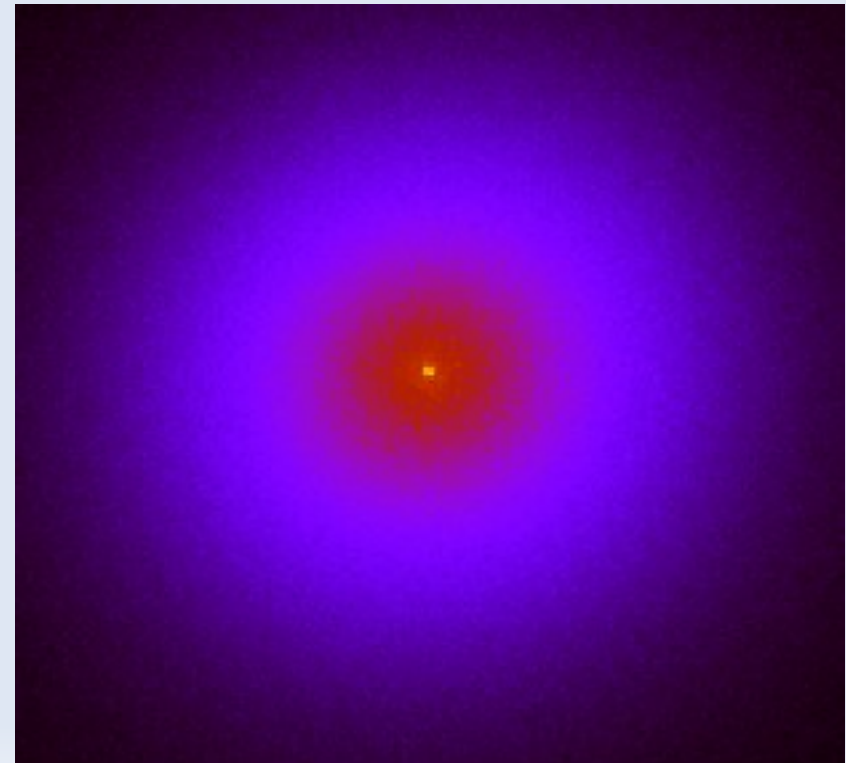
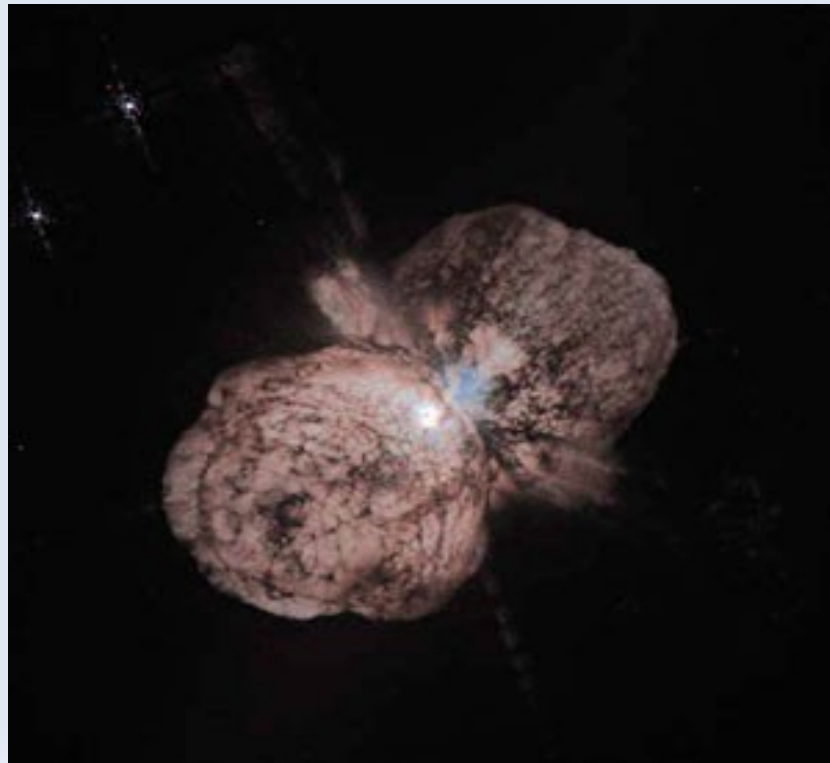


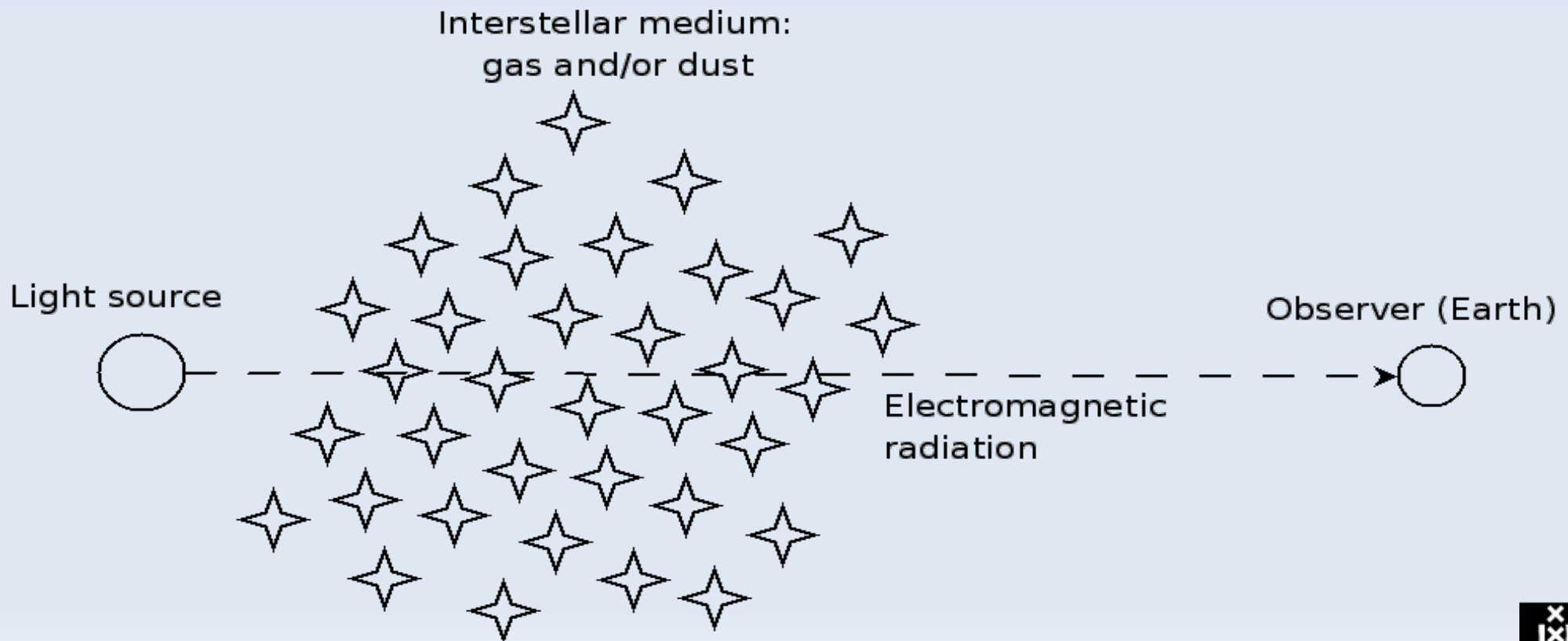
Dust radiative transfer using Monte Carlo methods

E. Angelou, A. Sottoriva



Radiative transfer in Astrophysics

Radiative transfer in astrophysics refers to the phenomena of energy transfer in the form of electromagnetic radiation between astrophysical objects.



