

Simple atmospheric models related to global warming

26. October 2020

Presentation and master projects

My name is Xavier Raynaud. I work 80% at SINTEF DIGITAL (applied mathematics and cybernetics) and 20% at NTNU.

Computational Geosciences

Expertise: numerical methods with applications in

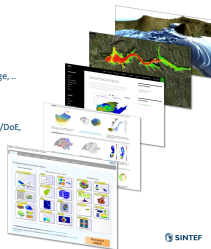
- oil & gas, CO2 sequestration, geothermal, gas storage, ..
- surface and ground water
- microfluidics

Clients: Total, Equinor, RCN, ExxonMobil, ENI, Gassnova/DoE, Wintershall, Battelle, Ecopetrol, met.no, div. startups

Open-source software:

- <http://www.sintef.no/mrst>
- <http://www.opm-project.org>

Contact: Knut-Andreas.Lie@sintef.no, +47 930 58 721

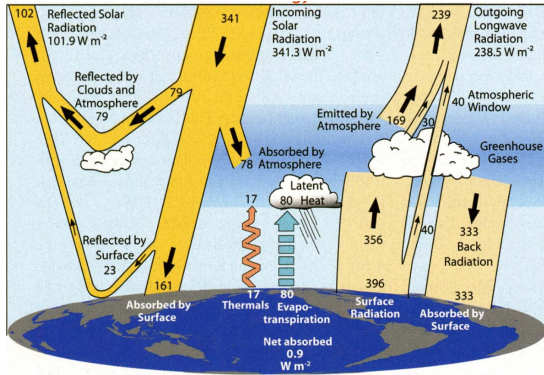


- We offer Master Projects
see [link](#)
- To be updated with
 - Water recovery in Somalia
 - Battery modeling
 - H2 underground storage
- Have a look!

see [overview](#) of group activity

Global warming and radiation

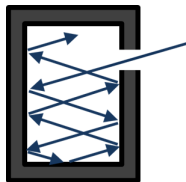
- Main identified cause of global warming : Absorption of radiative heat by greenhouse gas.



Background on radiation

- Warm bodies radiate. This is the way energy travels in vacuum (at the speed of light...)
- A black body is an idealized material, which is a *perfect absorber* and *emitter*.
- A photon brings energy, then energy is stored and does not escape
- Planck's law:

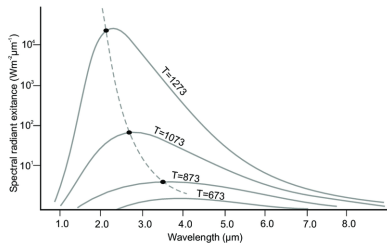
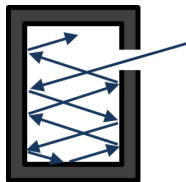
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Eigenmodes

- Solutions of wave equations with vanishing BC,

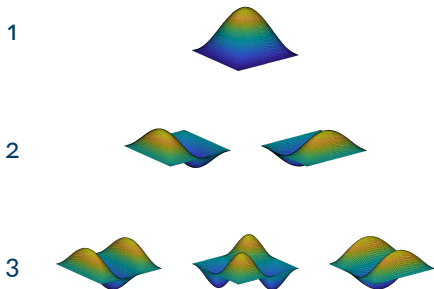
$$u = \sin(k_x \pi x) \sin(k_y \pi y) \sin(k_z \pi z)$$

with $k_x = \frac{l\pi}{L}$, $k_y = \frac{m\pi}{L}$, $k_z = \frac{n\pi}{L}$.

- We have $|k|^2 = (\frac{2\pi\nu}{c})^2$
- Number of modes

$$dN = C\nu^2 d\nu$$

- Just too many high frequency modes. The distribution is not integrable.



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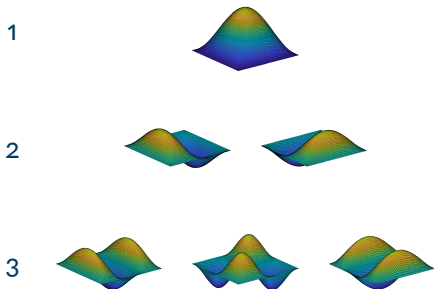
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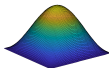
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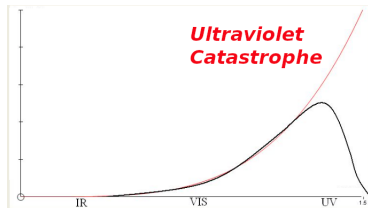
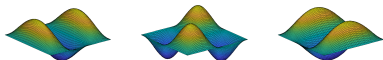
1



