

Polarized radiative transfer including multiple scattering – Methods and applications

Claudia Emde

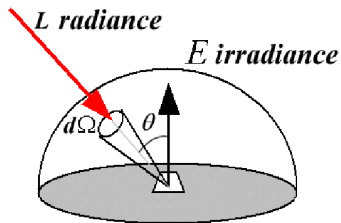
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ARTS workshop, Kristineberg, Sweden, 7–10 June 2010

Outline

- 1 Radiative transfer – background
 - Radiation quantities
 - Polarisation
 - The vector radiative transfer equation
 - Input for radiative transfer – optical properties
- 2 Methods to solve the radiative transfer equation
 - Discrete Ordinate Methods
 - CloudIce - Sensitivity study
 - Monte Carlo Methods
 - Summary
- 3 Conclusions/ discussion

Radiation quantities



$$E = \int L \cos \theta d\Omega$$

Adapted from <http://escience.anu.edu.au>

● Radiance

- ▶ Unit: $\text{W}/(\text{m}^2 \text{ nm sr})$ or $\text{W}/(\text{m}^2 \text{s}^{-1} \text{ sr})$
- ▶ Required for remote sensing application, instruments measure specific direction.

● Irradiance

- ▶ Unit: $\text{W}/(\text{m}^2 \text{ nm})$ or $\text{W}/(\text{m}^2 \text{s}^{-1})$
- ▶ Radiance integrated over half space, required to compute radiative forcing (climate models).

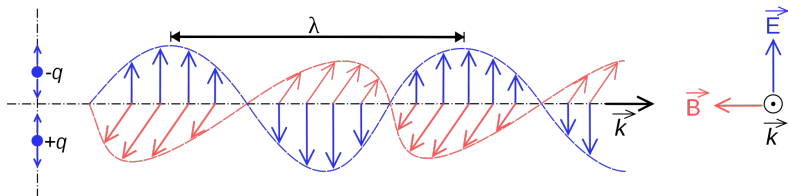
Polarisation in the atmosphere - rainbow



Polarisation in the atmosphere - rainbow



Description of polarization - The Stokes vector



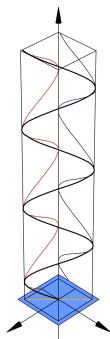
Definition:

$$I = \langle E_l E_l^* + E_r E_r^* \rangle$$

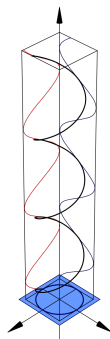
$$Q = \langle E_l E_l^* - E_r E_r^* \rangle$$

$$U = \langle E_l E_r^* + E_r E_l^* \rangle$$

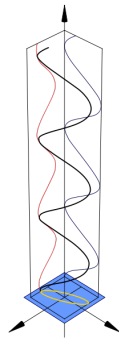
$$V = i \langle E_l E_r^* - E_r E_l^* \rangle$$



linear



circular

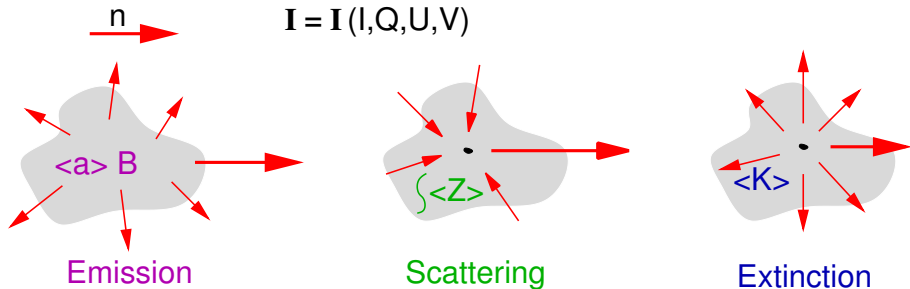


elliptical

The vector radiative transfer equation

$$\frac{d\mathbf{l}}{ds}(\mathbf{n}, \nu) = -\langle \mathbf{K}(\mathbf{n}, \nu, T) \rangle \mathbf{l}(\mathbf{n}, \nu) + \langle \mathbf{a}(\mathbf{n}, \nu, T) \rangle B(\nu, T) + \int_{4\pi} d\mathbf{n}' \langle \mathbf{Z}(\mathbf{n}, \mathbf{n}', \nu, T) \rangle \mathbf{l}(\mathbf{n}', \nu)$$

⇒ Differential equation for Stokes vector \mathbf{I}



Cloud particles and trace gases

- **Single scattering properties** (SSP) of cloud particles:
 $\langle K^P \rangle$, $\langle a^P \rangle$, $\langle Z^P \rangle$
- **Computation methods/theories** for SSP:
 - ▶ Rayleigh scattering (particle size (r) \ll wavelength (λ))
 - ▶ Lorentz-Mie theory (spherical particles)
 - ▶ T-matrix method ($r \approx \lambda$, aspherical, rotationally symmetric particles) (*Mishchenko et. al.*, 2002)
 - ▶ Discrete dipole approximation ($r \approx \lambda$, arbitrarily shaped particles)
 - ▶ Geometrical optics approximation ($r \gg \lambda$)
- **Gas absorption coefficients**: $\langle K^g \rangle$, $\langle a^g \rangle$
 - ▶ Calculated based on HITRAN/JPL spectral line catalogs