RT: main applications

- Interpret high-resolution images produced by modern telescopes
- Understand the thermodynamical phenomena involved in an astrophysical system
- Study the physical structure of celestial bodies

Why Monte Carlo methods for RT

- Simple underlying idea
- Permit to simulate complex and inhomogeneous systems
- Under certain assumptions they are as accurate as their analytical counterparts
- Well known and widely used
- They particularly fit to the structure of the problem of RT



Monte Carlo RT: basics

- Photons are generated isotropically from a point source (a star)
- They travel across a defined interstellar medium (dust or gas)
- Along their path two main phenomena may happen due to their interaction with the matter:
 - *scattering*: the trajectory of the photon is deviated
 - *absorption*: the photon is absorbed by the medium
- The photons that exit the medium are projected into the observer's frame, producing images



RT theory: basics

- Intensity

$$I_v = \frac{dE_v}{\cos(\theta) dA dt dv d\Omega}$$

- Flux

$$F_v = \int I_v \cos(\theta) d\Omega$$

- Interaction probability

$$P(L) = \left(1 - n\sigma \frac{L}{N}\right)^N = e^{-n\sigma L} = e^{-\tau}$$

- Optical depth

$$\tau = \int_0^L n\sigma dl$$

- Albedo

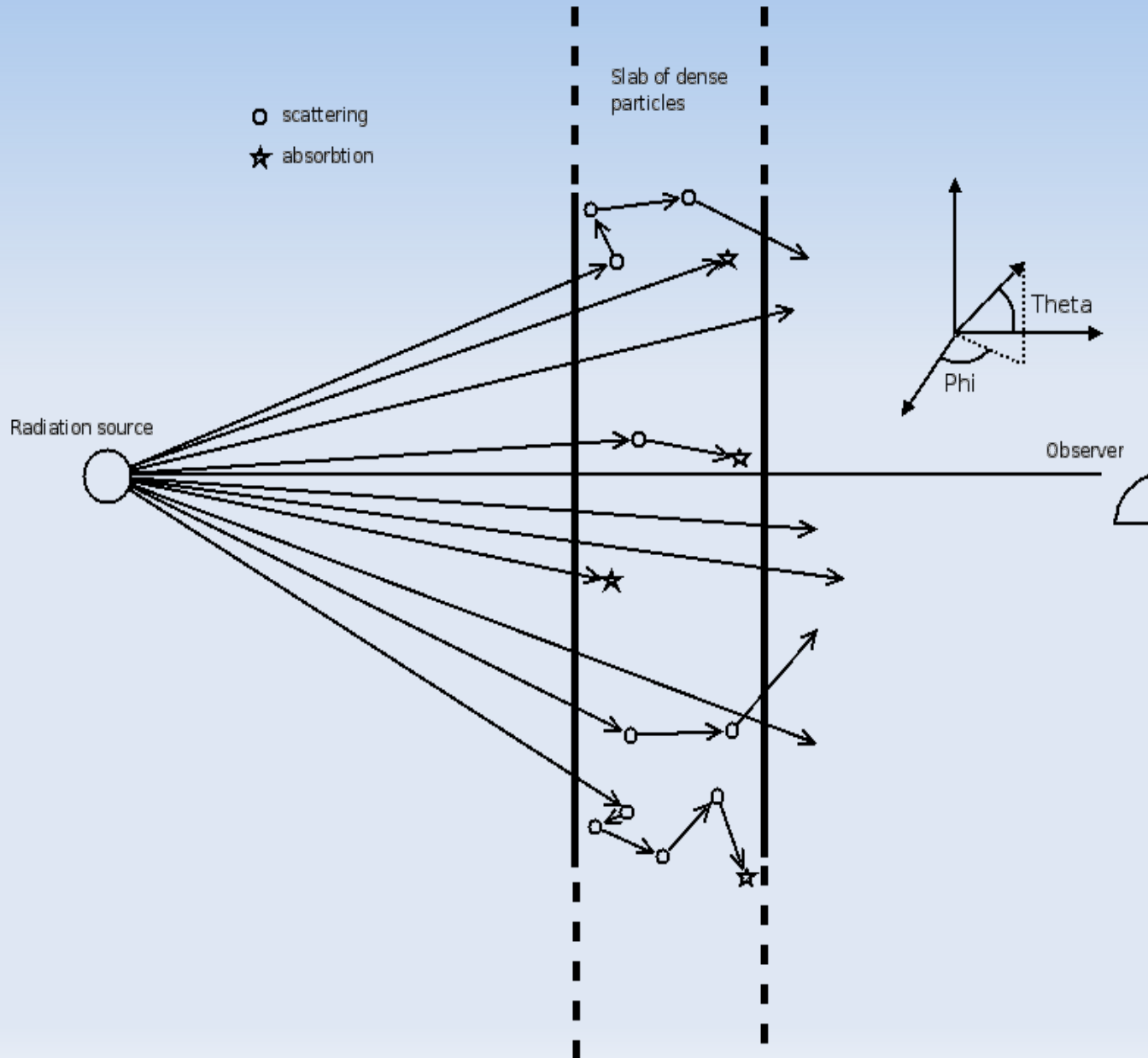
$$a = \frac{n_s \sigma_s}{n_s \sigma_s + n_a \sigma_a}$$

- Density ρ and opacity κ

$$\rho \kappa = n\sigma$$



The plane parallel semi-infinite slab



- infinite height
- infinite width
- finite depth (1.0)
- placed right in front of the source
- homogeneous density and opacity

The slab: MC algorithm

```
for a number of photons N {  
  generate a new photon from the source  
  do {  
    sample the interaction length L using:  $L = -\frac{\ln(\xi)}{n \sigma}$   
    while photon is inside the slab {  
      if  $x[0,1] < \text{albedo}$   
        scatter  
      else  
        absorb  
      compute thermodynamical measures  
    }  
    if photon exited the slab {  
      project it into the observer's plane  
    }  
  }  
}
```

