models :

a suite of numerical tools to understand, analyse and anticipate
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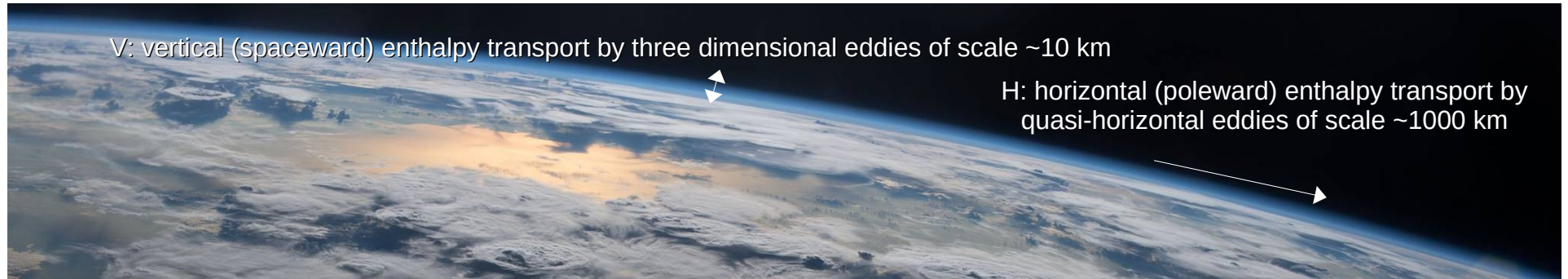
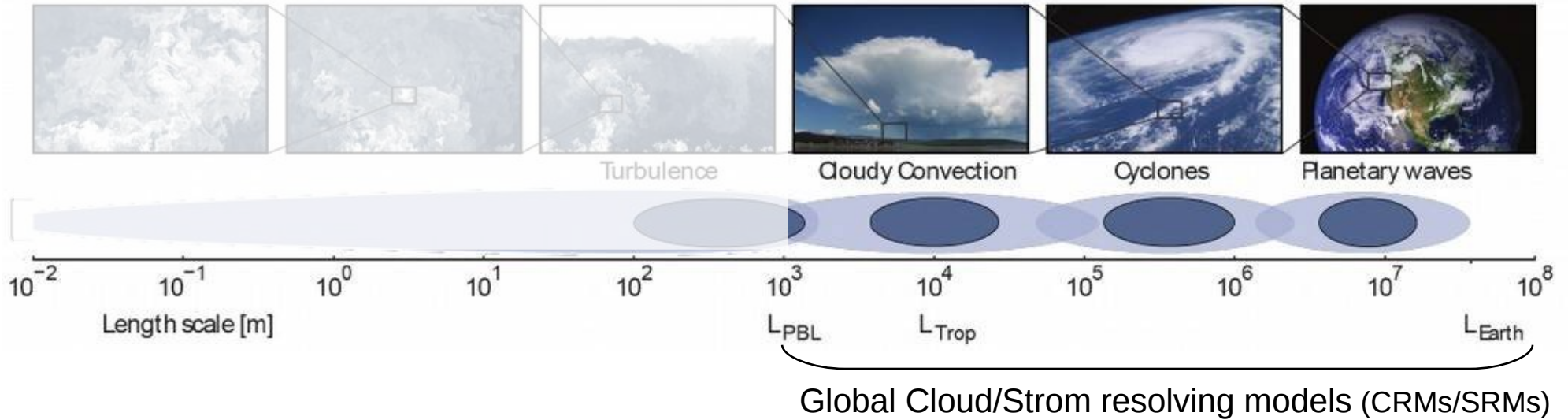
Outlook