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Ice particle scattering



Column



Hollow column



Droxtal



Plate



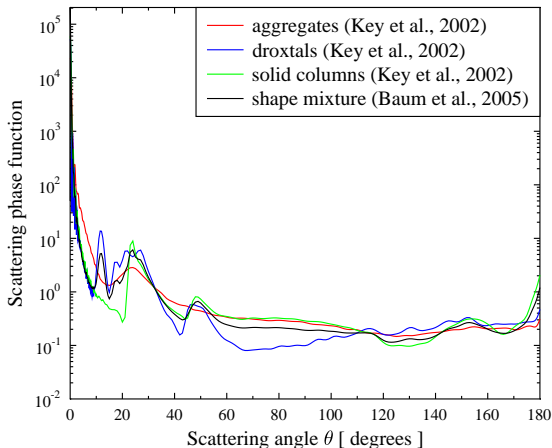
Spheroid



Sphere



Particle shapes (Yang,
2005)



Halo at 22° scattering angle

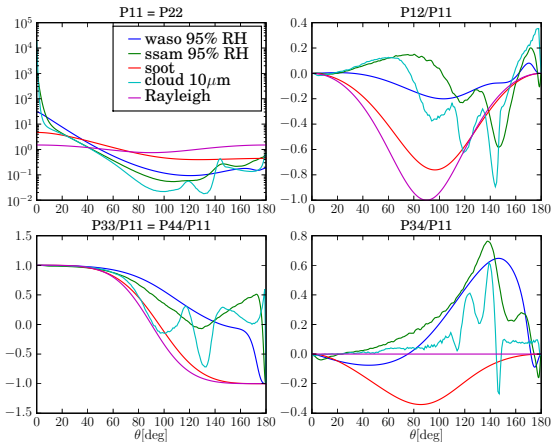
22° halo and sundog



www.dewbow.co.uk

Scattering phase matrix

- Solar radiation and emitted radiation unpolarized (incoherent superposition of electromagnetic waves)
- Polarisation by scattering in the atmosphere (Molecules, clouds, aerosols)



Discrete Ordinate Iterative Method (ARTS-DOIT)

- Multiple scattering model for thermal radiative transfer
- Special features
 - ▶ polarization
 - ▶ spherical geometry
 - ▶ oriented particles
- Applications:
 - ▶ Cloud remote sensing in down-looking and limb geometry
 - ▶ Calculate impact of clouds on occultation measurements

ARTS-DOIT: The cloud box

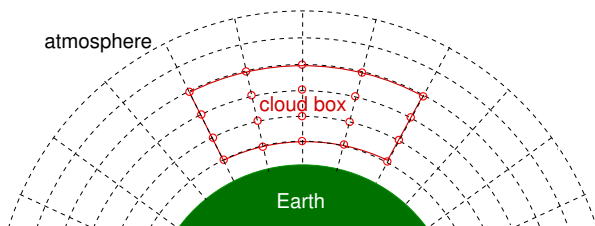
$$\vec{\rho} = \{\rho_1, \rho_2, \dots, \rho_{N_\rho}\}$$

$$\vec{\alpha} = \{\alpha_1, \alpha_2, \dots, \alpha_{N_\alpha}\}$$

$$\vec{\beta} = \{\beta_1, \beta_2, \dots, \beta_{N_\beta}\}$$

$$\vec{\theta} = \{\theta_1, \theta_2, \dots, \theta_{N_\theta}\}$$

$$\vec{\phi} = \{\phi_1, \phi_2, \dots, \phi_{N_\phi}\}$$

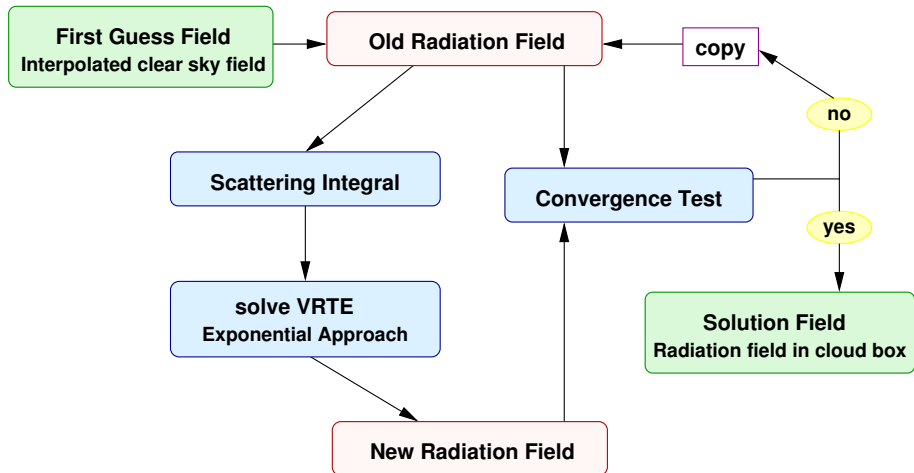


Radiation field:

Set of Stokes vectors for all combinations of positions and directions:

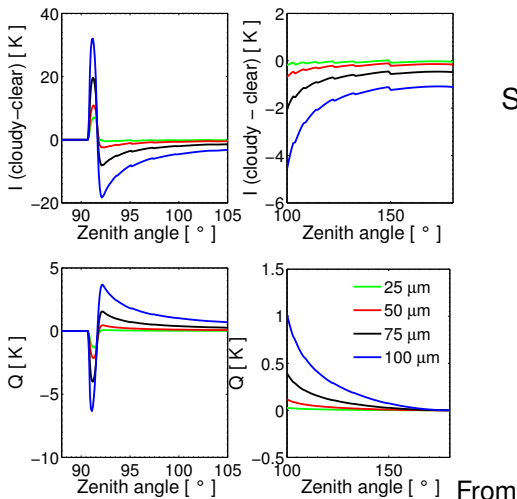
$$\mathbf{I} = \mathbf{I}(\rho, \alpha, \beta, \theta, \phi)$$

