



Radiative transfer modelling for satellite ocean color remote sensing

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Outline

- 1. Introduction
- 2. Scientific interests of the ocean observation by satellite remote sensing
- 3. Radiative transfer modelling for satellite data analysis
- 4. Conclusions

1. Introduction

- ✓ Carbon exchanges between various components of the Earth system are important : this is the so-called Carbon Cycle
- ✓ Photosynthesis = process that enables the synthesis of organic matter and oxygen (O_2) from light, carbon dioxyde (CO_2) and nutrients
- \checkmark Through photosynthesis :
- ~50% of O_2 produced by the organisms comes from the ocean
- ~50% of atmospheric CO_2 is absorbed by the ocean

Phytoplankton : unicellular micro-organism showing an extreme diversity $(0.5\mu m \rightarrow 200\mu m)$

Role of phytoplankton in the ocean

- ✓ 1^{st} element of marine foodweb
- ✓ Conversion of CO_2 into organic carbon
- \Box absorption of light \rightarrow primary production
- □ impact on the global carbon cycle and on climate

Importance of determining the biomass concentration at global scale





What do we call « ocean color» ?

 ✓ Methodology that enables the quantification of hydrosols (phytoplankton, mineral material, detritus, colored dissolved organic matter)

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- \checkmark Basis of the ocean color technique
- \rightarrow influence of hydrosols on the optical properties of the ocean
- \rightarrow variation of the color of the sea



✓ Typical relation between the oceanic radiation (reflectance) and the hydrosols



- ✓ Reflectance ~ absorption⁻¹
- \rightarrow detection of organic matter
- ✓ Reflectance ~ backscattering
- \rightarrow detection of mineral-like particles

2. Scientific interests of the ocean observation by satellite remote sensing



Interests for the remote sensing of phytoplankton

- ✓ Determination of phtyoplankton algal group
- \rightarrow Importance for the coastal primary production (carbon cycle)
- ✓ Detection of harmful algal blooms
- \rightarrow Impact on tourism activities
- ✓ Eutrophisation of coastal and inland waters
- \rightarrow Impact on shellfish activities (oysters, mussels,...)
- ✓ Impact of the turbulence on the spatial distribution of phytoplankton
- \rightarrow Importance for the analysis of coastal dynamics and fishing activities

Interests for the remote sensing of mineral-like particles

✓ Rivers discharge → marine pollution

Rio de La Plata (Argentina)





✓ Spectral shift of the reflectance with higher turbidity

Others important interests

- ✓ Bathymetry (depth of the ocean bottom)
 → Coastal erosion, defence applications
- ✓ Composition of the bottom (coral reefs, algal species, sand)
 - ➤ Coral reefs







Pinnel (2007)



→ Contribution of the skyligh, of the sunglint, of the skylight reflection on the sea surface, and of the water leaving radiance (L_w)

Radiative transfer model OSOAA (Chami et al., 2015)

- \rightarrow OSOAA = Ocean Successive Orders with Atmosphere Advanced
- \rightarrow ocean-atmosphere coupled system
- → open source model freely available online (hosted by CNES) https://github.com/CNES/RadiativeTransferCode-OSOAA
- ✓ Main features
 - \rightarrow code 1D
 - \rightarrow Size distribution + spectral properties + directional properties of aerosols and hydrosols
 - → bio-optical relationships between concentrations and absorption/scattering properties of hydrosols
 - \rightarrow consideration of waves (i.e., rough surface)
 - \rightarrow weak computing time
 - → user friendly interface (Graphical Unit Interface, detailed user guide)

\checkmark More complete description of the model



- Light field is defined by Stokes parameters (I, Q, U) (Stokes, 1852) \rightarrow I ~ energy transported by the electromagnetic wave (i.e., radiance)

- \rightarrow Q ~ information on the degree of polarization
- \rightarrow U ~ information on the direction de polarization

✓ Simulation of the physical interactions encountered by the radiation



- atmospheric and ocean scattering, ocean absorption
- interactions with the sea surface (Cox and Munk): transmission & reflection
- ocean bottom reflection
- simulation of the light field: intensity + polarization
- \rightarrow successive orders: radiance at a given scattering order « n » is derived from the radiance at the order « n-1 »