2



3



Quantization

- In the classical approach: Every mode has the same energy,
- Planck considered light quantas,

$$E = \hbar\nu.$$

- For a given frequency, the energy that are observed are $\hbar\nu, 2\hbar\nu, 3\hbar\nu, \dots$
- Statistical mechanics: The distribution in the modes follows the Boltzmann distribution

$$p(E) \propto e^{-\frac{E}{kT}}$$

- Modes of high frequencies (high energy) are more unlikely to appear
- For a given frequency, the average energy is

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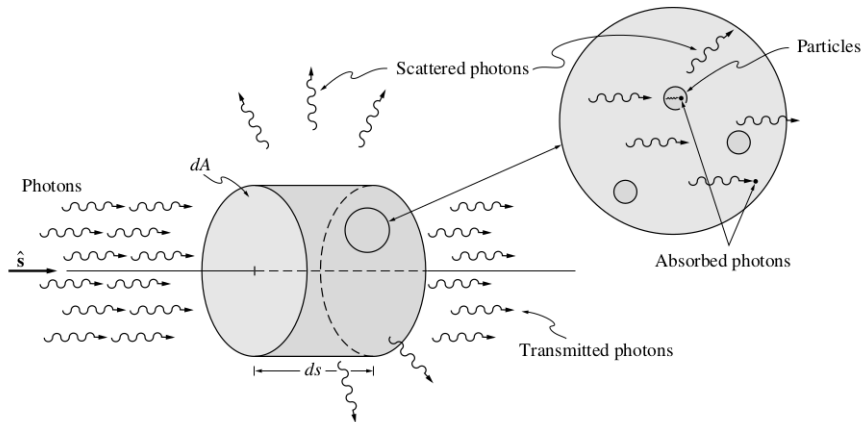
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Absorption, transmission, scattering



Spectrography

- Photons are absorbed: The energy of the incoming photon is used to set the atom/molecule in a higher energy level.
- Quantum effects: The levels of energy of the atom/molecule are **discrete**. Hence, only specific frequencies are absorbed : spectrography
- Moreover, there exist
 - **Stimulated** emissions: emission at the same frequency as incoming photon but in random direction,
 - **Spontaneous** emissions: black body type frequency distribution and random direction.

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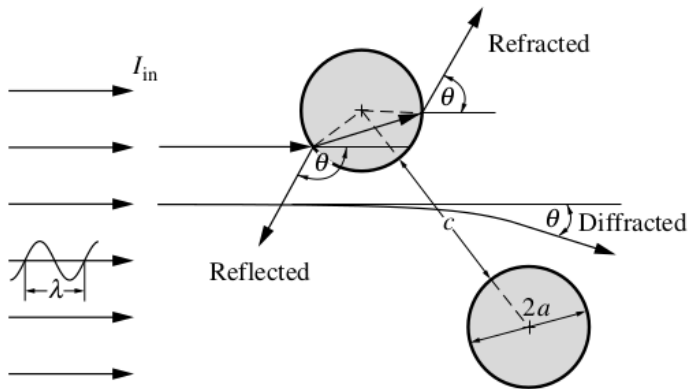
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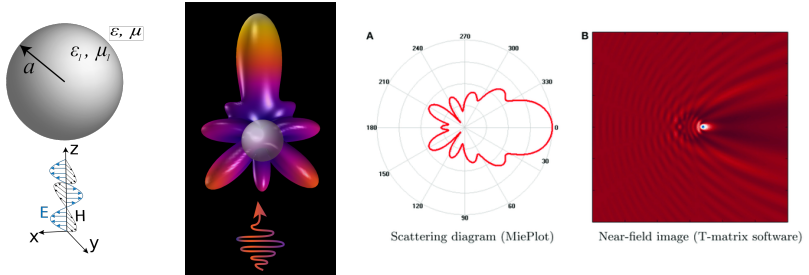
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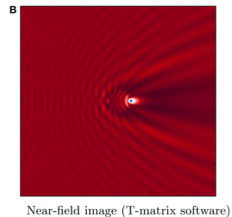
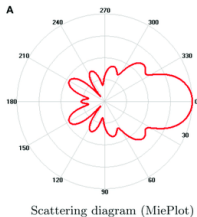
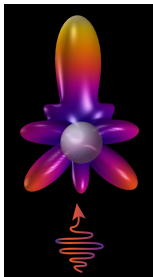
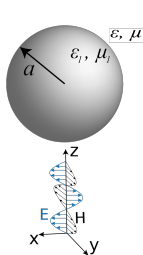
- The scattering equations are obtained by solving **Maxwell equations**
- Different regime according to ratio $x = \frac{2\pi r}{\lambda}$ (r = particle radius)
- For $x = 1$ (most difficult case), **Mie's scattering**



- For small x : **Rayleigh's** approximation, large x : **Geometrical optic** approximation