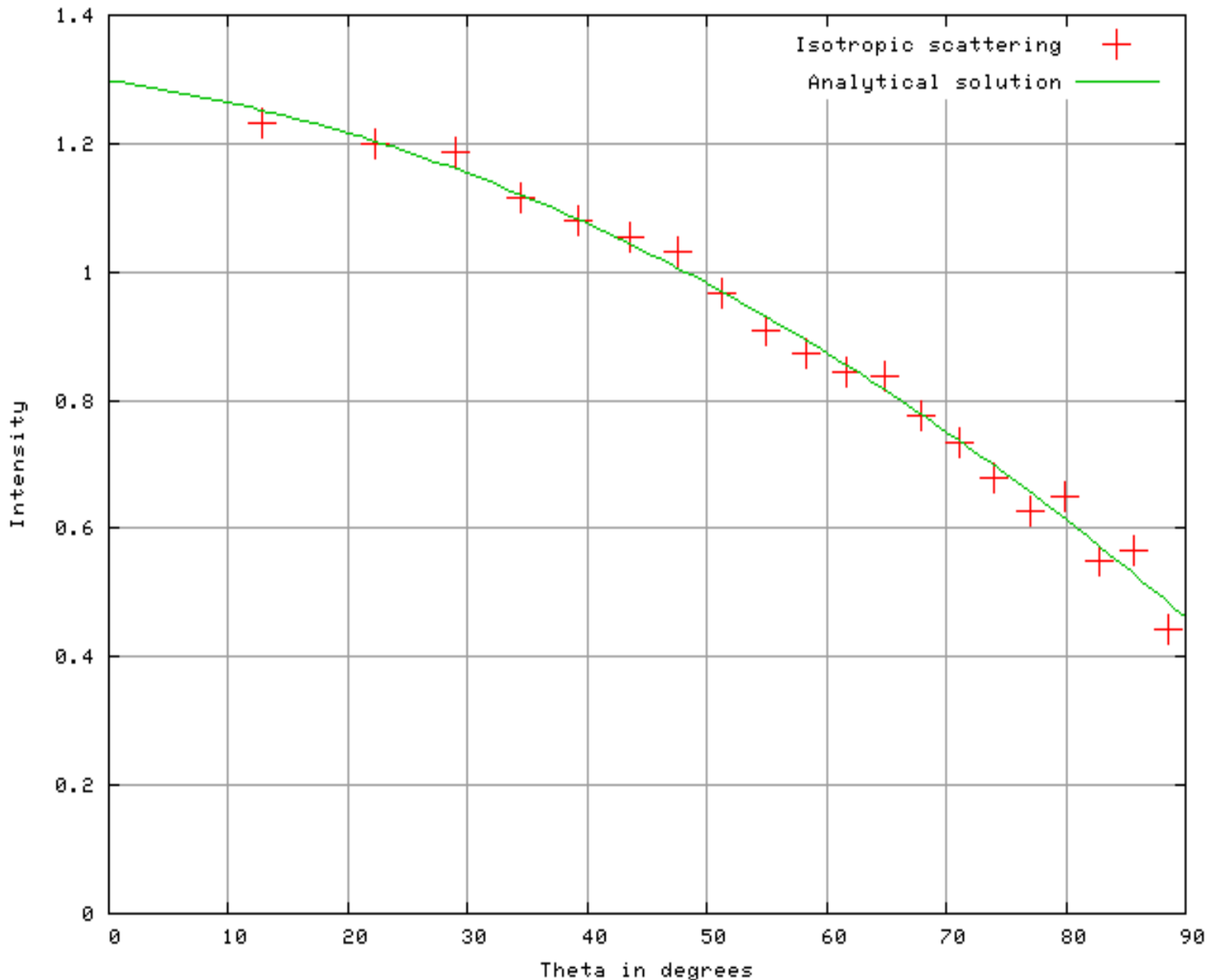

Isotropic scattering

The new direction of travel is picked uniformly from any possible direction

- Advantage: the analytical solution for this problem is known (Chandrasekhar 1960) and can be used for validation
- Disadvantage: it is a not enough accurate approximation for realistic gas or dust scattering



Isotropic scattering: validation

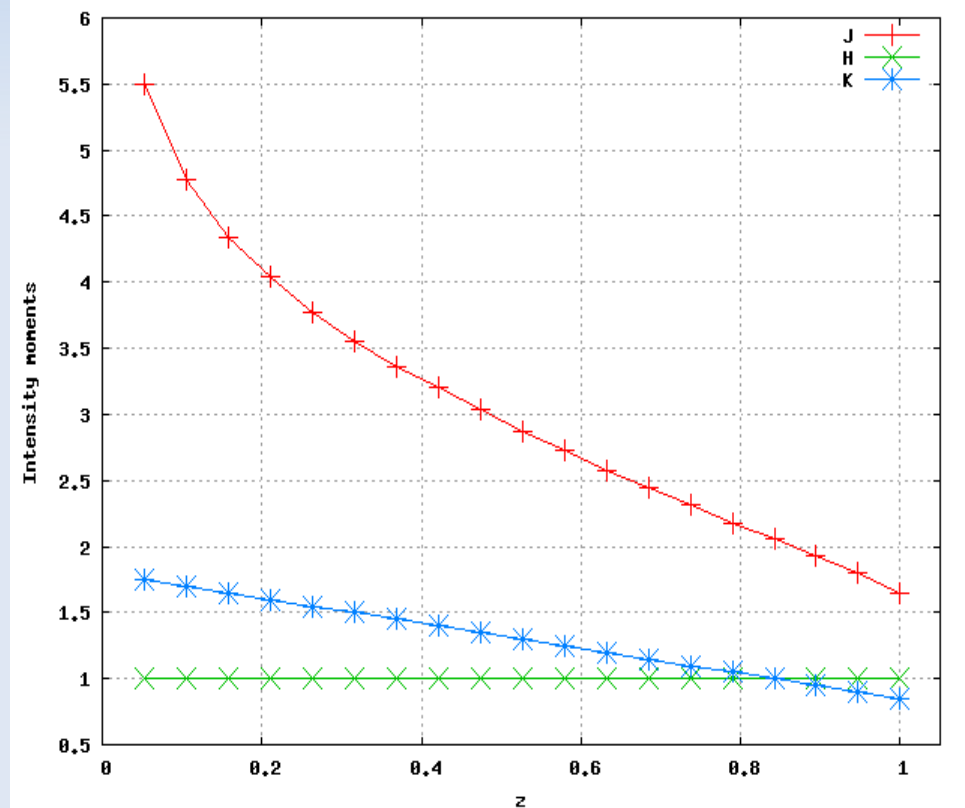
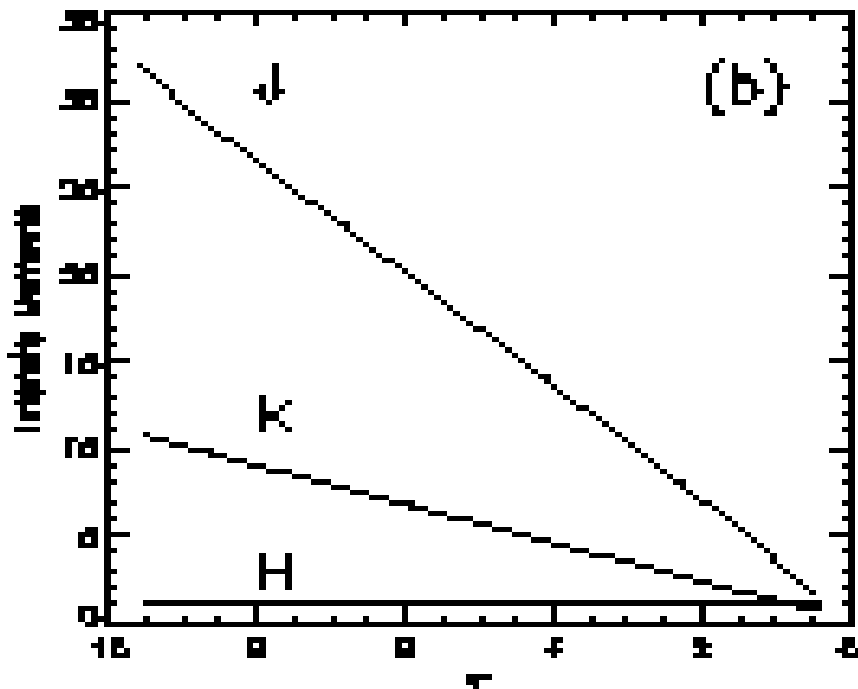


