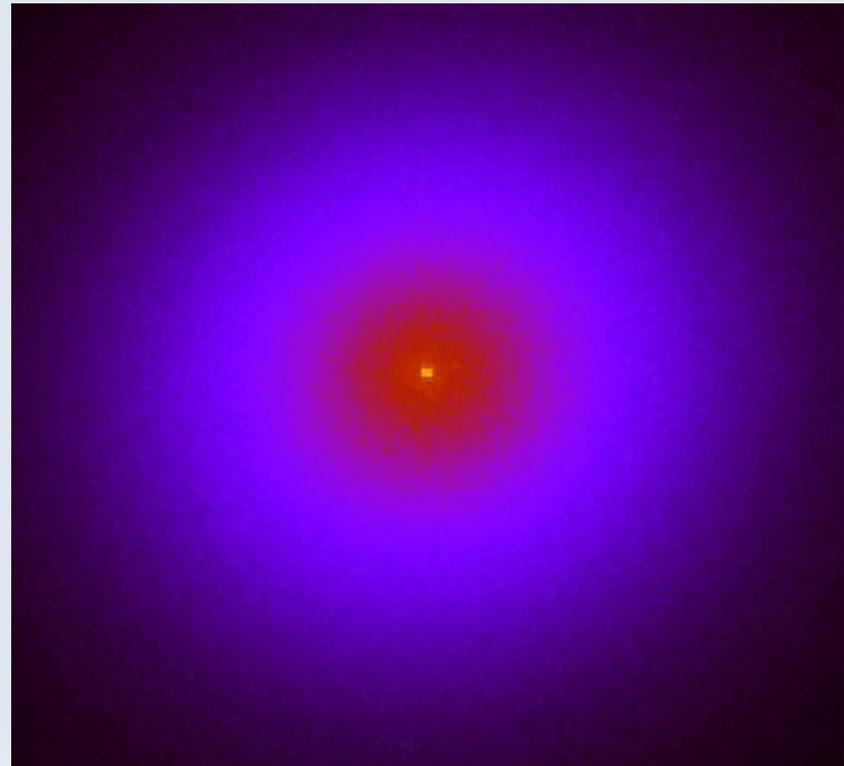
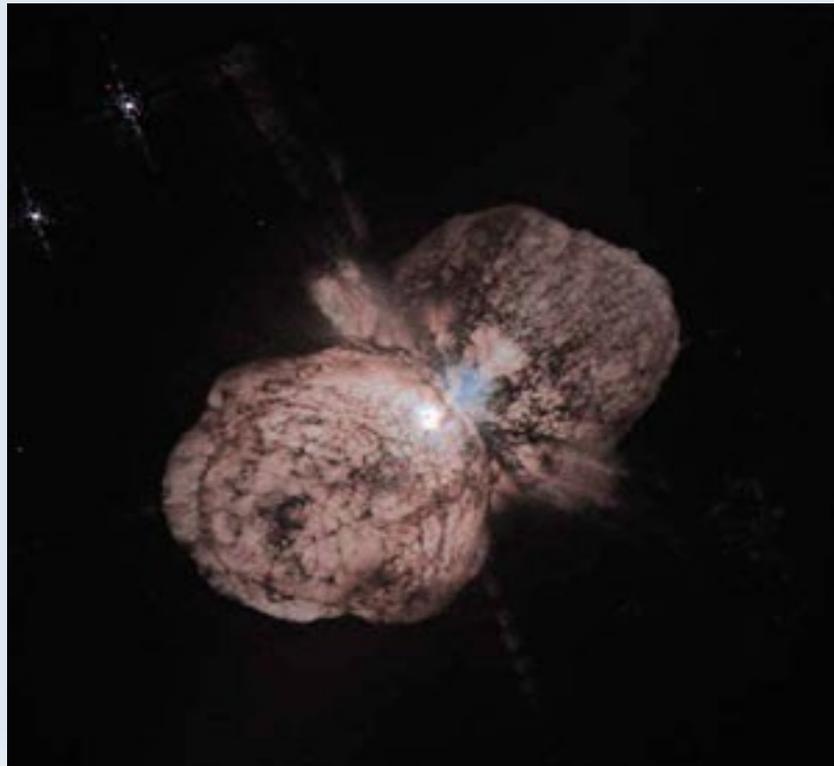


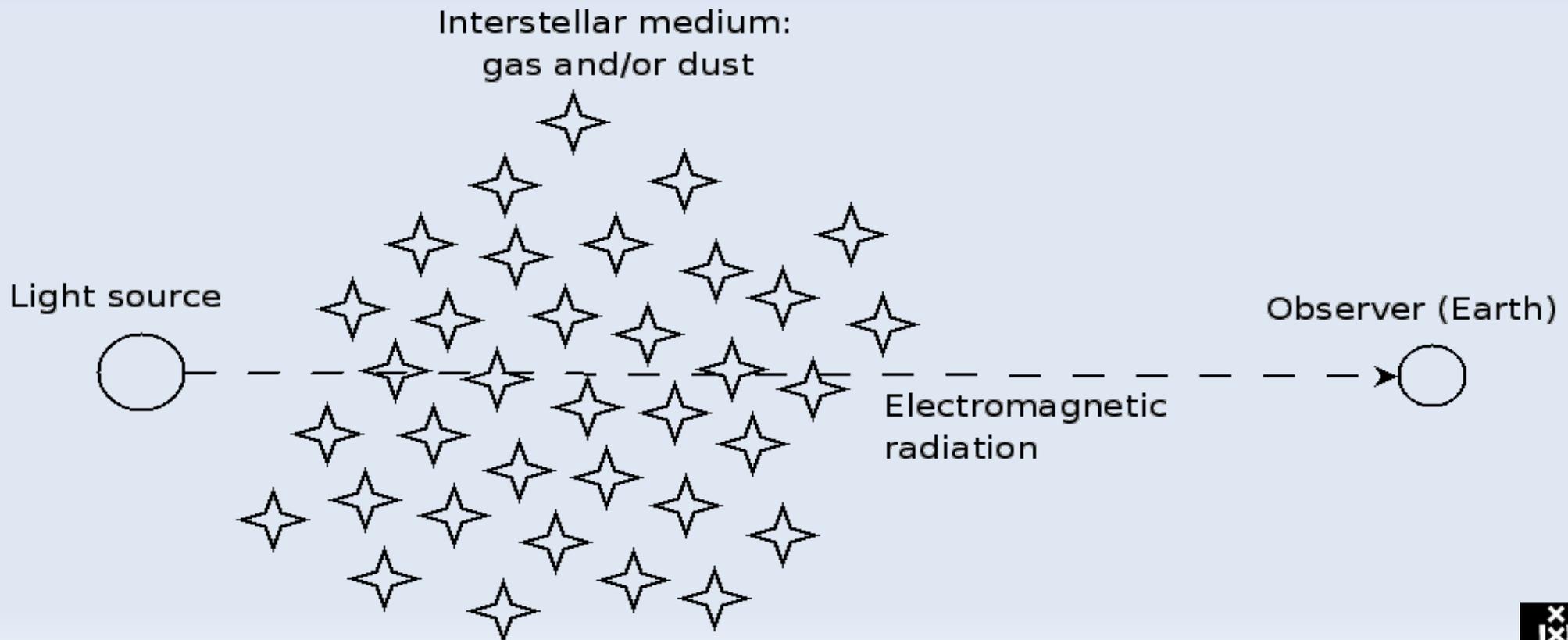
# Dust radiative transfer using Monte Carlo methods

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# 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

$$I_\nu = \frac{dE_\nu}{\cos(\theta) dA dt d\nu d\Omega}$$

- Flux

$$F_\nu = \int I_\nu \cos(\theta) d\Omega$$