ARTS-DOIT: Schematic of iterative method



Details in *Emde et. al.*, JGR, 2004

Example - DOIT calculation

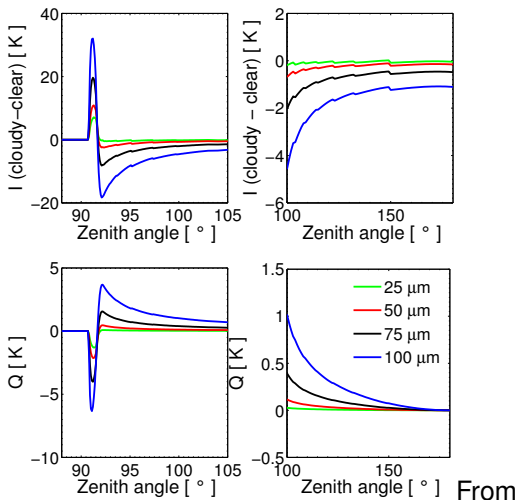


Setup:

- 1D atmosphere
- Cloud altitude: 10–12 km
- Prolate spheroids (aspect ratio 0.5)
- Horizontally aligned
- Sensor at 13 km altitude
- Frequency: 318 GHz

Emde et. al., JGR, 2004.

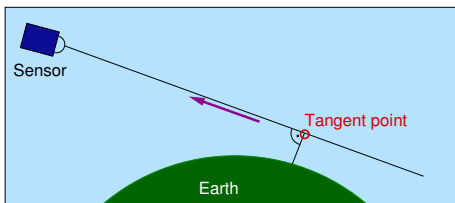
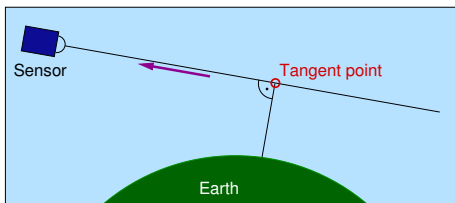
Example - DOIT calculation



- Intensity I ($I_v + I_h$)
 - ▶ enhancement at angles close to 90°
 - ▶ otherwise depression
- Polarization difference Q ($I_v - I_h$)
 - ▶ negative close to 90°
 - ▶ otherwise positive
- Cloud effect on intensity and on polarization increases with particle size.

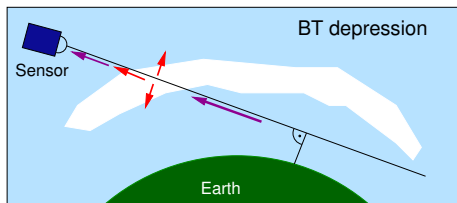
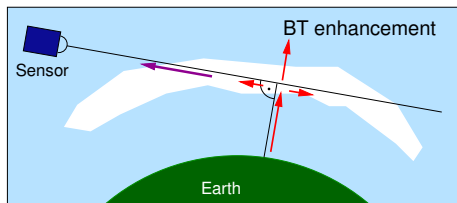
Emde *et. al.*, JGR, 2004.

Cloud effect in limb geometry



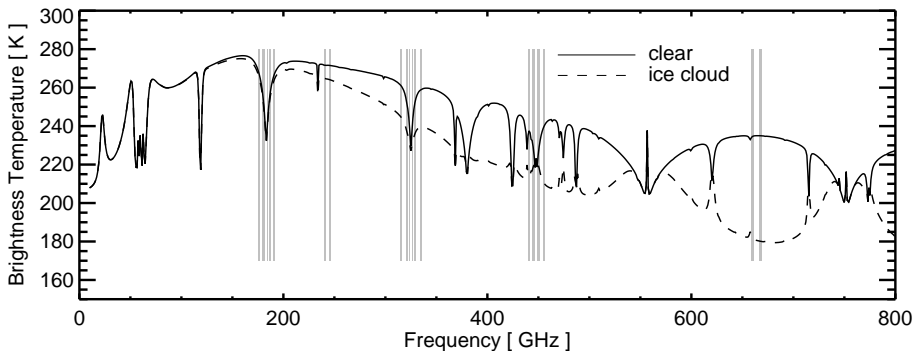
- Main source of radiation from tangent point.

Cloud effect in limb geometry



- Main source of radiation from tangent point.
- Two effects:
 - ▶ Tangent point inside cloud: Scattering into Line Of Sight (LOS) dominates
⇒ **BT enhancement.**
 - ▶ Tangent point below cloud: Scattering away from LOS dominates
⇒ **BT depression.**

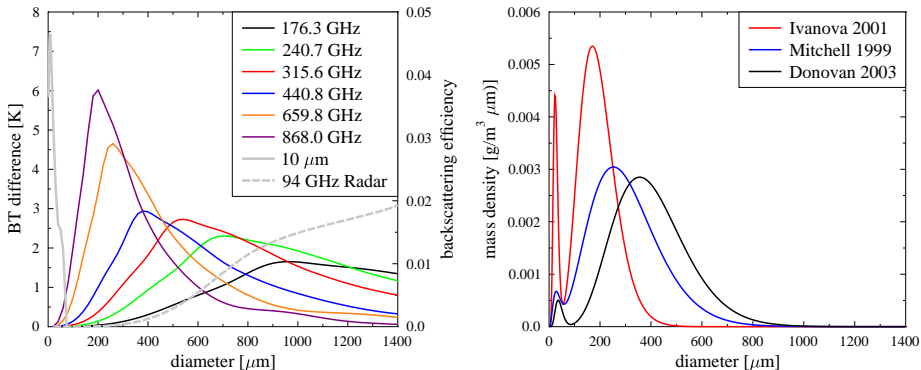
CloudIce – Submillimeter passive satellite radiometer