- optical depth = 10.0
- albedo = 1.0
- photons = 100,000

Isotropic scattering: moments

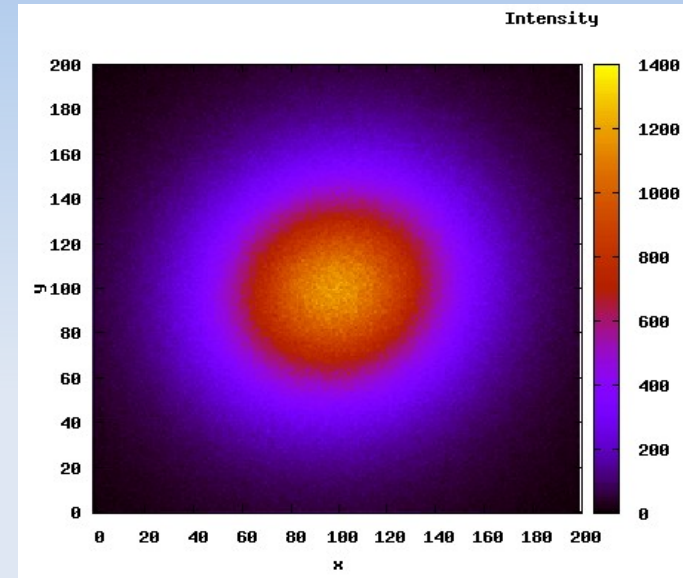
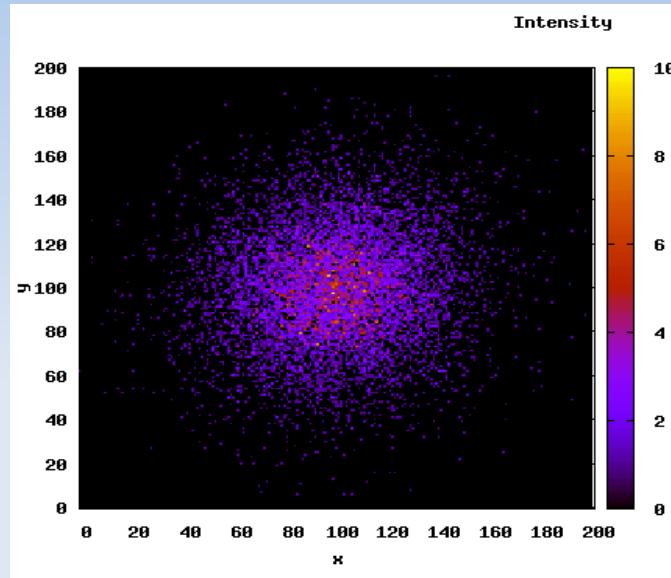
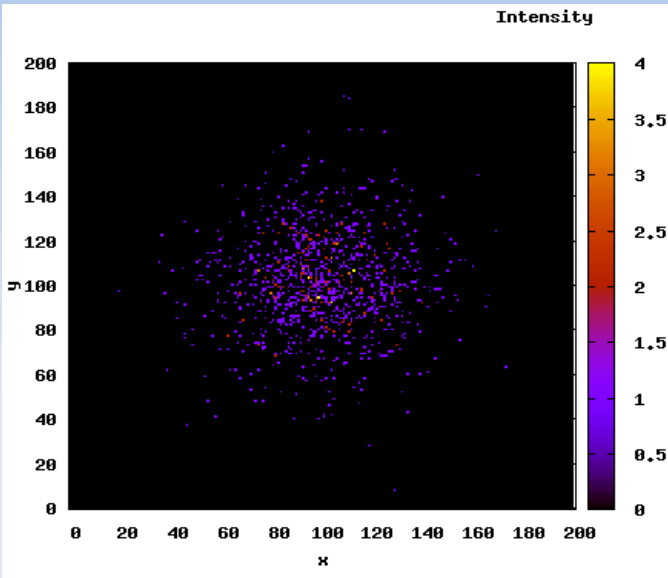
$$J = \frac{1}{4\pi} \int I d\Omega \quad H = \frac{1}{4\pi} \int I \cos(\theta) d\Omega \quad K = \frac{1}{4\pi} \int I \cos^2(\theta) d\Omega$$

$$J = \frac{B_v}{4N_0} \sum_i \frac{1}{|\mu_i|} \quad H = \frac{B_v}{4N_0} \sum_i \frac{\mu_i}{|\mu_i|} \quad K = \frac{B_v}{4N_0} \sum_i \frac{\mu_i^2}{|\mu_i|} \quad \mu = \cos(\theta)$$

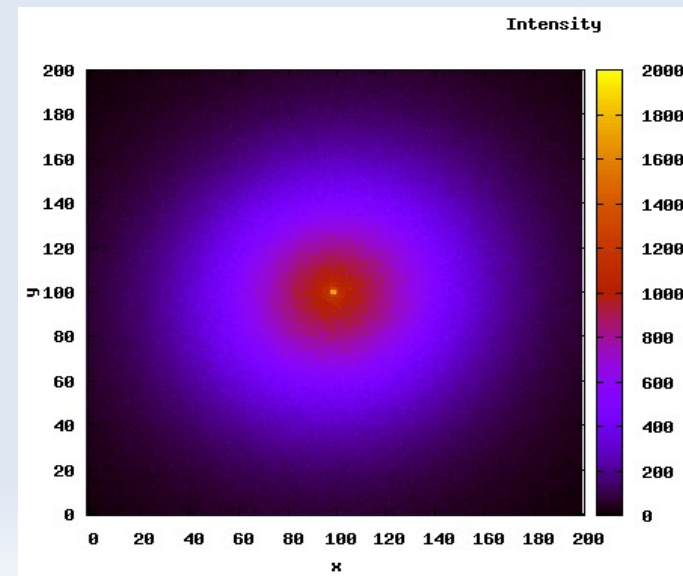
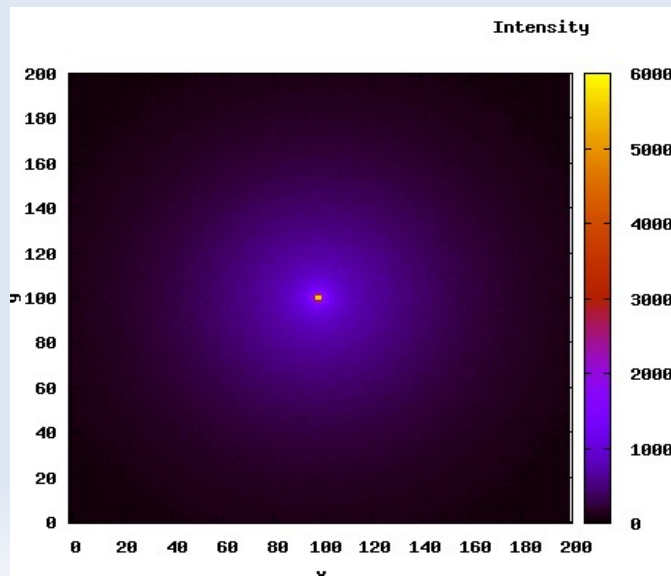
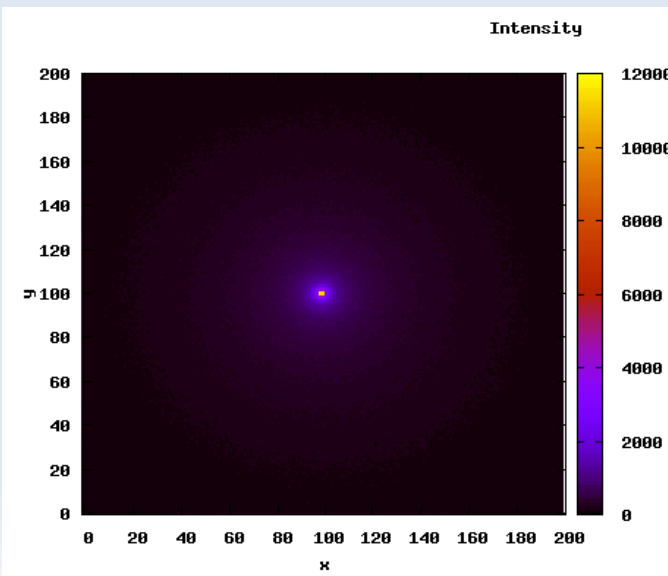


