

Fracs : developing a versatile ray-tracer

Report on the project, what we have done and what we will do

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May 29, 2019

- 1 Introduction
- 2 The old version
- 3 A new tool
- 4 Conclusion

What this is all about ?

- First of all: this is not **real** radiative transfer (sorry ...)
- **Fracs** stands for “Fast Raytracing Algorithm for Circumstellar Structures”
- Once it was called **plastic** (it isn't real, it's in plastic) and Armando came up with that (better) name.
 - Are you geek enough to remember BSG :-) ?
- In short : it is a raytracing tool (we integrate the RT equation along rays and produce data cubes).

It is a reborn old project

- There is an old version (since 2011) : it still compiles, run and works ...
- We are working on a new version (started in 2015-2016, and “restarted” well, a few weeks ago ...
- I tried hard to came up with results from the fresh new version before this talk but We are almost there

An historical perspective ...

- Fracs is the name of a project that we started ages ago (Niccolini et al. 2011; Domiciano de Souza et al. 2011).
 - It was the evolution of a previous code `plastic` (started in 2008, according to the copyright notice in the code).
 - Many versions existed, even one running on GPUs.
- After a long pause, we plan for a revival of the project in 2015 or so, including new features and capabilities.
- I started coding again and some progress was done, but just for a short while.
- Here we are, ... in 2019, I'm coding again ! :-)

Today

- Ideally, I would have wanted to present the new tool (but it's not ready yet)
- I'll say a few words about the "old" version,
- and report on the progress of the project: what we are doing and planning to do.

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Nasty equation, how innocent you look ...

$$I_\lambda(\vec{r}, \hat{n}) = I_\lambda(\vec{r}_0, \hat{n}) e^{-\tau_\lambda(\vec{r}_0, \hat{n}, s)} + \int_0^s \eta_\lambda(\vec{r}_0 + s' \hat{n}, \hat{n}) e^{-\left(\tau_\lambda(\vec{r}_0, \hat{n}, s) - \tau_\lambda(\vec{r}_0, \hat{n}, s')\right)} ds'$$

$$\tau_\lambda(\vec{r}_0, \hat{n}, s) = \int_0^s \kappa_\lambda^{\text{ext}}(\vec{r}_0 + s' \hat{n}) ds' .$$

$$\eta_\lambda(\vec{r}, \hat{n}) = \kappa_\lambda^{\text{abs}}(\vec{r}) B_\lambda(T(\vec{r})) + \kappa_\lambda^{\text{sca}}(\vec{r}) \frac{1}{4\pi} \iint g_\lambda(\vec{r}, \hat{n}', \hat{n}) I_\lambda(\vec{r}, \hat{n}') d^2 \hat{n}' .$$

That's not all ...

- We integrate the RT equation for all pertinent rays (as you know the scattering term is not your friend)
- and then we solve for the Radiative Equilibrium (RE) condition

$$4\pi \int_0^{\infty} \kappa_{\lambda}^{\text{abs}}(\vec{r}) B_{\lambda}(T(\vec{r})) d\lambda = 4\pi \int_0^{\infty} \kappa_{\lambda}^{\text{abs}}(\vec{r}) J_{\lambda}(\vec{r}) d\lambda .$$

- From this, we can compute the temperature (for dust, electrons or whatever)
- the medium emissivity depends on the radiation, and the radiation is determined from the emissivity : we need to Λ -iterate.

Let's get a bit nostalgic ...

- A long time ago (but in this galaxy, not a far far away one ...), I was a Monte Carlo kind of guy :
 - I was in Nice and I developed *McTranCF* : a 2D radiative transfer code based on the Monte Carlo method (Niccolini et al. 2003) and then I got bored, so ...
 - I was in Madrid and I developed *Tapas* : a 3D RT code using the Monte Carlo algorithm (Niccolini & Alcolea 2006) and I got bored again ...
 - All this is under a huge amount of dust I'm afraid.
 - Oh boy, how I hated model fitting with such tools ...
 - It was not uncommon at the time to see people publishing χ^2 by eye type of results.

What do we need a tool such as Fracs for ?

- We want to determine **physical quantities** characterising environments (not necessarily “circumstellar”): densities, temperatures, dust grains, morphology, sizes ...
- You can use **self-consistent radiative transfer** tools to compute you favourite observable (e.g. H_{dust} from A. Carciofi, a Monte Carlo code is used in our lab)
- However, it is time consuming (a few 10^{th} of minutes to a few hours) and model fitting is a tricky business in such cases.
- You can also use **toy models**, which is ok but you cannot get deep into the physics of you object.

A simpler approach

- So, I entered Armando and Philippe’s office and proposed : “Bon les mecs, on va faire des trucs simples ...” (nothing is simple).
- We focused on efficiency.