- 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

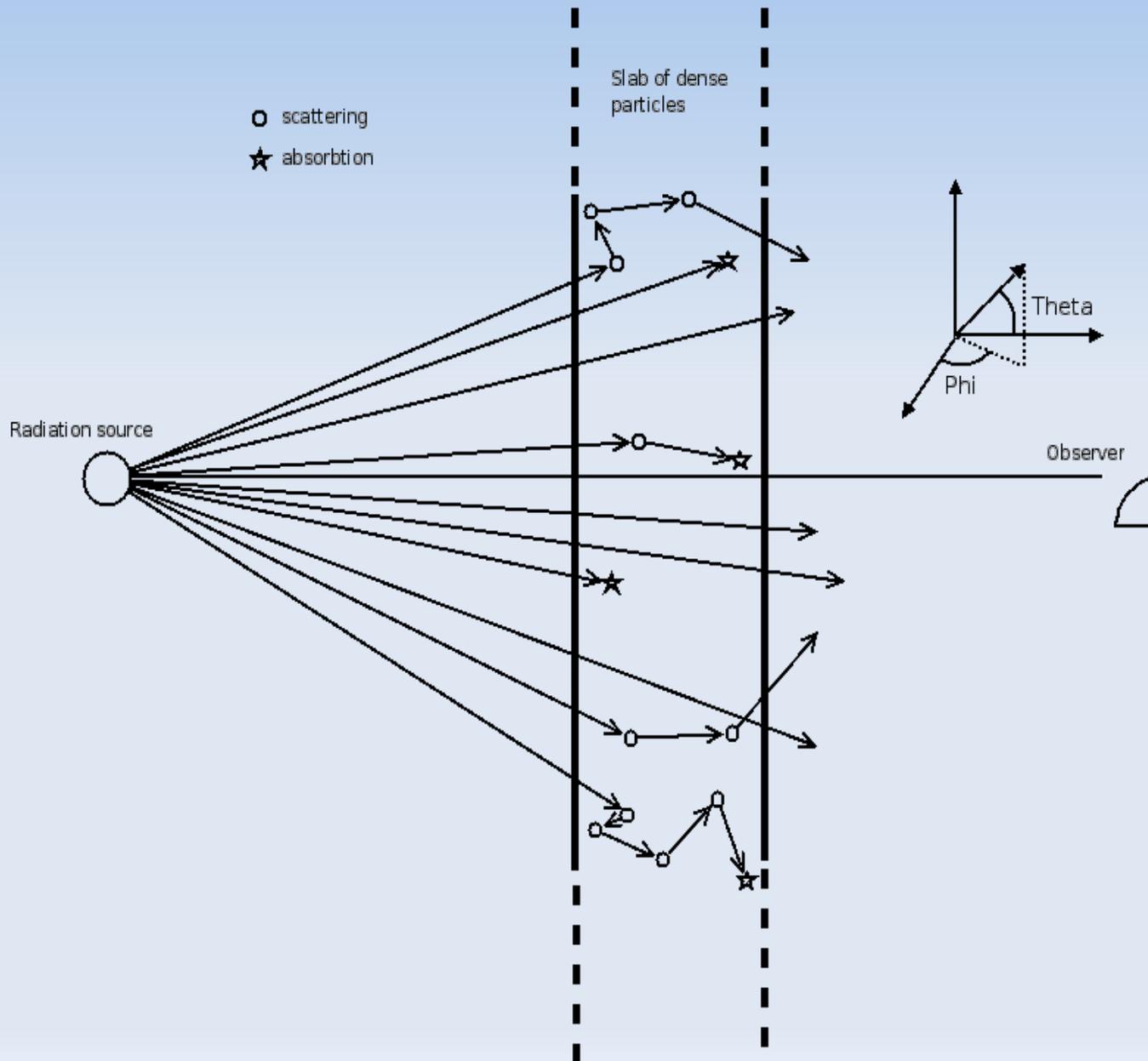
$$a = \frac{n_s \sigma_s}{n_s \sigma_s + n_a \sigma_a}$$

- Density  $\rho$  and opacity  $\kappa$

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



# 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  
    }  
  }  
}
```

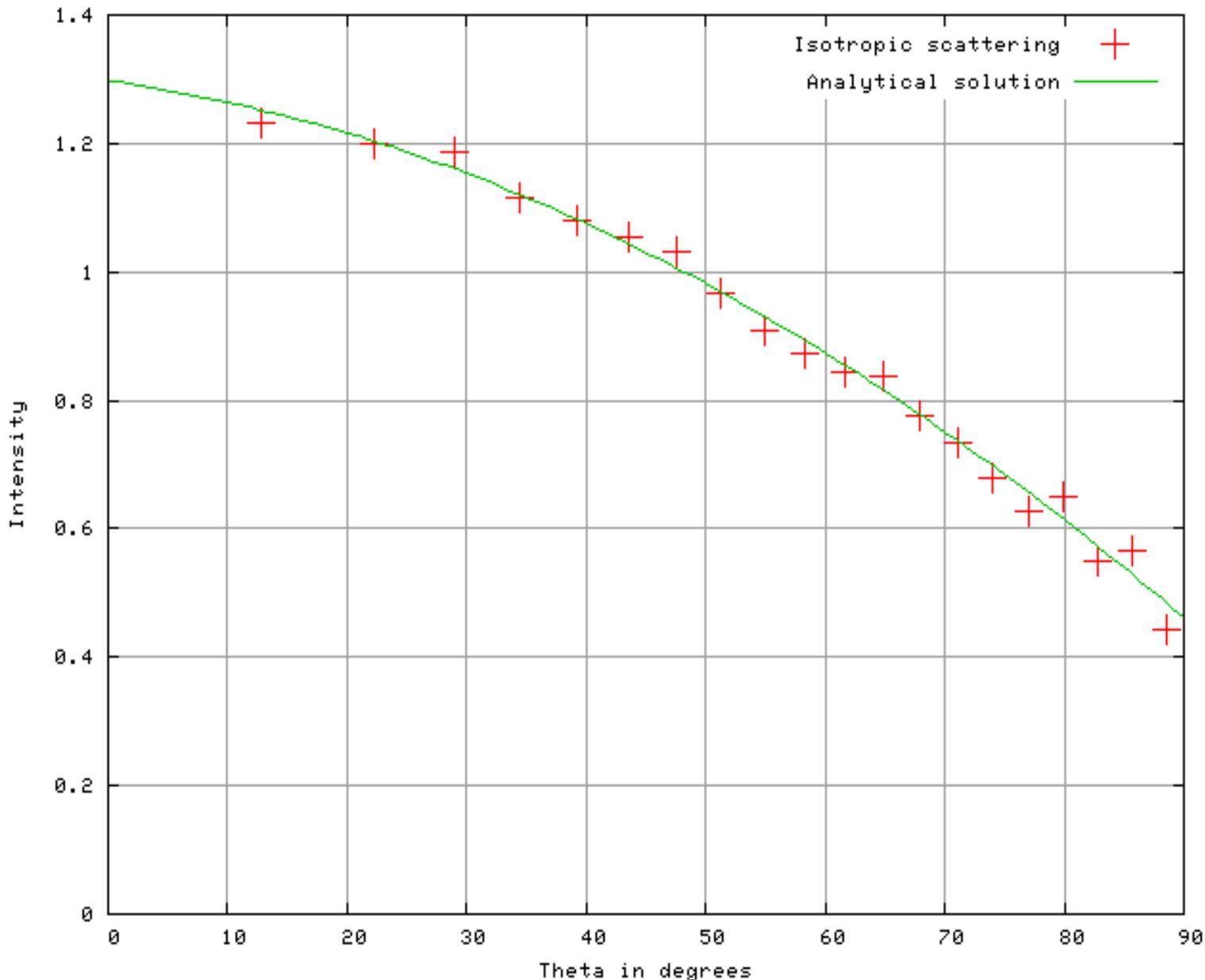


# Isotropic scattering

*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