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From GCM to km-scale models



From GCM to km-scale models



km-scale models



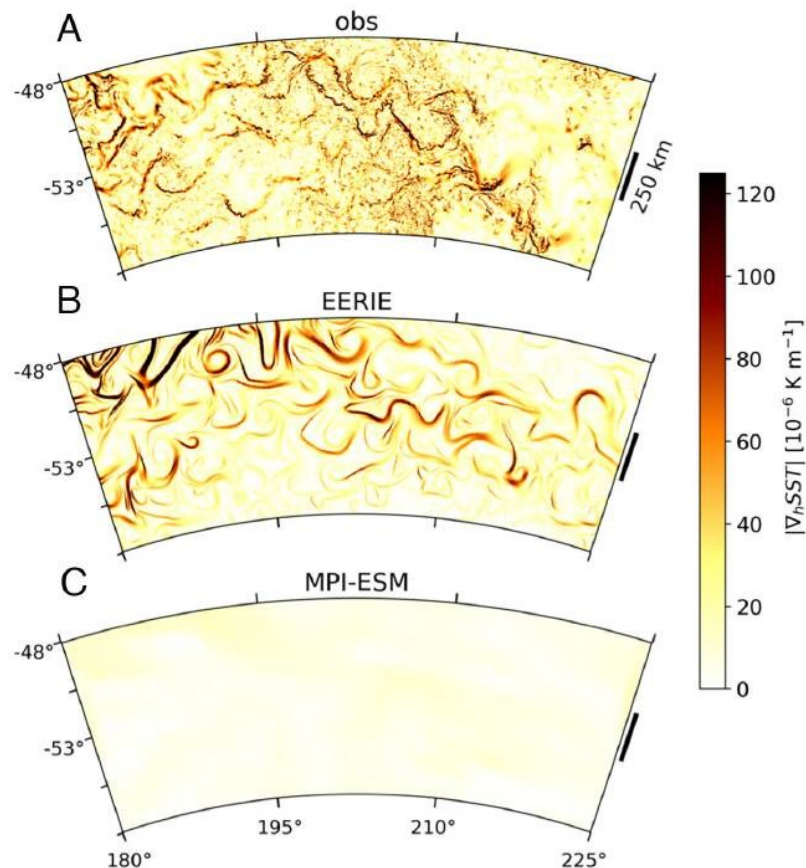
Among the advantages: explicit simulation of mesoscale phenomena, more direct comparison with current high resolution satellite observation, in situ observations, etc. Comparable to weather forecast models.

Among the disadvantages: refinement by a factor of 10 $\Rightarrow$ computer cost $\times 10^4$

km-scale coupled atmosphere-ocean models

- on March 21 of 2011 for observations
- on a random day in March for models
- grid spacing of 10 km in the atmosphere and 5 km in the ocean

Snapshots of SST gradient amplitude
in the southern ocean



km-scale coupled atmosphere-ocean models

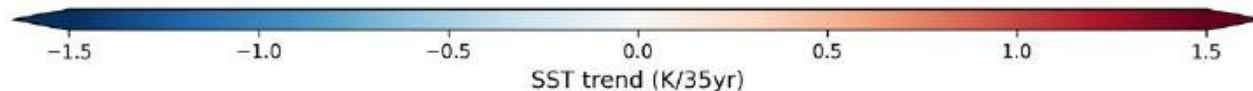
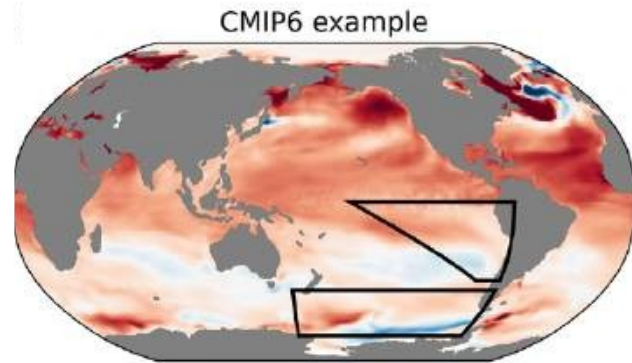
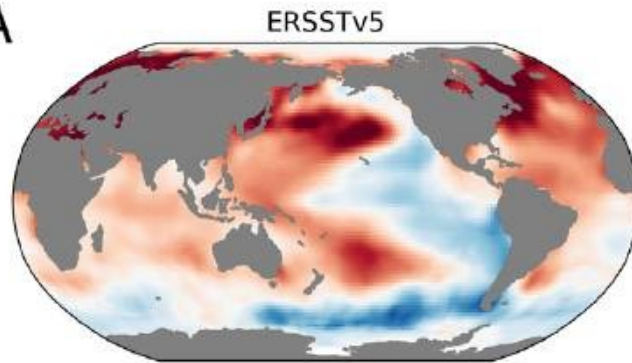
Does this matter for the global climate and climate change?