Channels selected for the CloudIce instrument

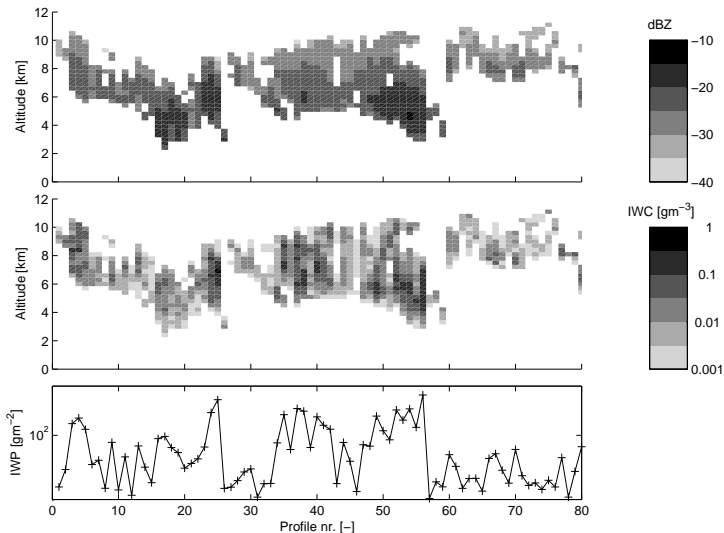
from Bühler et al., QJRMS, 2007

CloudIce – Sensitivity to particle size



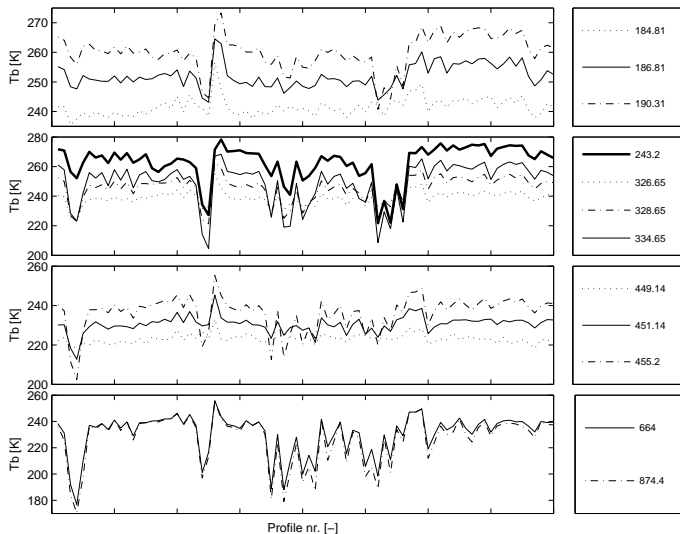
Left: Simulations for narrow gamma distributions.

Retrieval database



IWC and IWP profiles derived from radar and in-situ data
from Rydberg et al., QJRMS, 2007

CloudIce simulations



Independent pixel approximation
 from Rydberg et al., QJRMS, 2007

Short overview of DISORT

- Multiple scattering model for solar and thermal radiative transfer (Stamnes et al., 1988)
- very well tested and validated
- Approximations:
 - ▶ 1D plane-parallel geometry
 - ▶ no polarization
 - ▶ randomly oriented particles
- Features:
 - ▶ second order intensity correction (needed to simulate rainbow or halo)
 - ▶ method is much faster than DOIT for thick clouds, because no iterations required
 - ▶ very accurate

Monte Carlo Methods

- Generation of random numbers ξ for a given probability density function $p(x)$
- Normalized cumulative distribution $F(x)$:

$$F(x) = \frac{\int_{x_{\min}}^x p(x') dx'}{\int_{x_{\min}}^{x_{\max}} p(x') dx'} \quad (1)$$

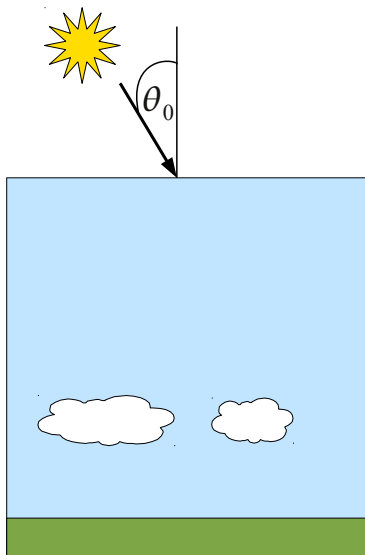
- Random number r , uniformly distributed between 0 and 1:

$$F(\xi) = r \quad (2)$$

- Random number ξ :

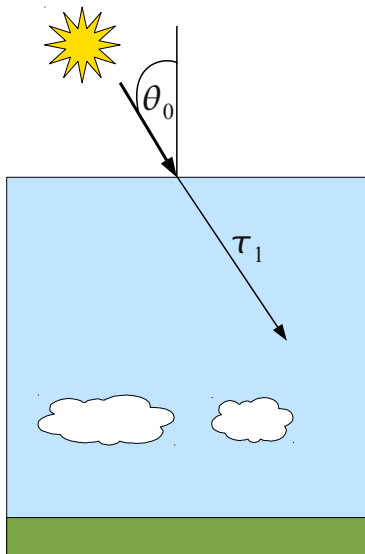
$$\xi = F^{-1}(r) \quad (3)$$

1. Generate photon



- Photon direction determined by sun position (solar zenith angle θ_0 , solar azimuth angle ϕ_0)
- Starting position at top of atmosphere determined randomly