Isotropic scattering: results

Intensity against albedo

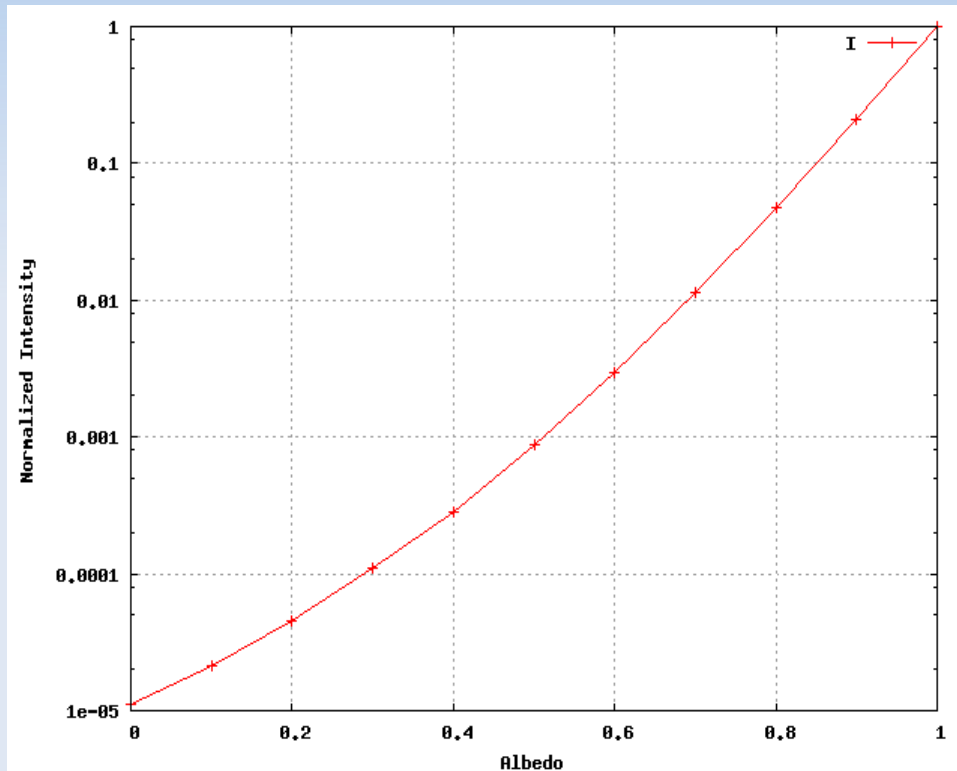


Intensity against optical depth

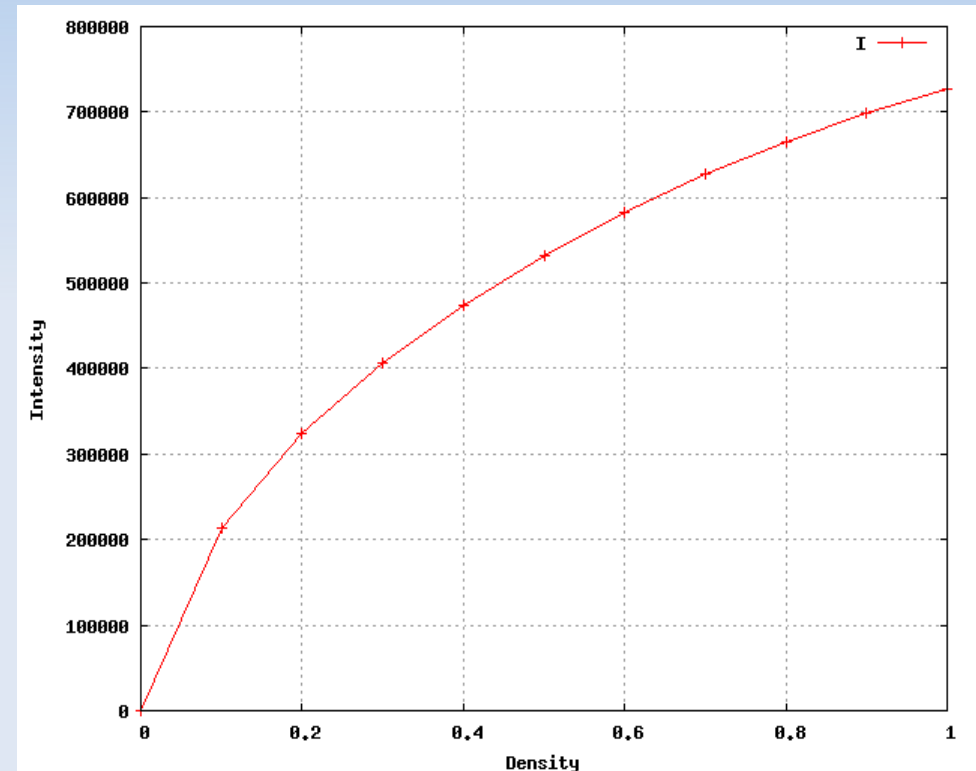


Isotropic scattering: results

Total intensity against albedo



Total intensity against optical depth



Anisotropic scattering

- Interstellar medium: gas and dust
- We want to simulate dust scattering (ex Nebulae and some cases of accretion disk)
- Anisotropic scattering using *Rayleigh* + *Henyeey-Greenstein* function
- The scattering depends on the incident angle and on several other parameters
- Photons polarization is also modeled
- Simulation of dust or gas properties for different wavelengths is possible