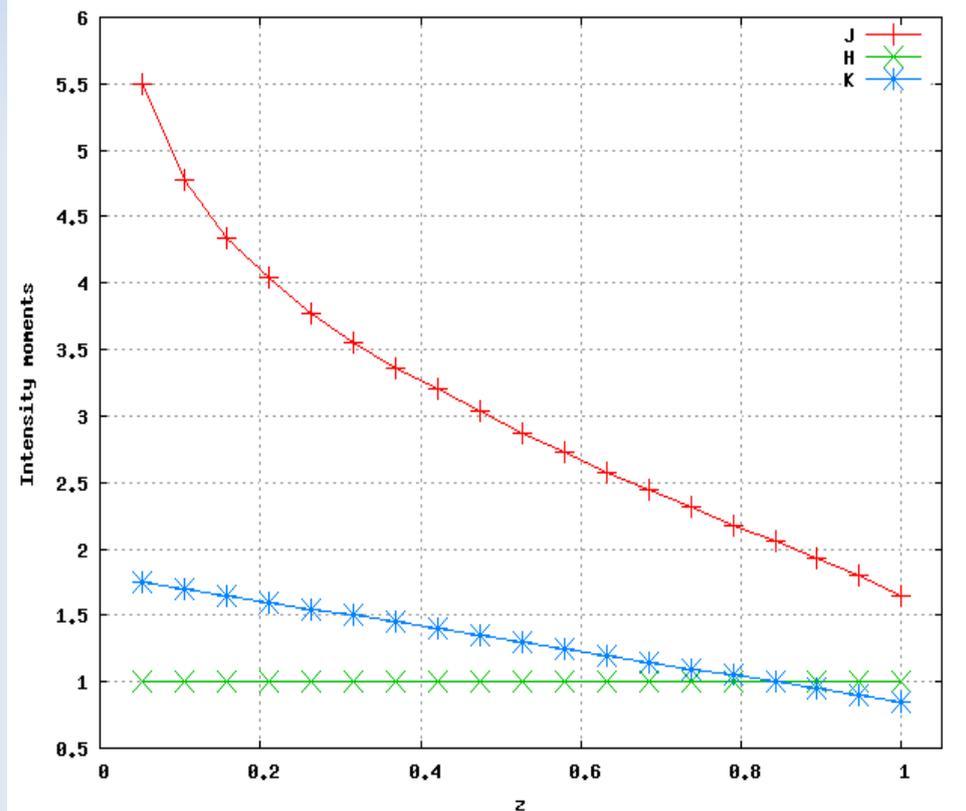
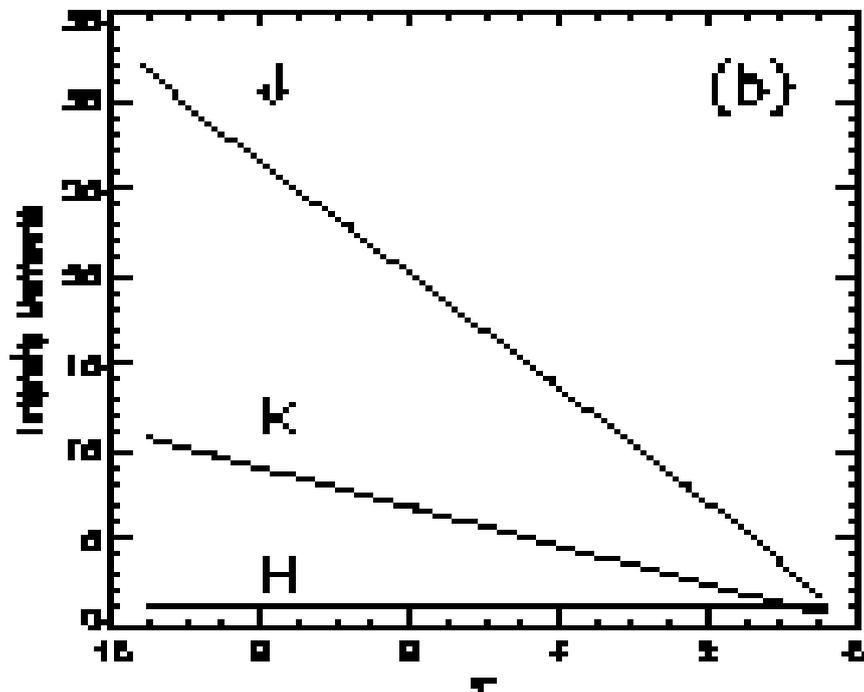


- optical depth = 10.0
- albedo = 1.0
- photons = 100,000

# Isotropic scattering: moments

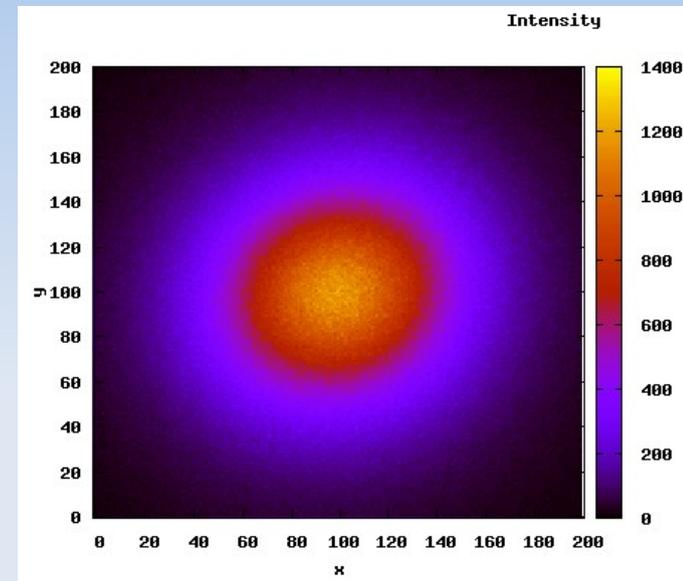
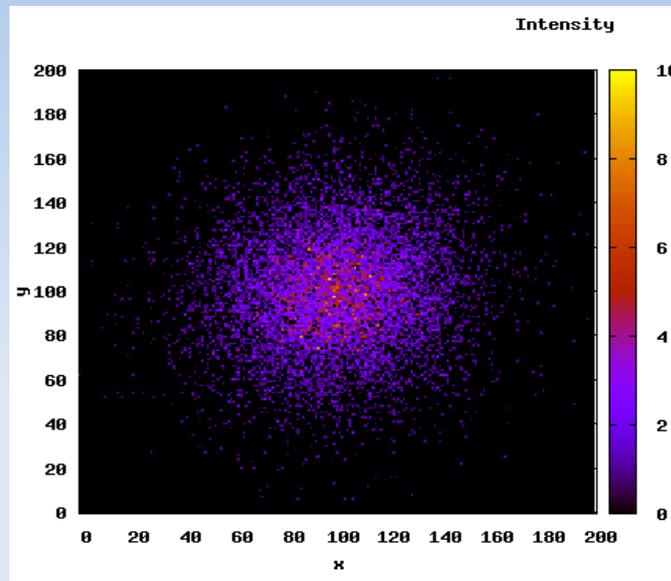
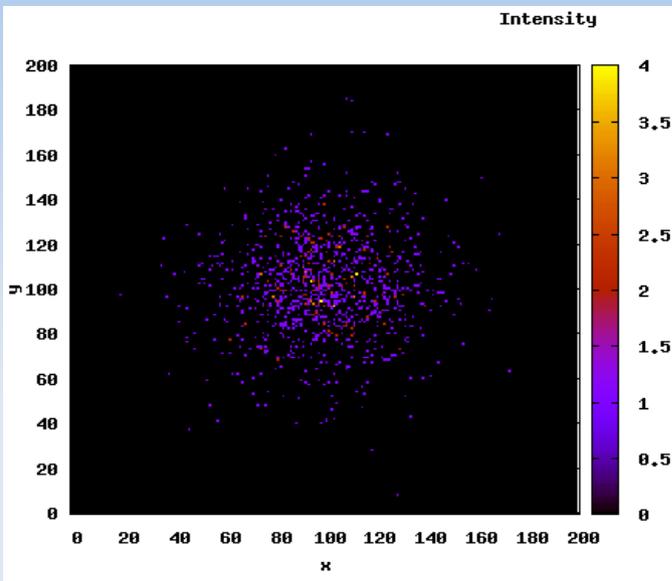
$$J = \frac{1}{4\pi} \int I d\Omega \quad H = \frac{1}{4\pi} \int I \cos(\theta) d\Omega \quad K = \frac{1}{4\pi} \int I \cos^2(\theta) d\Omega$$