2. Sample the pathlength



- Absorption is included by photon weight

$$w_a = \exp\left(-\int \beta_{\text{abs}} ds\right)$$

- Total absorption coefficient (molecules, aerosols, clouds)

$$\beta_{\text{abs}} = \sum \beta_{\text{abs},i}$$

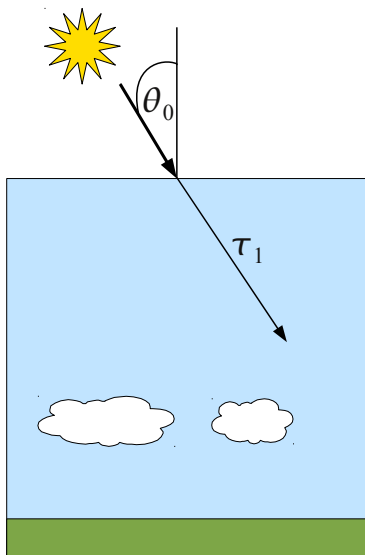
- PDF for free pathlength of photon

$$P_s = \exp\left(-\int_0^s \beta_{\text{sca}} ds'\right)$$

- Total scattering coefficient (molecules, aerosols, clouds)

$$\beta_{\text{sca}} = \sum \beta_{\text{sca},i}$$

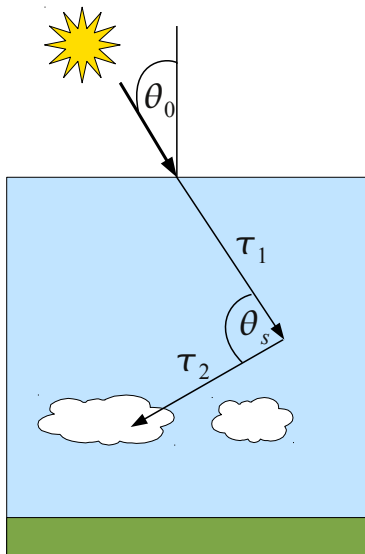
3. Interaction



- use random number $r \in [0, 1]$ to decide whether the photon interacts with a cloud droplet/particle, aerosol or molecule

$$\frac{\sum_{i=1}^{n_j-1} \beta_{\text{sca},i}}{\beta_{\text{sca}}} < r \leq \frac{\sum_{i=1}^{n_j} \beta_{\text{sca},i}}{\beta_{\text{sca}}}$$

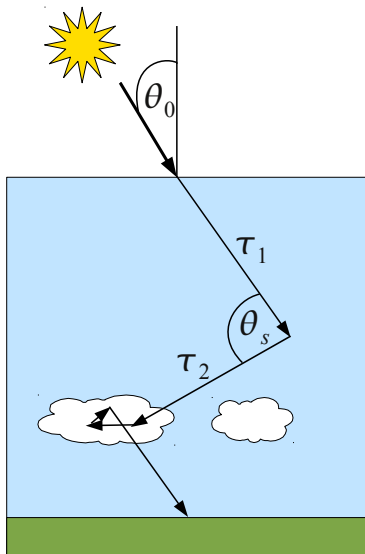
4. Scattering direction



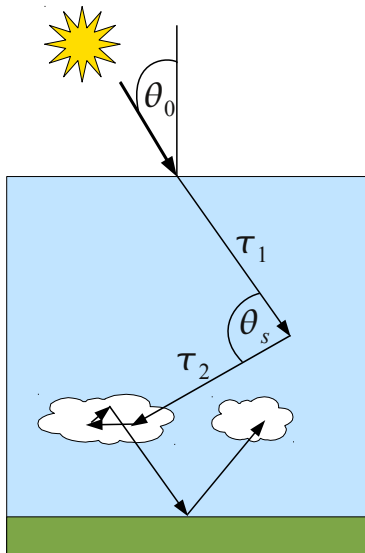
- Use phase function (P_{11}) as PDF for the scattering angle and a random angle between 0 and 2π for the azimuth direction
- Scattered Stokes weight vector (Importance sampling method)

$$\begin{aligned} \mathbf{I}^{\text{sca}} &= P_{11}^{-1} \mathbf{L}(\sigma_2) \mathbf{P} \mathbf{L}(\sigma_1) \mathbf{I}^{\text{inc}} \\ &= P_{11}^{-1} \mathbf{Z} \mathbf{I}^{\text{inc}} \end{aligned}$$

5. Multiple scattering

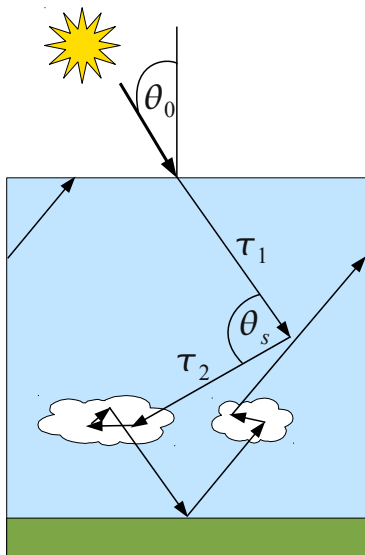


6. Surface reflection

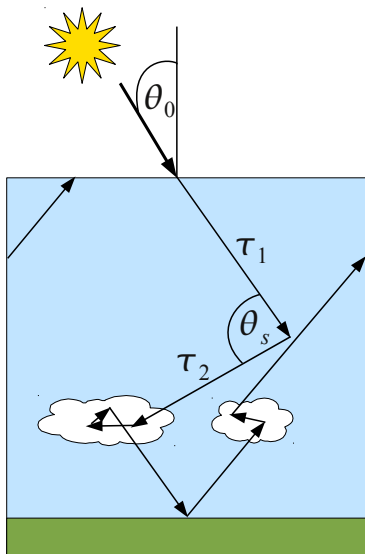


- Lambertian surface, PDF $P(\theta) = \cos(\theta)$
- Bidirectional reflectance distribution function, $\text{BPDF}(\theta_{\text{inc}}, \phi_{\text{inc}}, \theta_{\text{ref}}, \phi_{\text{ref}})$, matrix for polarized RT