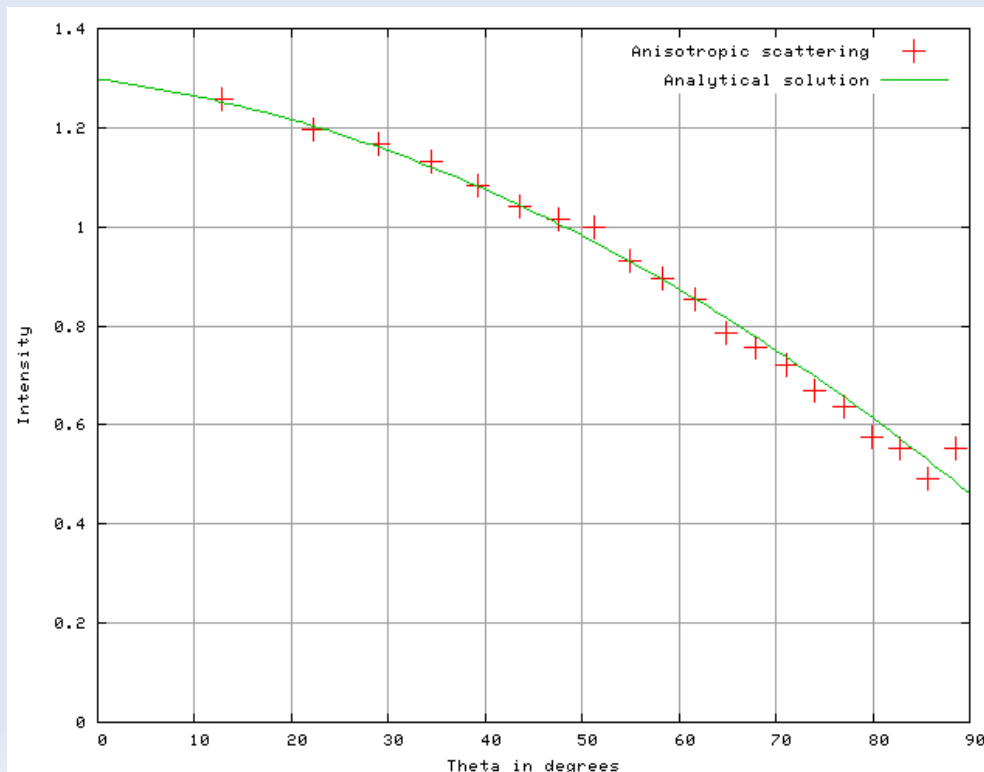
Anisotropic scattering: validation

Additional anisotropic scattering parameters:

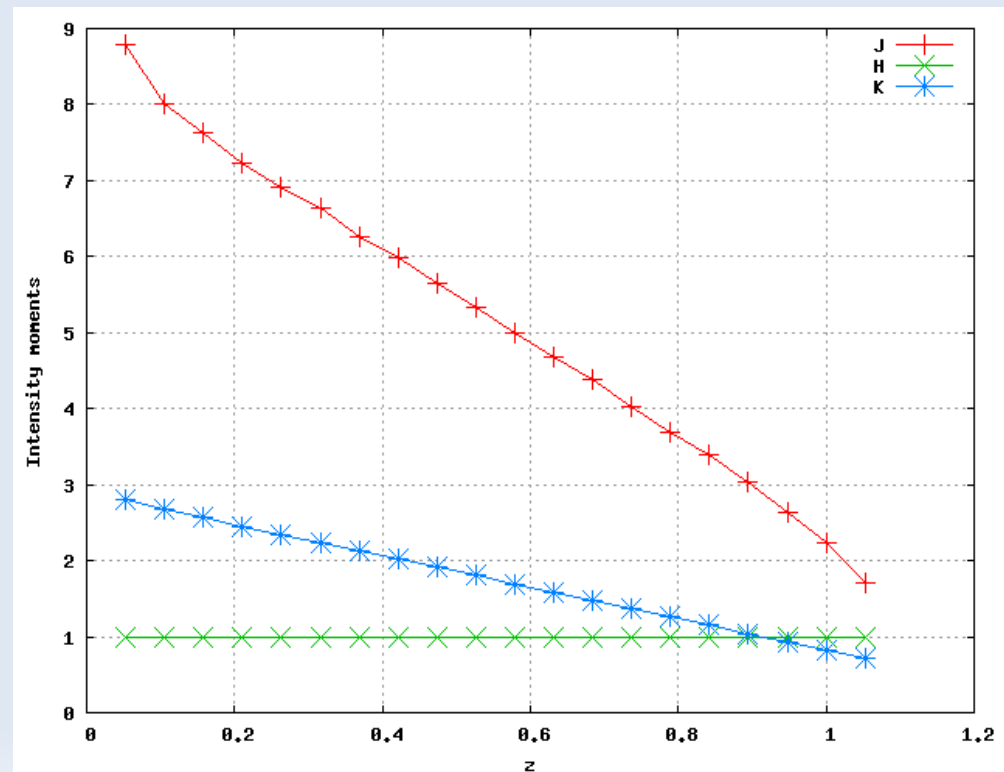
- **g**: scattering asymmetry parameter (0 = isotropic, 1 = forward-throwing)
- **pl**: peak linear polarization

We validated Anisotropic scattering using **g=0**

Intensity-cos(θ)