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

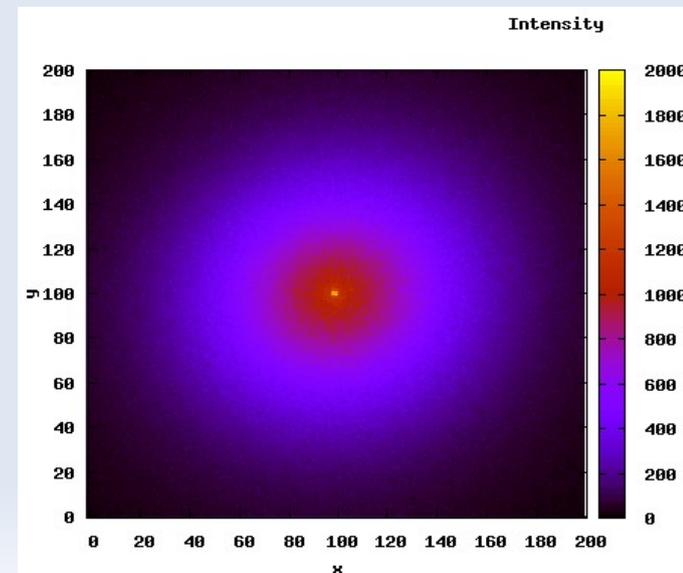
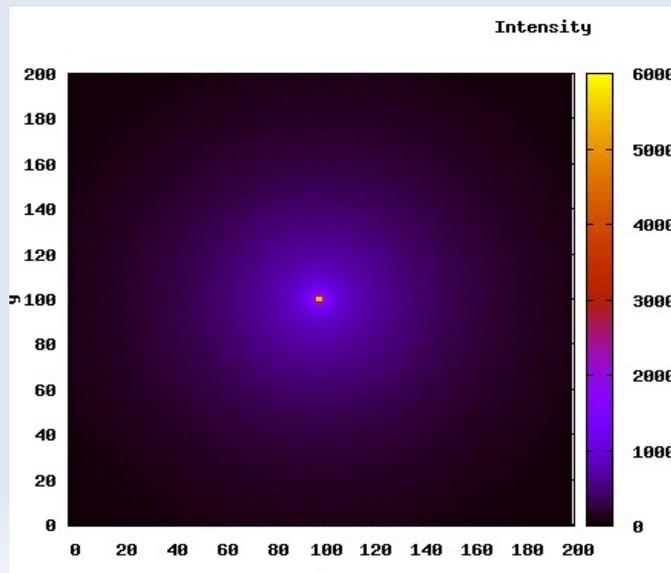
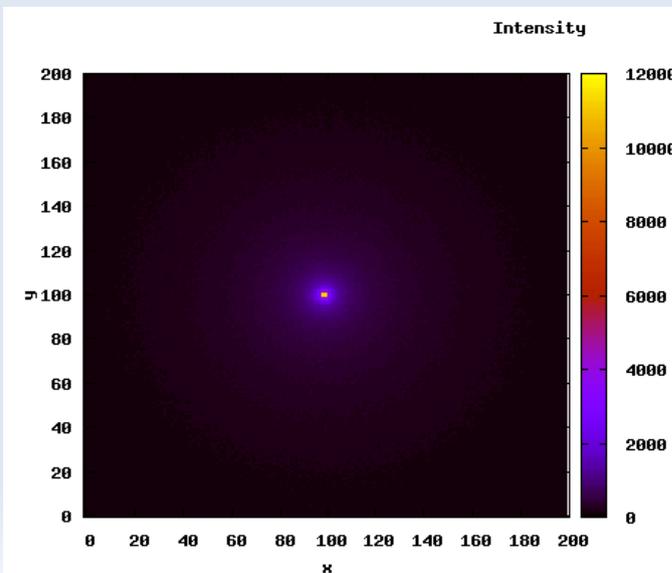


# Isotropic scattering: results

## Intensity against albedo

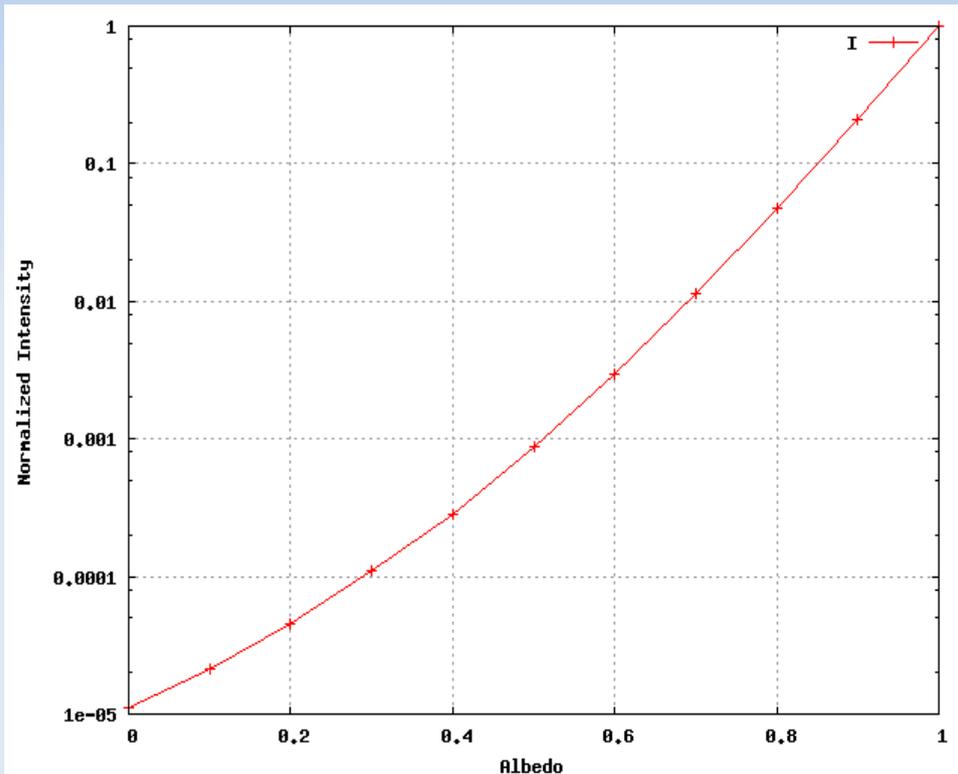


## Intensity against optical depth

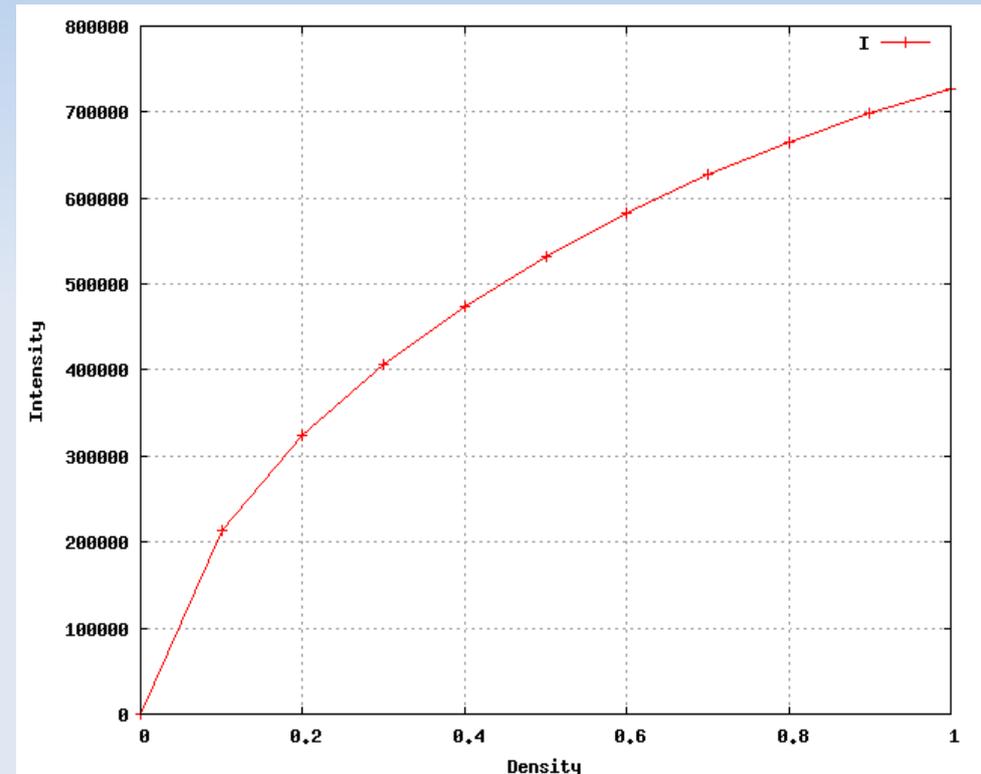