7. Periodic boundary condition

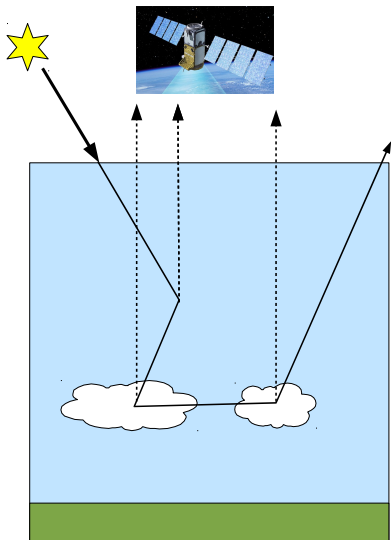


8. Count the photon



- Photon is counted when it reaches TOA or the surface
- Reflected irradiance:
 $R = N_{TOA}/N_{tot}$
- Transmitted irradiance
 $T = N_{BOA}/N_{tot}$
- How to compute radiances?

Directional (local) estimate method



- At each scattering point the probability that the photon is scattered into the direction of the sensor is calculated

$$w = w_0 P(\theta_p) \frac{\exp(-\tau_{\text{ext}})}{\cos(\theta_d)}$$

- Sum of weights yields radiance in required direction
- Details in Marshak and Davis, 2005

Radiative transfer model MYSTIC

Monte carlo code for the phYSically correct Tracing of photons In Cloudy atmospheres

Mayer [2009], Emde and Mayer [2007]



- Polarization fully integrated, Stokes vector may be calculated for arbitrary atmospheres with molecules, aerosols, and clouds (*Emde et al., 2010*)
- Combination of several methods to make code accurate and efficient:
 - ▶ Local estimate method + variance reduction
 - ▶ Importance sampling
 - ▶ Forward and backward mode
 - ▶ 1D or 3D simulations
 - ▶ spherical geometry in 1D mode
- Validation:
 - ▶ Benchmark results (*Coulson et al., 1960; Wauben and Hovenier, 1992*)
 - ▶ Polarized radiance measurements (*Blumthaler et al., 2008*)

The logo for libRadtran features a stylized sun with rays emanating from a central point, set against a light blue circular background. The text "libRadtran" is written in a blue, serif font with a slight shadow effect, positioned to the right of the sun graphic.

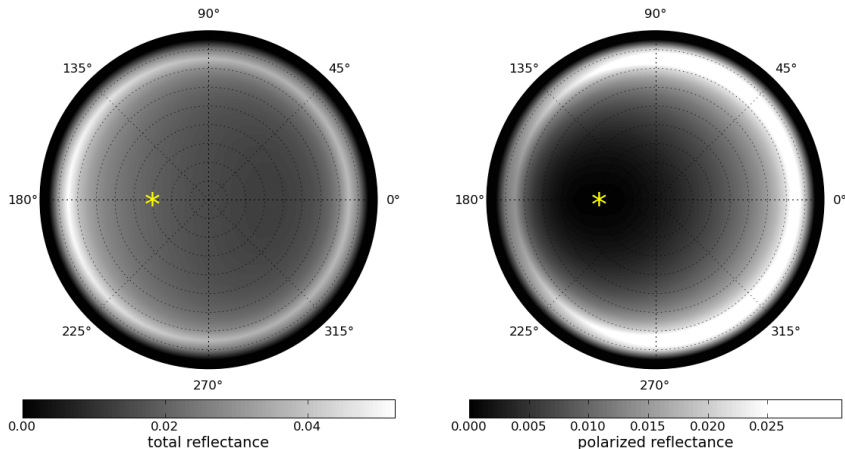
libRadtran

Mayer and Kylling, ACP, 2005

<http://www.libradtran.org>

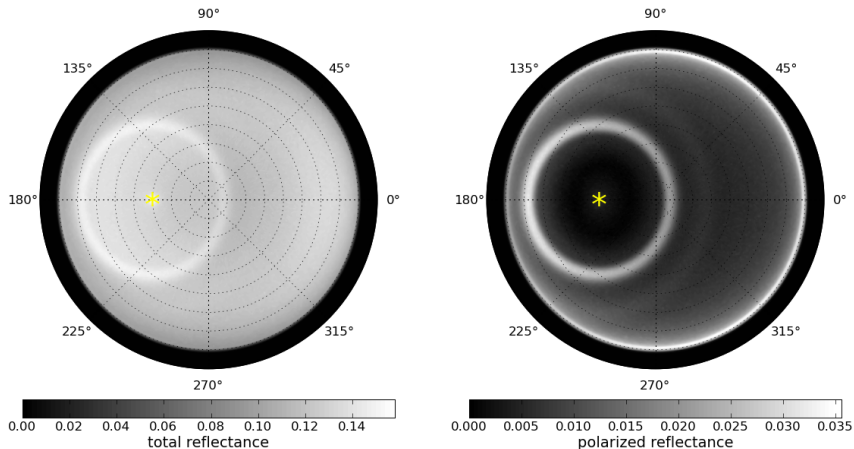
- Spectrally resolved in the UV/visible, line-by-line, quasi-spectral (LOWTRAN), and correlated-k in the solar and thermal infrared
- User-friendly flexible interface to various 1D and 3D solvers, including *disort*, *sdisort*, *twostr*, *polradtran* (Evans, 1991), (*MYSTIC*)
- Mostly open source
- Validated in various model-model and model-measurement intercomparisons
- Includes several parameterizations of cloud and aerosol optical properties