✓ Model inputs

- aerosols (type, abundance): various and consistent with observations
- hydrosols (type, abundance)
 - \rightarrow phytoplankton
 - chlorophyll *a* concentration (pigment related to light)
 - vertical profile of absorption and scattering coefficients
 - phase function (refractive index, multi-modal size distribution)
 - \rightarrow mineral-like particles
 - concentration
 - vertical profile of absorption and scattering coefficients
 - phase function
 - \rightarrow detrital matter
 - purely absorbing material
 - absorption coefficients

- ✓ Model outputs
- radiance, reflectance, flux (upward, downward) at each depth (e.g., bottom, sea surface) and altitude (atmosphere, satellite)
- degree of polarization
- spectral range: from 400 nm to 900 nm (visible-near infrared)

- ✓ Advantages of an analytical solution of the radiative transfer equation $\frac{1}{y,z} \sin \theta \times \sin \theta'}{\sin \theta \times \cos \theta'} = \frac{1}{y,z} + \frac{1}{y,z} +$
- fast numerical computations
- quantification of the multiple scattering
- appropriate modeling of the rough sea surface

(reflection and transmission of the radiation)



 \checkmark Running the OSOAA model

- Shell script as command lines (key words, values)
- user guide
- Graphical Unit Interface



- \checkmark Limitations of the model
- plane-parallel atmosphere (i.e., no spherical curvature)
- no consideration of the gaseous atmospheric absorption
- no consideration of the inelastic scattering (Raman and fluorescence)

- 4. Conclusions
- A. Interests of ocean color satellite remote sensing
- \checkmark Determination of phytoplankton algal group
- ✓ Eutrophisation of coastal and inland waters (e.g., harmful algal blooms)
- \checkmark Impact of the turbulence on the spatial distribution of phytoplankton
- \checkmark Rivers discharge and marine pollution
- ✓ Bathymetry
- ✓ Composition of the ocean bottom (e.g., benthic habitats)

B. Radiative transfer modelling : OSOAA

- ✓ robust numerical model to simulate the radiation in the atmosphereocean system, including the polarization and a rough sea surface
- \checkmark freely available online as an open source model
- C. Acknowledgments
- ✓ CNES (A. Meygret, B. Fougnie)

Thank you for your attention

Back up slides

Radiative transfer equation



Vector formalism (with polarisation) : I = Stokes vector, M = phase matrix

$$\nabla \mathbf{I}(r,\Theta) = -c(r,\Theta)\mathbf{I}(r,\Theta) - 2\pi \int_{\Theta'=0}^{\pi} \mathbf{M}(r,\Theta'\to\Theta)\mathbf{I}(r,\Theta')\sin\Theta'd\Theta'$$

Scalar formalism (no polarization) : I = Radiance

$$\nabla I(z,\Theta) = -c(z,\Theta)I(z,\Theta) - 2\pi \int_{\Theta'=0}^{\pi} VSF(z,\Theta'\to\Theta)I(z,\Theta')\sin\Theta'd\Theta'$$

c = attenuation coefficient, VSF = phase function of hydrosols

<u>Models accounting for atmosphere + ocean layers</u>

 \checkmark more accurate to model the ocean layer

A few examples of bi-layers models « atmosphere + ocean »

- ✓ Scalar model (i.e., no polarization)
- → Hydrolight (Mobley, 1989) : commercial model (~10 Keuros)
- \checkmark Vectorial models (i.e., with polarization)
- → *discrete ordinates* method : Jin et al. (2006-COART), Sommersen et al. (2010)
- \rightarrow *Monte Carlo* method : Kattawar et al. (1989), You et al. (2009)
- → successive orders of scattering method: Chami et al. (2015), Zhai et al. (2010)
- → « *T-matrix* » (adding doubling) method: Chowdhary et al. (2006), He et al. (2010-PCOART), Ota et al. (2010), Hollstein and Fischer (2012-MOMO)
- → *finite element* method: Bulgarelli et al. (1999)