# Isotropic scattering: results

## 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 + Henyey-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

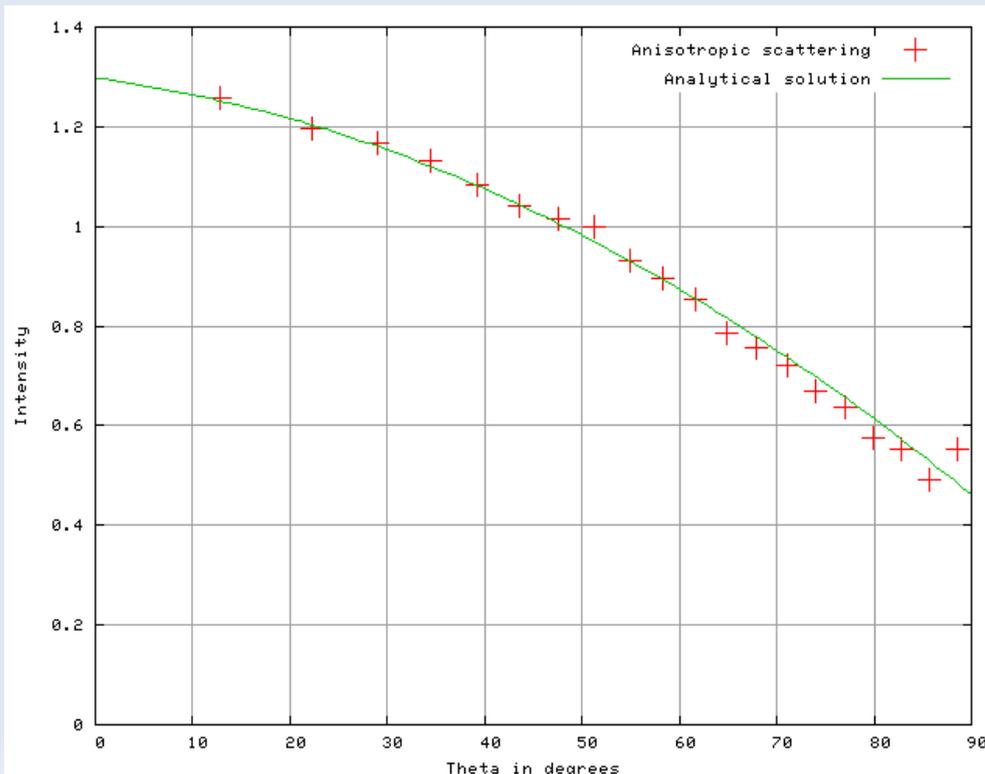
# Anisotropic scattering: validation

Additional anisotropic scattering parameters:

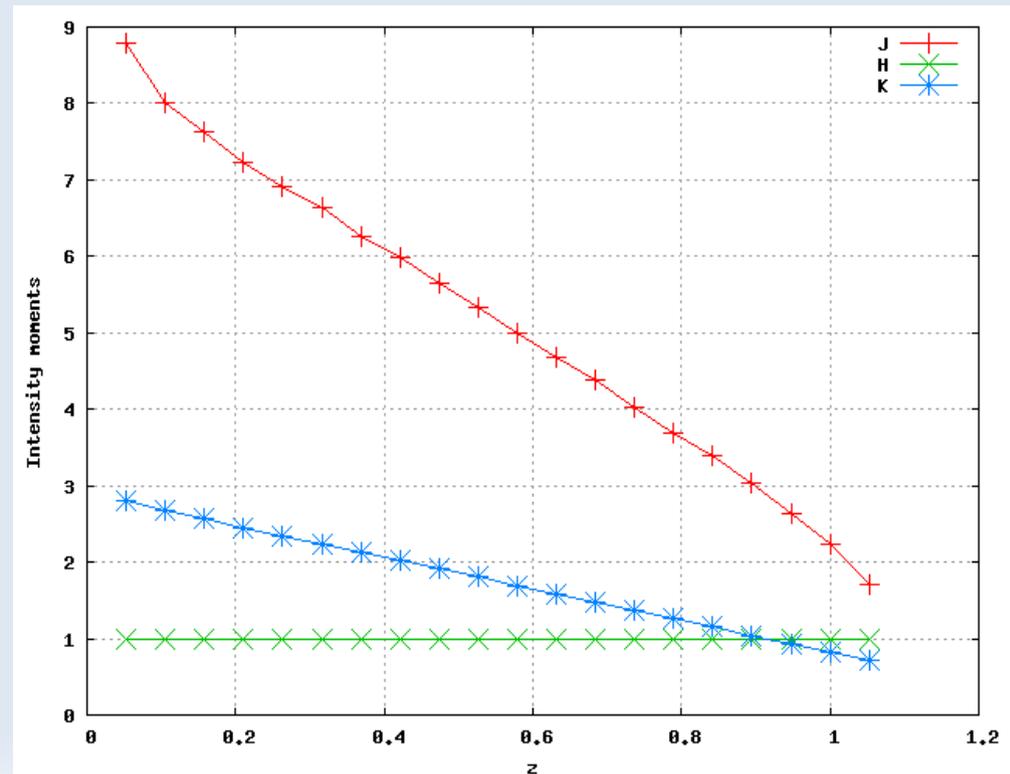
- **g**: scattering asymmetry parameter (0 = isotropic, 1 = forward-thriving)
- **pl**: peak linear polarization