Clear sky reflectance



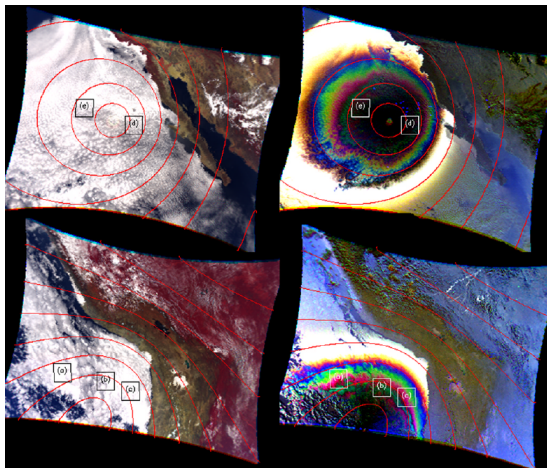
- Total and polarized reflectance at 500 nm (top of atmosphere)
- Spherical geometry, therefore reflectance is very small at angles above 80° (tangent point above ≈ 20 km)

Cloud reflectance ($\tau = 10$)



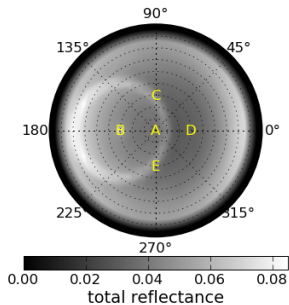
- Total and polarized reflectance at 500 nm (top of atmosphere)
- Rainbow shows large polarization

Satellite image - POLDER



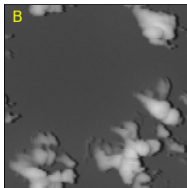
Left: radiance I , Right: polarized radiance Q

False color composite of 3 channels $[0.87, 0.67, 0.49] \mu\text{m}$, from Bréon (2005).

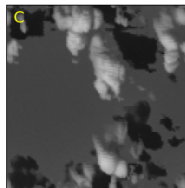


1D cloud layer

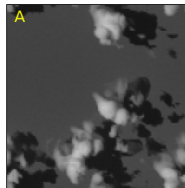
Cumulus Clouds



$\phi_v = 180^\circ$

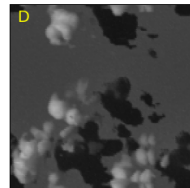


$\phi_v = 90^\circ$

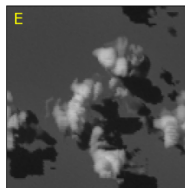


$\phi_v = 10^\circ, \theta_v = 0^\circ$

solar zenith angle: 30°
viewing zenith angle: 30°
wavelength: 500 nm

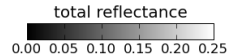


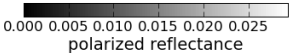
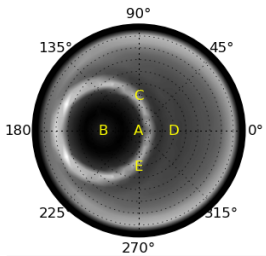
$\phi_v = 0^\circ$



$\phi_v = 270^\circ$

cloud resolution: 60 m
sample resolution: 47 m

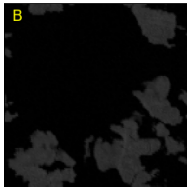




1D cloud layer

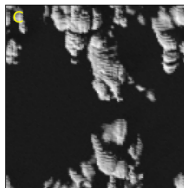
Cumulus Clouds

$\phi_v = 180^\circ$



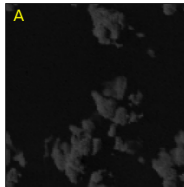
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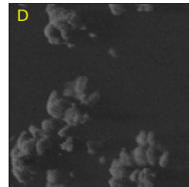


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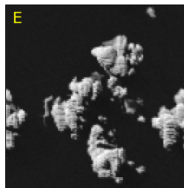
$\phi_v = 10^\circ, \theta_v = 0^\circ$



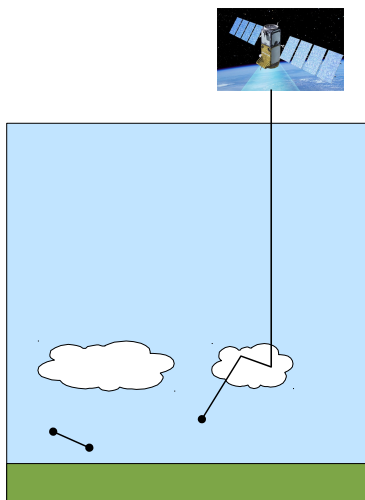
$\phi_v = 0^\circ$



$\phi_v = 270^\circ$



Backward photon tracing

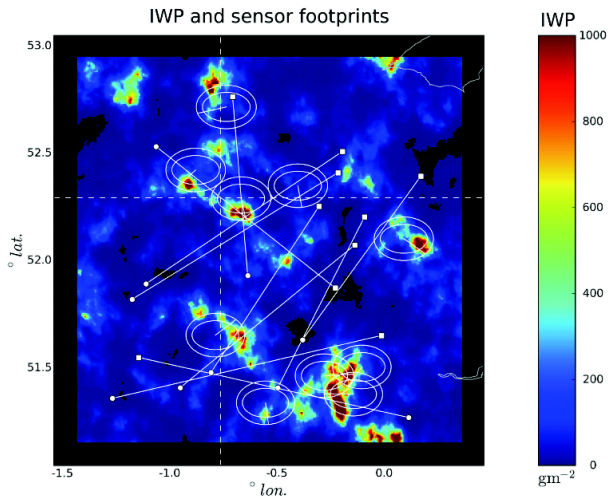


- Forward Monte Carlo extremely inefficient for thermal radiative transfer
- Reciprocity principle allows to trace photon backwards starting from the sensor until their point of emission

