

# Monte Carlo dust radiative transfer with SKIRT

Maarten Baes

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# **Belgium ???**











# The radiative transfer problem

The general radiative transfer problem describes the interaction between radiation and matter. It is a very general problem with applications in all sciences...



Generally described by the following equation (RTE)

# **Starlight and interstellar dust**

- dust is very efficient in absorbing and scattering UV/optical radiation
- re-emits thermal energy in the MIR, FIR and submm
- 30 to 50% of the starlight in the Universe is absorbed by dust !







Fritz et al. 2012

# A tough problem...

- 6D problem: 3 space + 2 direction + 1 wavelength dimension.
  100 grid points in every dimension implies 10<sup>12</sup> points...
- strongly non-linear problem
- non-local problem
  - in space: propagation of photons across the domain
  - in direction: scattering couples the intensity in all directions
  - in wavelength: absorption/re-emission changes wavelength
- often to be used to model observed data
  - problem of fitting data (i.e. optimization problem)
  - projection effects



### (Stellar Kinematics Including Radiative Transfer)



Baes et al. 2003, 2011

# **Monte Carlo radiative transfer**

- probabilistic simulation method (does not "solve" the radiative transfer equation)
- A large number of photon packages are followed **individually** through the dusty medium.
- The trajectory of each photon package is determined by (pseudo) random numbers.
- The radiation field is reconstructed by classifying the photon packages by position, propagation direction, wavelength...



# Weighted Monte Carlo RT

SKIRT is a weighted Monte Carlo code: contains many dirty/clever tricks to make the simulations more efficient. For example

- **biased emission**: preferentially shoot photons to interesting directions
- **forced scattering**: don't waste photons that leave the system without interacting
- peel-off technique: drastically increase the signal-to noise in observed images/ SEDs
- continuous absorption: absorb along the ray instead of at one single location
- polychromatism: shoot photon packages that contain photons at many different wavelengths



# **Non-equilibrium dust emission**

### **Different approaches possible**

 $\lambda F_{\lambda} [W m^{-2}]$ 



# **Adaptive grids**



Recently added octtree grid

- Geometric or barycentric subdivision
- Neighbor search to speed up calculation of photon paths

Goal: limit number of dust cells for complex models

- Face-on spiral galaxies
- Compact dust clumps
- Results from hydrodynamic simulations

Saftly et al. in prep

# **Inverse radiative transfer**

Model a particular real galaxy by fitting radiative transfer models to observational data (SED, images,...).

### **Major complications**

- Star-dust geometry: large number of parameters to be fitted
  - Intrinsic geometry
  - Orientation
  - **Dust properties**
- Run-time for a single simulation (i.e. a single point in the multi-dimensional parameter space) is considerable
- Memory requirements as well...
- Monte Carlo noise makes fitting more complicated

# V-band image V-band model

Baes et al. 2011 De Looze et al. 2012a



De Looze et al. 2012b

## **FitSKIRT**

Tool to fit parametric 3D models to a set of UV/optical/NIR images.

- couples the SKIRT radiative transfer code to a genetic algorithm optimization routine
- (almost) fully automated and unbiased

De Geyter et al. 2012, submitted

# **Realistic imaging of simulated galaxies**





Rahimi & Kawata 2012



Building an adaptive dust density grid from the heavily overlapping SPH gas particles requires special care to limit computation time (this galaxy has 410k star particles and 190k gas particles)

Major challenges for the future:

- Derive appropriate recipe to calculate dust distribution from the SPH gas properties (density, metallicity, temperature)
- Resolution effects !
- Parallellization...

# EAGLE

- Forthcoming large-scale cosmological hydrodynamic simulation
- includes stars, gas, dark matter, star formation, AGN and SN feedback,...
  → tens of thousands of simulated galaxies !!



- Objective: validate physical assumptions by comparing simulation results with the observable universe
- But: simulation provides information not always directly available to observers
- Solution: generate images from the simulation data, and analyze those with the same methods used by observers



If you are simulating dusty galaxies, AGNs, circumstellar discs, molecular clouds... and you want to know how these systems look at UV to submm wavelengths, come and talk to me.

Thanks to my collaborators...

Thank you for your attention !