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

## Intensity-cos( $\theta$ )

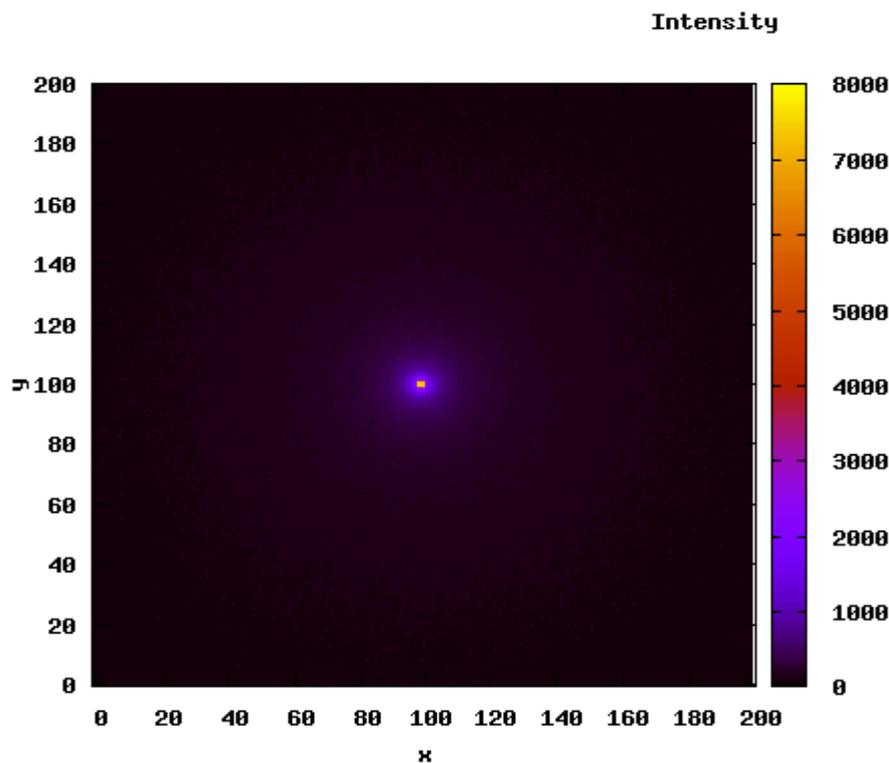


## Intensity moments



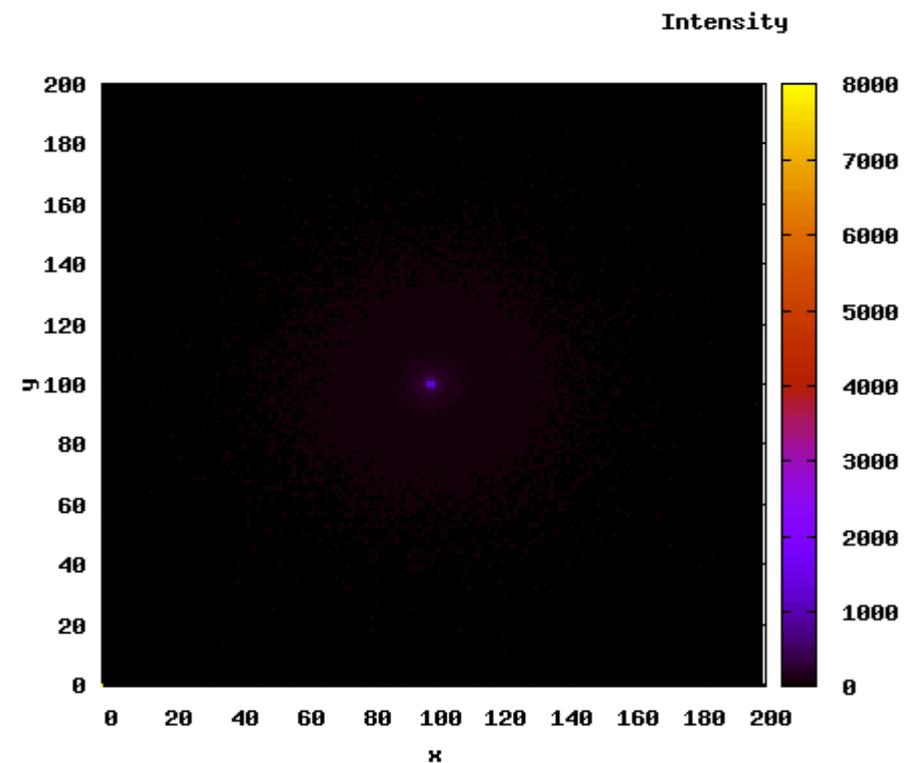
# Anisotropic scattering: results

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



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

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



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