The pattern of surface warming impacts the magnitude of global warming (climate sensitivity).

A current open question: although climate is warming as predicted by GCM, East Pacific and Southern Ocean is cooling. Why? Natural variability? Response of some external forcings (ozone, aerosols)?

GSRM

A

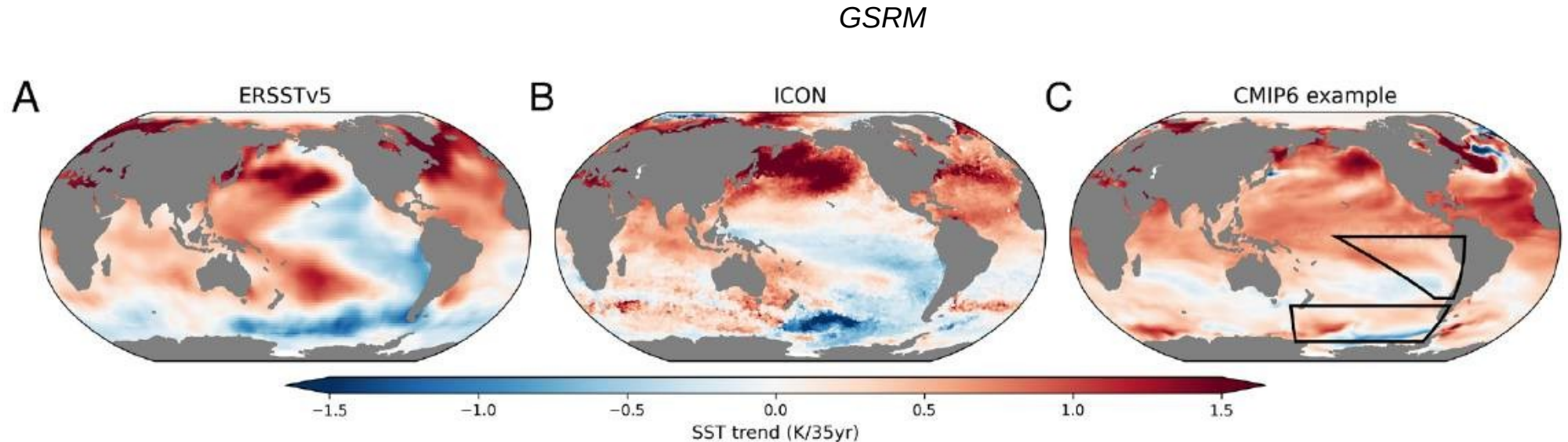


km-scale coupled atmosphere-ocean models

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Conclusions and perspectives

- Atmosphere-ocean coupled climate models (80-90s) have evolved to ESM (2000-2010) are currently the most common tools
- A wide range of models are used to analyse and understand climate (geometry: 0D, 1D, 2D, 3D, resolution, complexity, etc.)
- Climate modelling has to face new challenges going from “global climate” to “local weather”, as needed for adaptation
- km scale climate models open new perspectives, but need very large computer resources
- The AI revolution will have an impact on climate modelling. Current research in many different directions, including:
 - Replacing some sub-scale models (parametrization)
 - Replacing/emulating all the model, e.g. to create ensembles of projections
 - ...

A wide-angle photograph of Earth from the International Space Station (ISS). The image shows a vast expanse of white clouds swirling in patterns over a dark blue ocean. The horizon of the Earth is visible at the top, with a thin blue line of the atmosphere. The lighting suggests it might be dawn or dusk, with some clouds catching the low sun.

Thank you for your attention

Questions ?