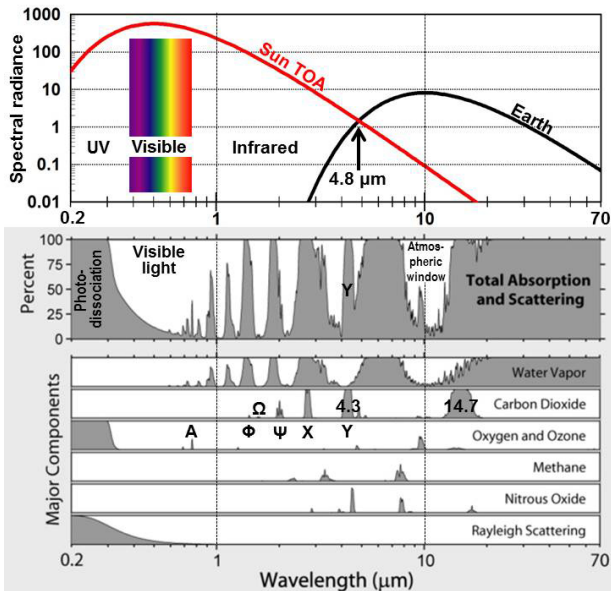
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Atmospheric radiation



Simple radiation model

- We decompose an incoming radiation using **transfer coefficients**

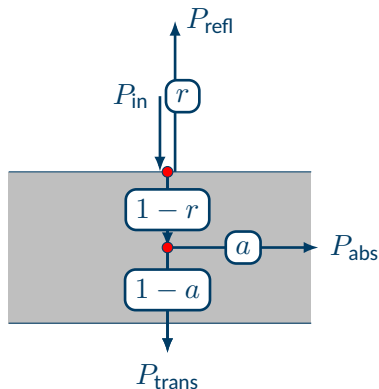
$$P_{\text{in}} = P_{\text{abs}} + P_{\text{refl}} + P_{\text{trans}}$$

where

$$P_{\text{abs}} = a(1 - r)P_{\text{in}},$$

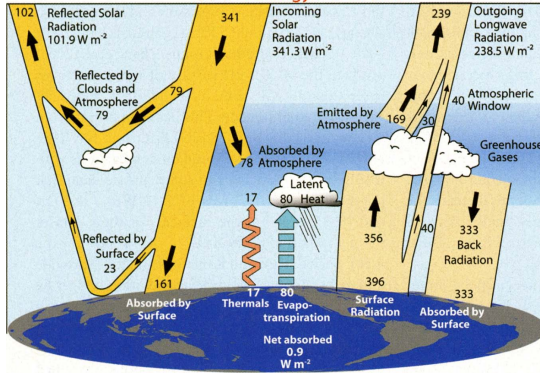
$$P_{\text{refl}} = rP_{\text{in}},$$

$$P_{\text{trans}} = (1 - a)(1 - r)P_{\text{in}}.$$



Questions

- We consider two frequency regimes : short wave and long waves



- Compute the radiative heat fluxes using the transfer coefficients given in table (project description)
- Compute the sources (emissivity coefficients)

Questions

- At equilibrium, energy conservation implies
sum of fluxes = sources
- Find expression for atmosphere and Earth's temperature
- Study the sensitivity with respect to the coefficients.
- Note : The model contains many simplifications. The coefficients can be modified.

Polar region

- Albedo : Reflection coefficient
- Ice albedo = 0.62 versus average earth albedo = 0.32
- Amplification feedback mechanism



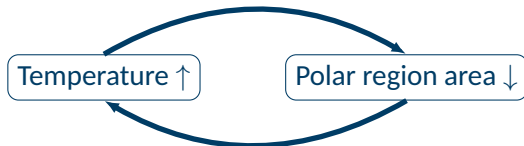
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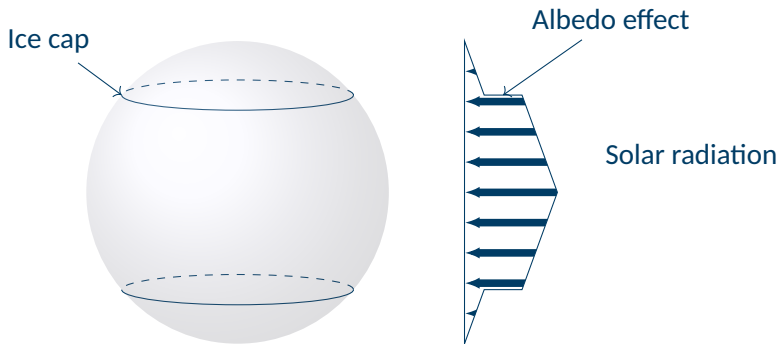


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Ice cap location



We want to compute the ice cap location and study its stability.