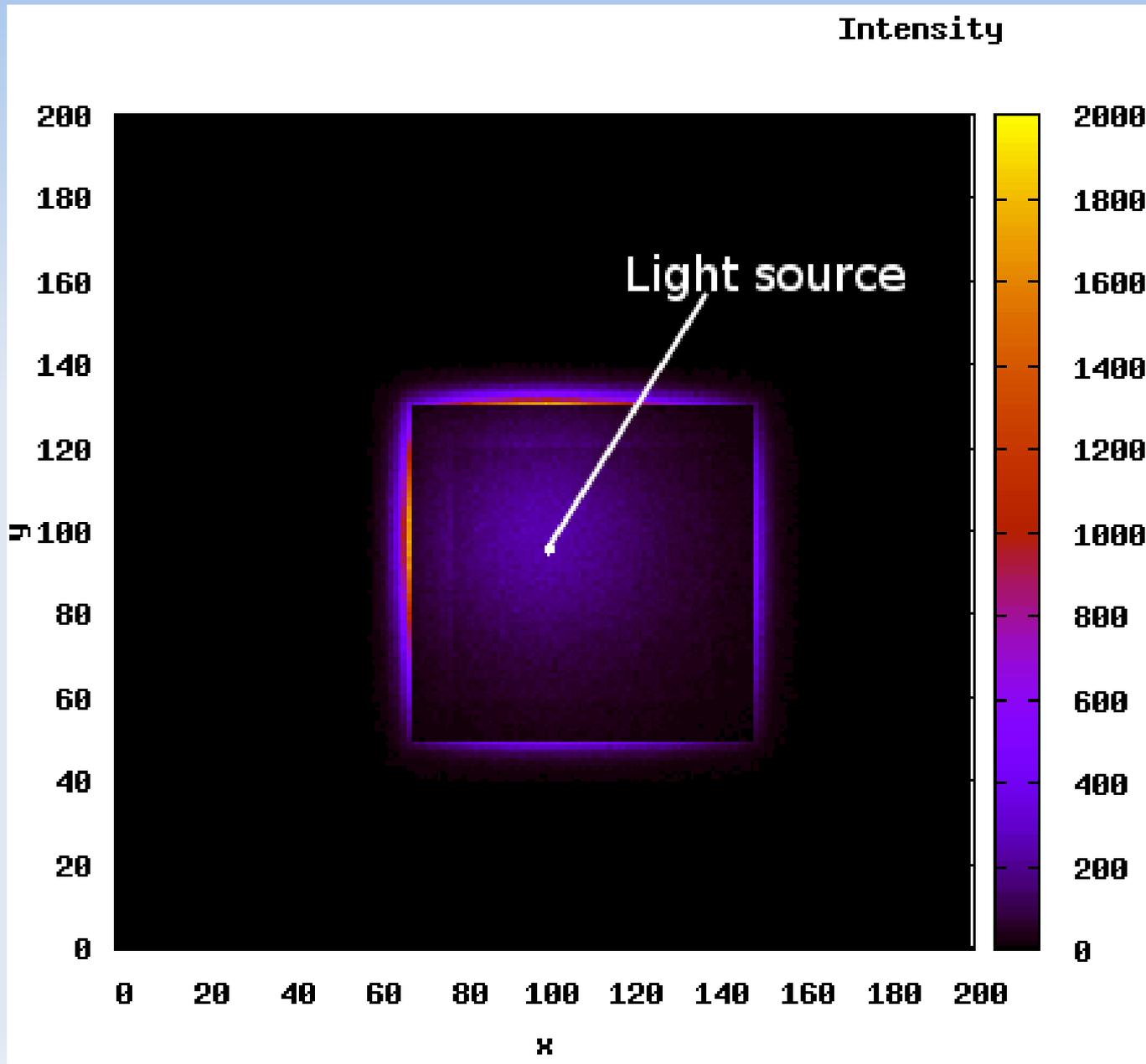
# 3D grid with dust scattering

- We build a 3D Cartesian grid to simulate inhomogeneous media
- Each point of the grid is associated to a a value of density  $\rho$  and opacity  $\kappa$
- 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

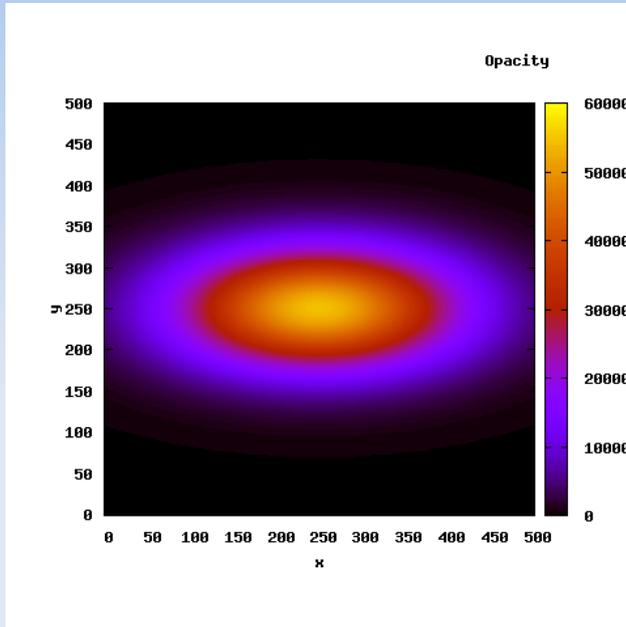
# 3D grid: a dust cube



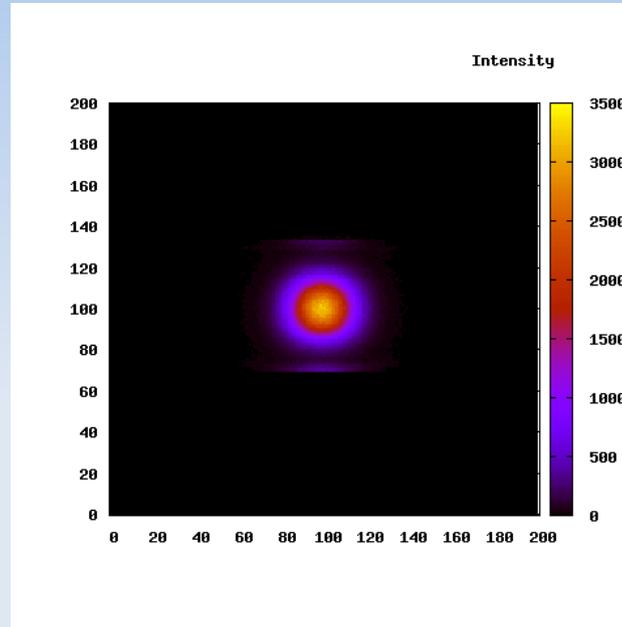