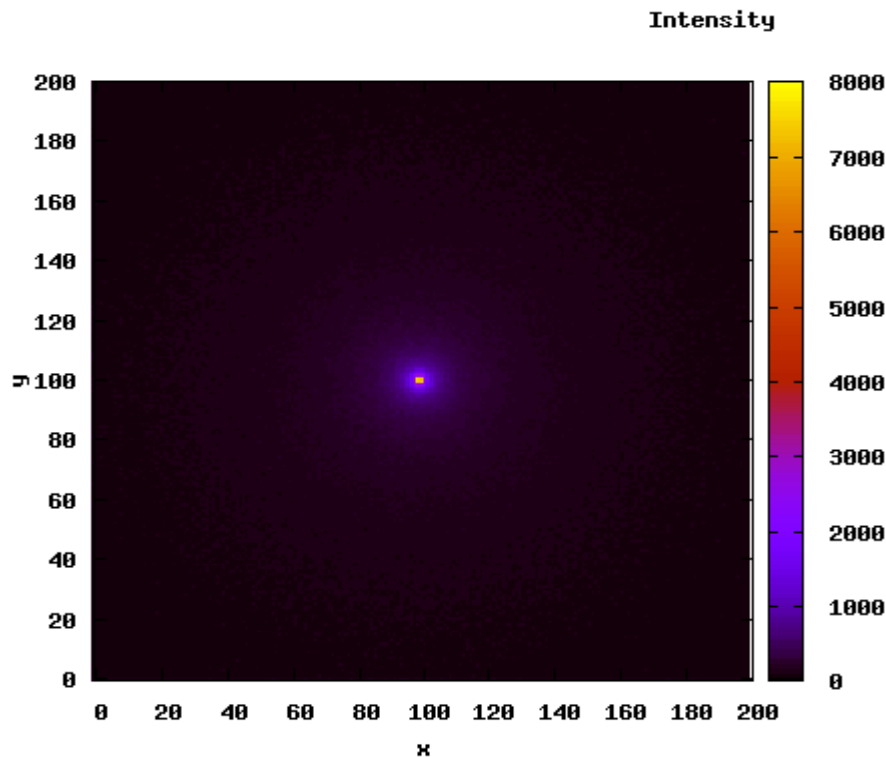
Intensity moments



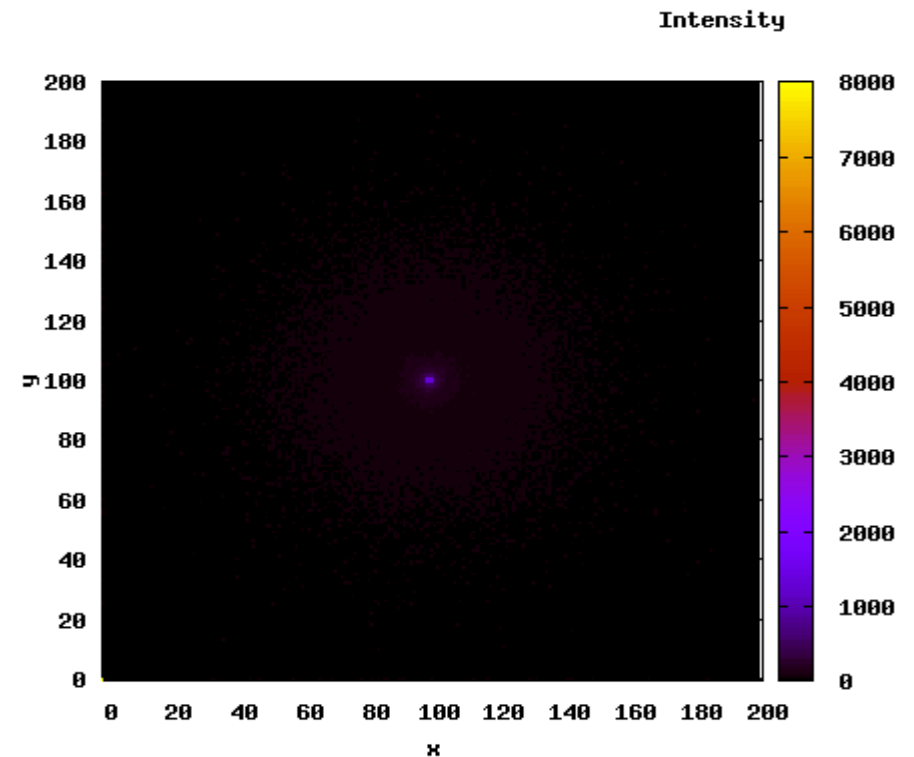
Anisotropic scattering: results

Ultraviolet band U ($\lambda=0.34\mu\text{m}$)

Infrared band K ($\lambda=2.20\mu\text{m}$)



depth=1, albedo=0.54, kappa=360,
g=0.48, pl=0.26



depth=1, albedo=0.21, kappa=20,
g=0.02, pl=0.93

3D grid with dust scattering

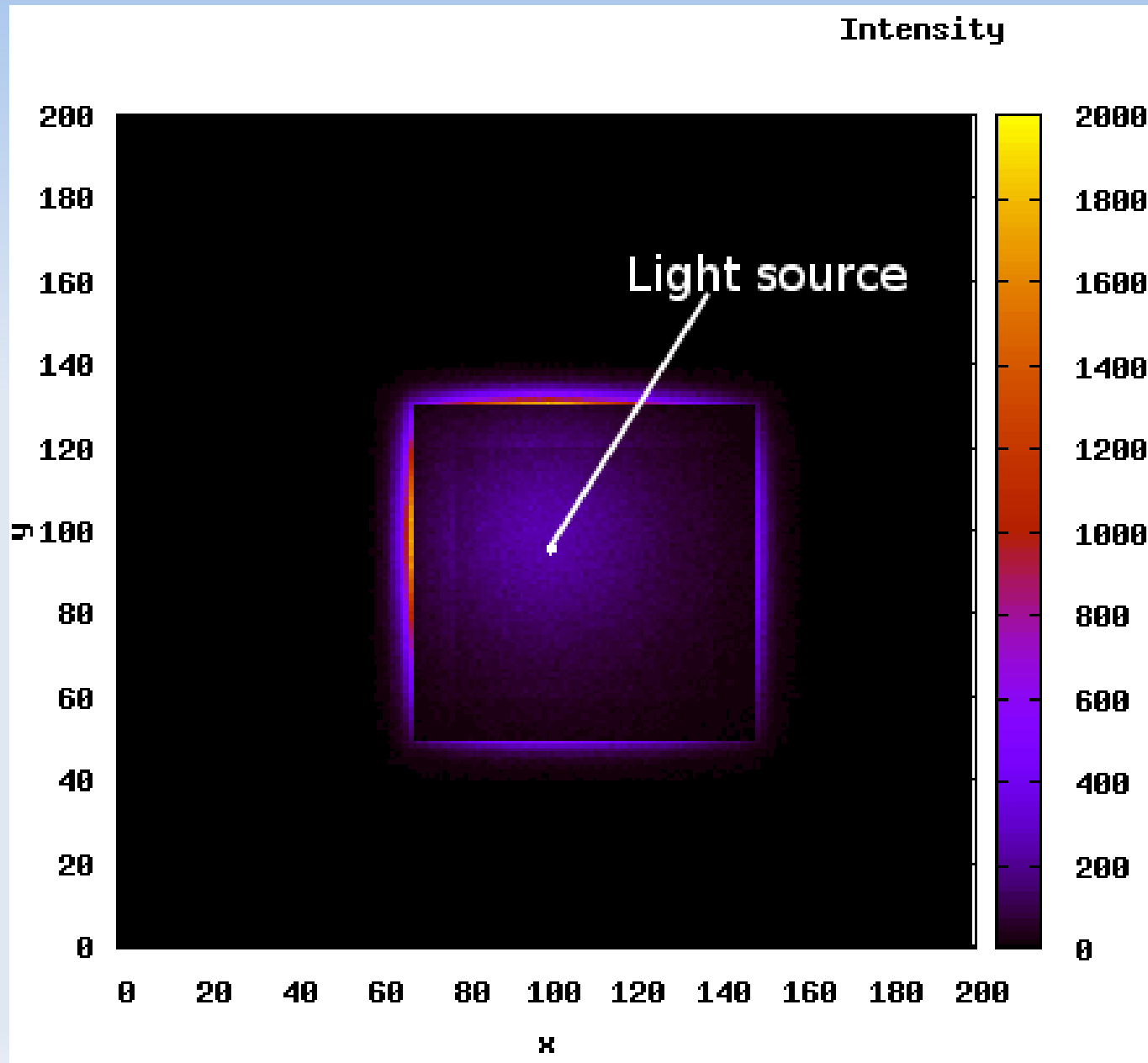
- We build a 3D Cartesian grid to simulate inhomogeneous media
- Each point of the grid is associated to a value of density ρ and opacity κ
- For every photon we have to compute the optical depth depending on the instant position and direction using:

$$\tau = \int_0^L n \sigma dl$$

- We can simulate totally arbitrary conditions



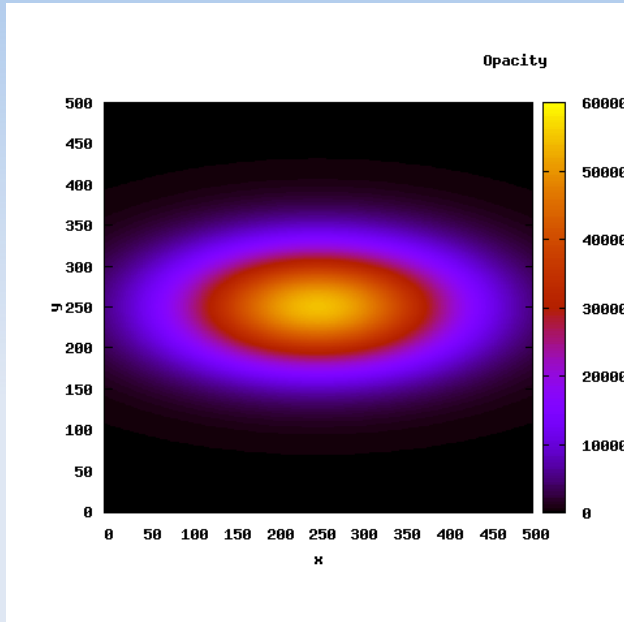
3D grid: a dust cube



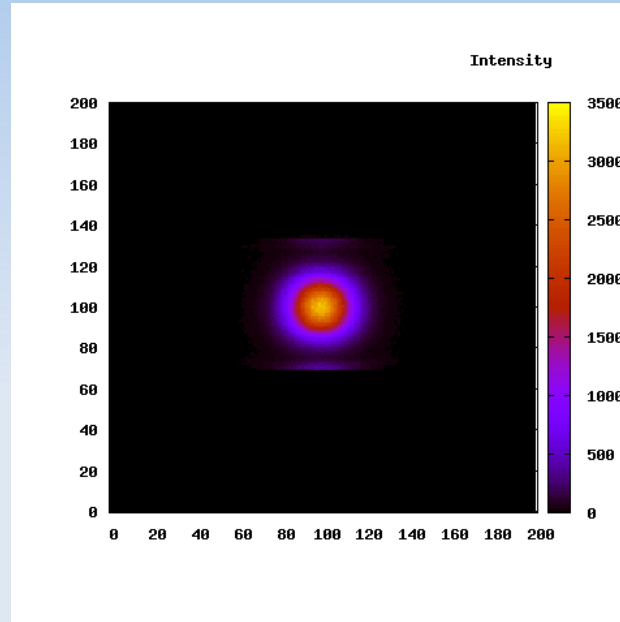
- Grid: 1.0x1.0x1.0 discretized to 200x200x200 points
- Dust cube: 10x10x10 grid points at position -7,7,100

3D grid: a dust spheroid

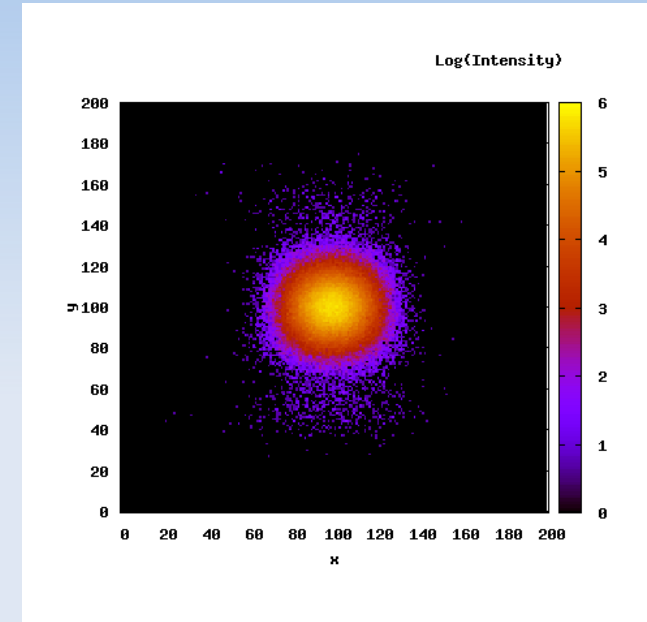
Opacity distribution



Intensity



Intensity (logarithmic scale)



Spheroid volume:
$$x^2 + \frac{y^2}{c} + z^2 = r$$

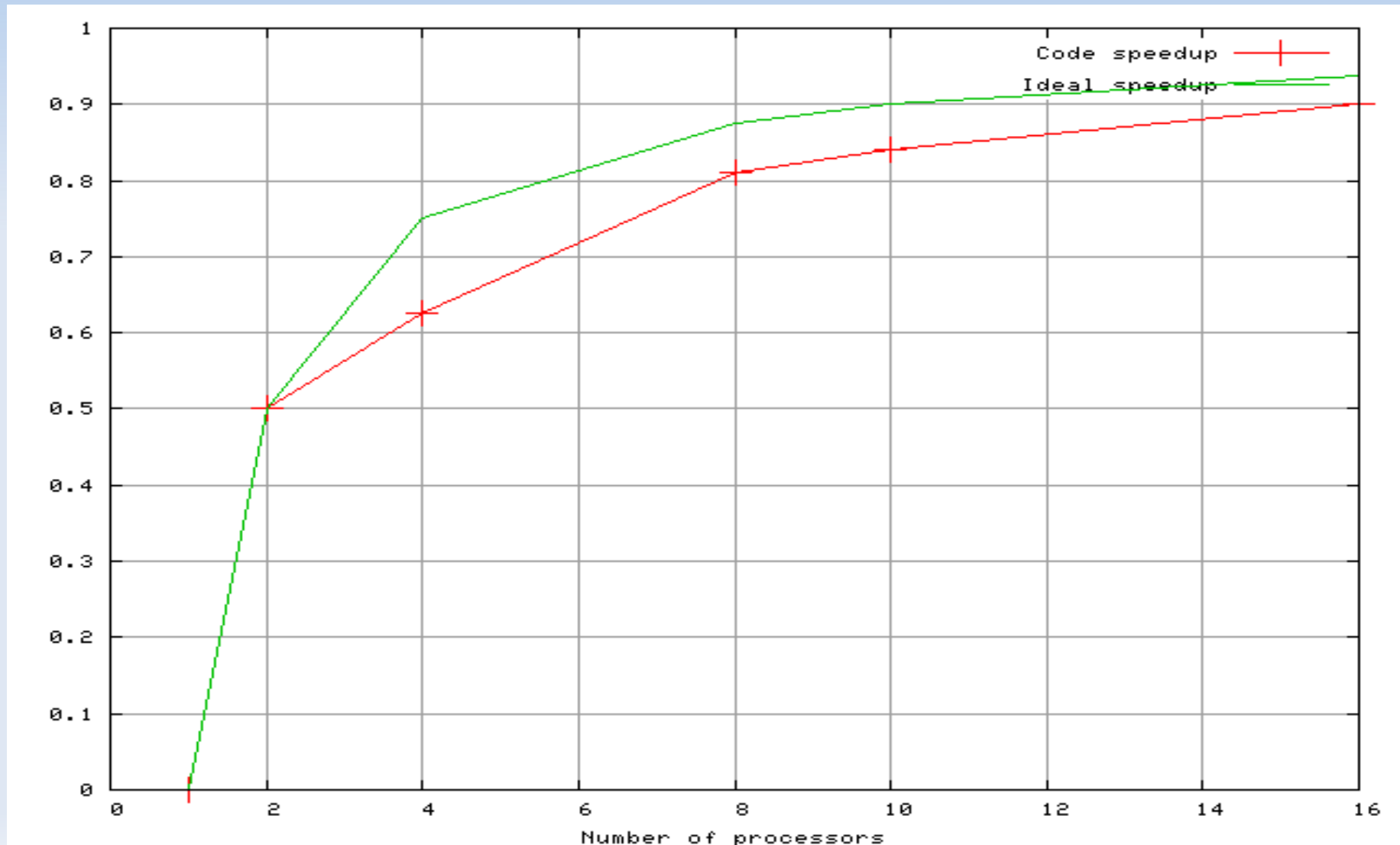
Spheroid opacity:
$$k = e^{-2r_i/r}$$

Parallelization using MPI

- We parallelize the simulation by decomposing the number of generated photons among the CPUs
- At the final step all the values are merged to the *root* processor
- High-efficiency and low communication overhead obtained
- Eventually for very big grids a spatial domain decomposition is also possible (in case of memory limits)

Parallelization: speedup

Results obtained using the DAS 3 cluster



Conclusions

- RT is a very complex process with several underlying aspects
- We studied and understood a considerable part of the theoretical background
- We implemented a MC simulation for dust RT
- We validated it for the plane parallel slab scenario, we did experiments and measurements on it
- We implemented a 3D grid for inhomogeneous media on which we also experimented
- We parallelized the simulation code using MPI