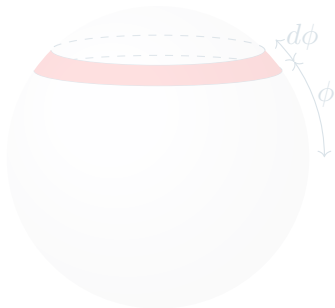
Energy conservation

- We consider only internal energy (only state variable is temperature)
- Derive the energy conservation equation:

$$\frac{\partial}{\partial t}(c\rho T) = \nabla \cdot (k\nabla T) + Q$$

- Zonal approximation
 - We consider that the temperature is constant for the same latitude.
 - We consider average radiation for a given latitude
 - Rewrite energy conservation equation in form of

$$C_a \frac{\partial T}{\partial t} = D_\phi \left(K_a \frac{\partial T}{\partial \phi} \right) + q.$$



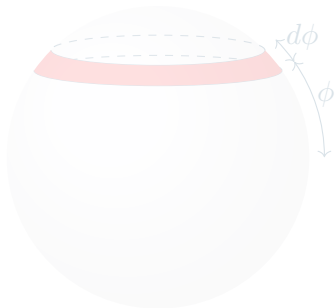
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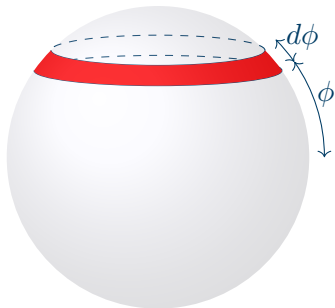
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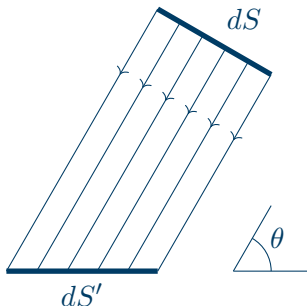
Computation of $S(x)$

- Radiative power I_S and I_E are in W m^{-2}
- Flux conservation

$$I_E dS' = I_S dS$$

- Hence,

$$I_E = I_S \sin(\theta).$$



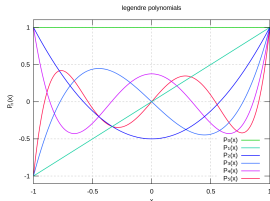
Legendre polynomials - solution technique

- The governing equation at equilibrium:

$$-D \frac{\partial}{\partial x} \left((1 - x^2) \frac{\partial T}{\partial x} \right) = -I(x) + QS(x)a(x, x_s).$$

- The function a depends on ice cap location x_s .
- We compute Q **given** x_s , that is $Q(x_s)$.
- Legendre polynomials satisfy

$$-((1 - x^2)u')' = \lambda u$$



- Use Legendre polynomials to compute the solution

Legendre polynomials - solution technique

- More familiar setup for the equation

$$-u'' = f.$$

- The functions $\sin(n\pi x)$ are eigenvectors for the operator $u \rightarrow -u''$.
- We have

$$u = \sum u_n \sin(n\pi x), \quad f = \sum f_n \sin(n\pi x)$$

- Hence,

$$u_n = f_n / (n\pi)^2.$$

- The **orthogonality** of the Fourier series is essential to compute the Fourier expansion. In the same way, the Legendre polynomials are orthogonal with respect to scalar product

$$\langle u, v \rangle = \int_{-1}^1 (1 - x^2) u(x) v(x) dx$$

Numerical method

- The Legendre polynomials are in fact just a convenient way to **discretize** the equations
- Set up a standard discretization method (finite difference, finite element) to compute the solution.

Equilibrium stability

- Standard setup in finite dimension

$$\dot{X} = F(X)$$

($X \in \mathbb{R}^n$, F is non-linear)

- The equilibrium equation is

$$F(X_0) = 0$$

- We consider a perturbation

$$X(t) = X_0 + \delta X(t)$$

- We obtain a **linear** equation for δX ,

$$\delta \dot{X} = DF(X_0)\delta X$$

- We know how to solve linear systems of ODEs.
- The solution takes the form

$$\delta X = \sum e^{\lambda_i t} (U_i + \dots)$$

- The eigenvalues of $DF(X_0)$ determines the linear stability.
- Proceed in the same way in **infinite dimensional** space (**differential operators** replace matrices).
- We need to discretize to compute the solution...

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($X \in \mathbb{R}^n$, F is non-linear)

- The equilibrium equation is

$$F(X_0) = 0$$

- We consider a perturbation

$$X(t) = X_0 + \delta X(t)$$

- We obtain a **linear** equation for δX ,

$$\delta \dot{X} = DF(X_0)\delta X$$

- We know how to solve linear systems of ODEs.
- The solution takes the form

$$\delta X = \sum e^{\lambda_i t} (U_i + \dots)$$

- The eigenvalues of $DF(X_0)$ determines the linear stability.
- Proceed in the same way in **infinite dimensional** space (**differential operators** replace matrices).
- We need to discretize to compute the solution...