- Grid: 1.0x1.0x1.0 discretized to 200x200x200 points
- Dust cube: 10x10x10 grid points at position -7,7,100

# 3D grid: a dust spheroid

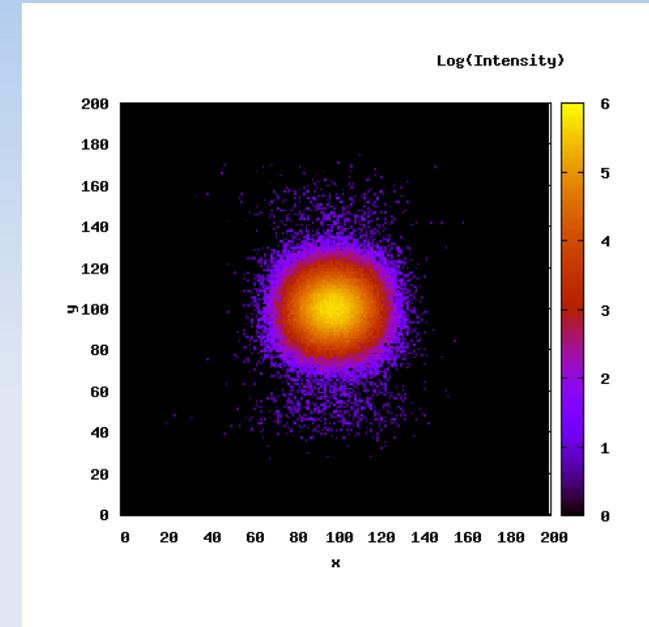
Opacity distribution



Intensity



Intensity (logarithmic scale)



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

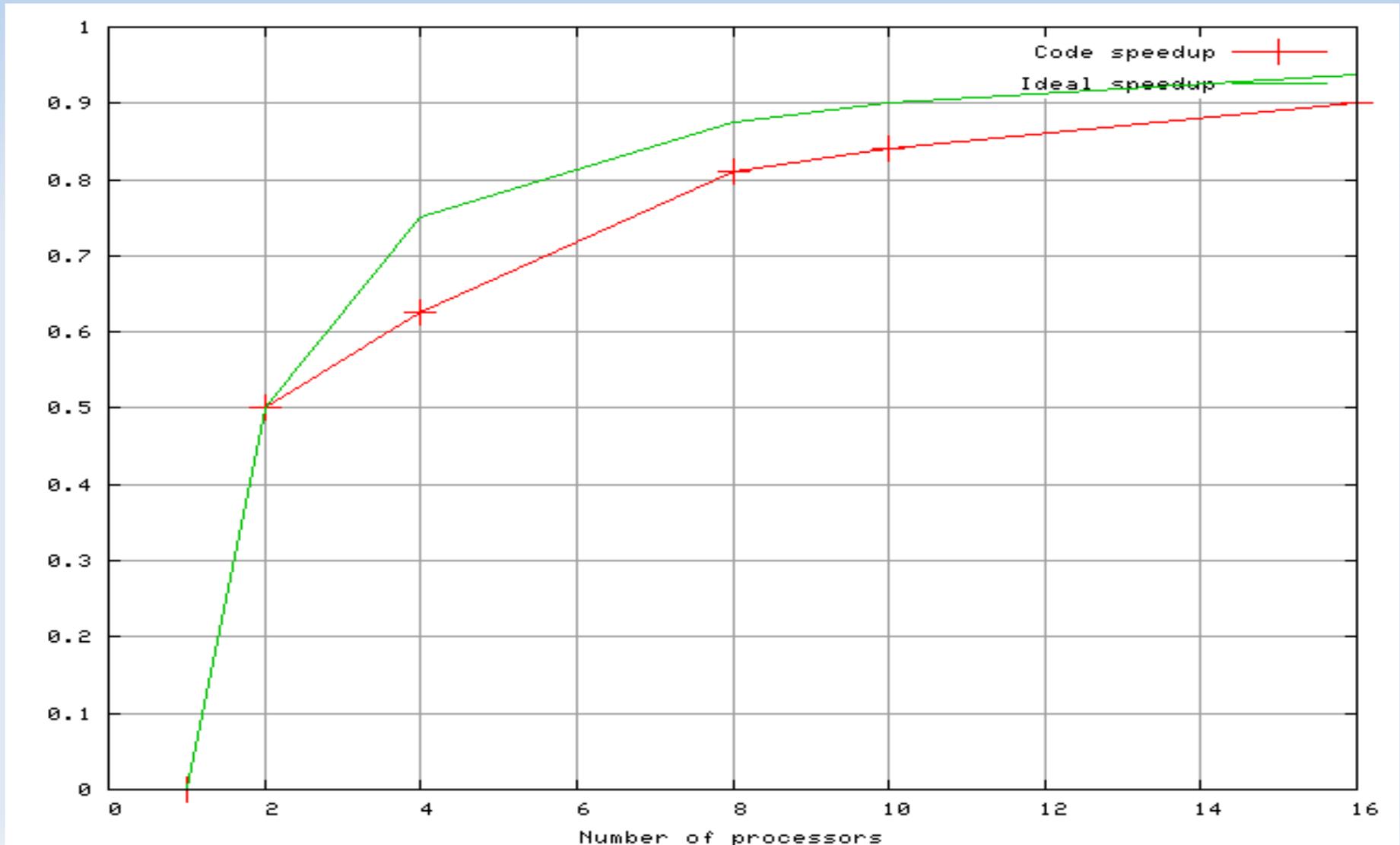
Spheroid opacity: 
$$k = e^{-2r_i/r}$$

# 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