Monte Carlo Method - ARTS-MC

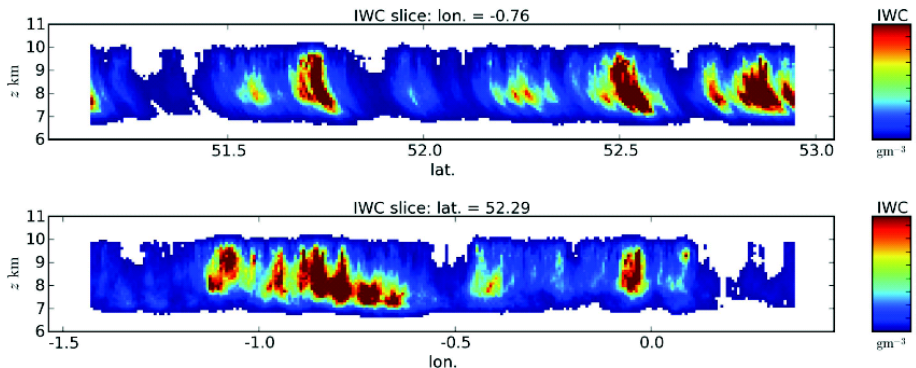
- 3D radiative transfer solver for the thermal spectral range (Davis et al., 2005)
- Specials:
 - ▶ oriented particles
 - ▶ polarisation
 - ▶ backward tracing method
 - ▶ spherical geometry
- Applications:
 - ▶ Investigate 3D effects in cloud remote sensing
 - ▶ Limb sounding (including inhomogeneous clouds)

3D cloud scenario



Scenario generated based on radar data and stochastic method.
Software by R. Hogan. [Davis et al., ACP 2007]

Ice water content slices from 3D scenario

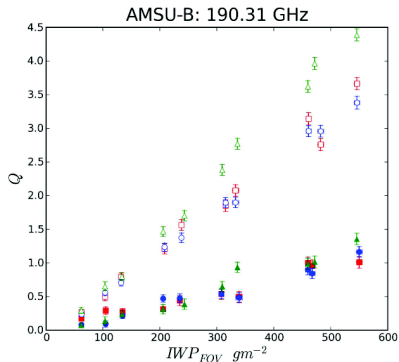
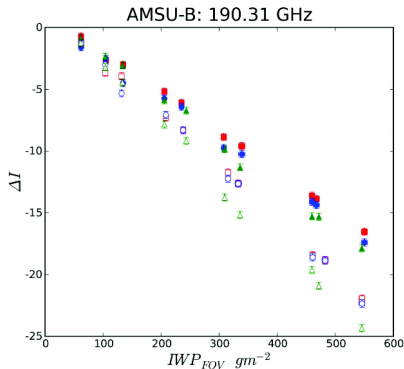


resolution: $780\text{m} \times 780\text{m} \times 110\text{m}$

Grid size: $256 \times 256 \times 64$

from Davis et al., ACP 2007

Results for AMSU-B Channel 20



3D – red squares, 1PA – blue circles, 1D – green triangles
 aspect ratio 1.3 – solid, aspect ratio 3.0 – hollow

from Davis et al., ACP 2007

Summary of ARTS scattering modules

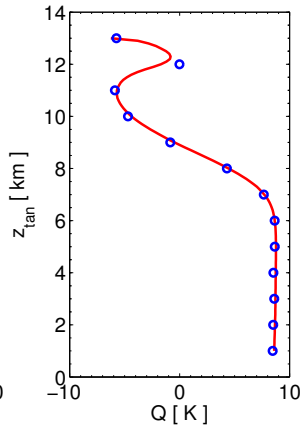
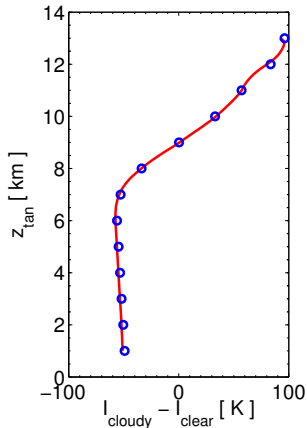
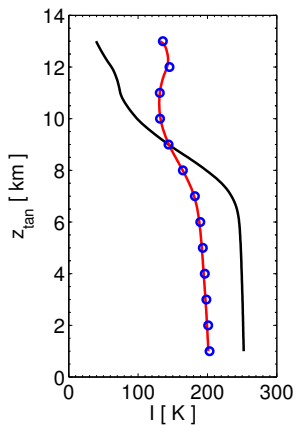
- Two modules: Discrete Ordinate and Monte Carlo
- Spherical model atmosphere: 1D and 3D
- Polarization included
- Particle shapes: rotationally symmetric (spheroids, cylinders, plates)
- Orientations: Horizontally aligned, random



<http://www.sat.ltu.se/arts>

Additional tools: PyARTS, ATMLAB

Comparison between DOIT and MC



— clear sky

— DOIT

○ Monte Carlo

Frequency: 230 GHz

Conclusions and discussion

- What is included in ARTS:
 - ▶ Two modules to calculate polarized RT with multiple scattering (MC and DOIT), unique methods because they work in spherical geometry and with oriented particles
 - ▶ Depending on the application, the user has to decide which method to use
- What is missing in ARTS?
 - ▶ Parameterization of cloud optical properties (e.g. Hong et al. (2008), pre-calculated optical properties)?
 - ▶ Fast solver for 1D plane-parallel atmosphere (to simulate CloudIce)?
 - ▶ Very fast (twostream) solver to compute OLR?