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Physical assumptions

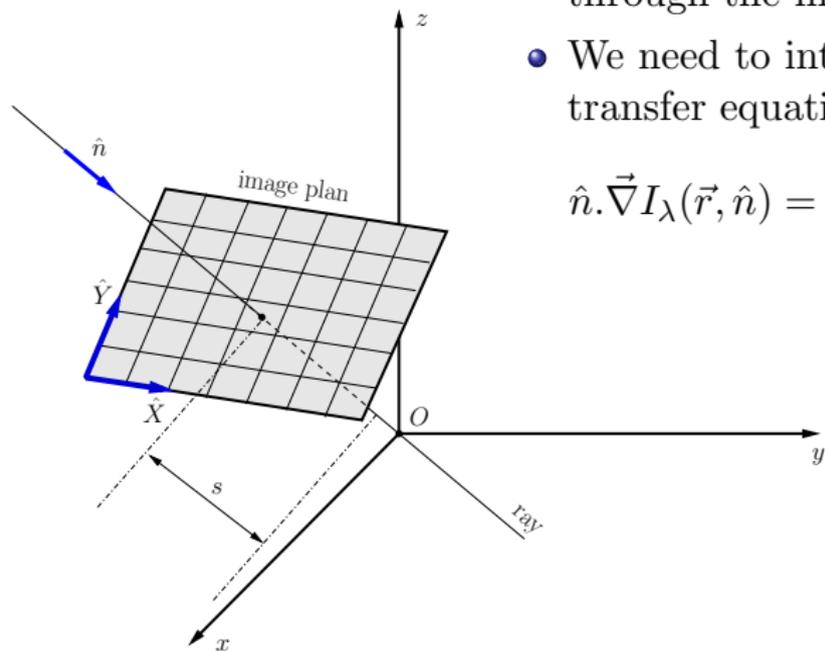
- We neglect the nasty scattering term in the RT equation.
- We do not compute the temperature structure but we prescribed it (basically, we have removed what make the transfer difficult).
- Since we were interested in a disc configuration, we assumed axisymmetry.
- Then, we integrate the RT equation (**ray-tracing**) along each rays (long characteristic) and we're done.
- Well, more or less ...

Numerical aspects

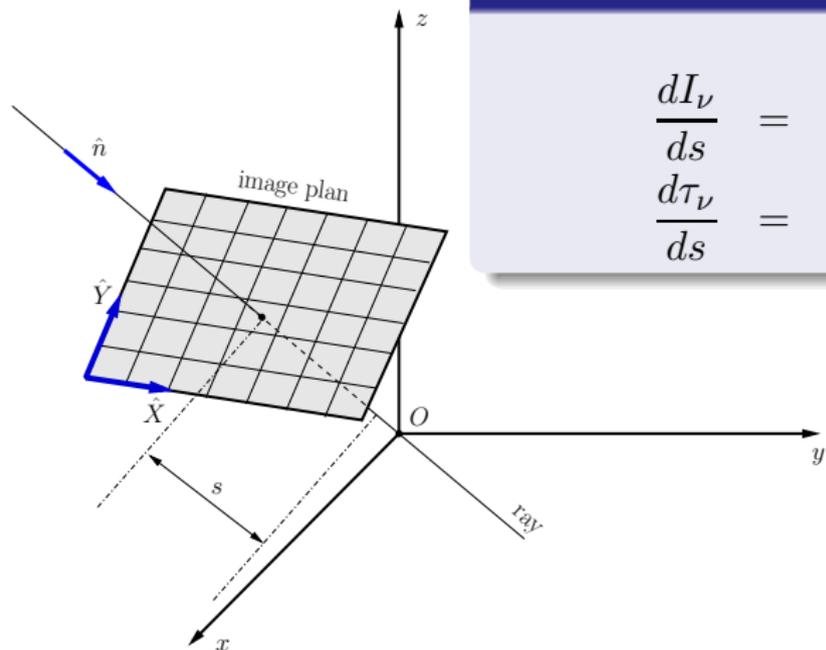
- A quadtree mesh
- Using left/right obvious symmetry.
- Not so obvious symmetry : from the upper part of the image, you can also obtain the lower part reconstructing one integral from the other \rightarrow computing time is reduced by ~ 4 .
- It's fast enough for model fitting : a few 10^{th} os second for an image at one wavelength.
- The main ingredient is the quadtree mesh and the point location algorithm (optimizing it you'll get faster)

- For each pixel we consider a ray going through the medium
- We need to integrate the radiative transfer equation along each ray

$$\hat{n} \cdot \vec{\nabla} I_\lambda(\vec{r}, \hat{n}) = -\kappa_\lambda I_\lambda(\vec{r}, \hat{n}) + \eta_\lambda(\vec{r}, \hat{n}) .$$

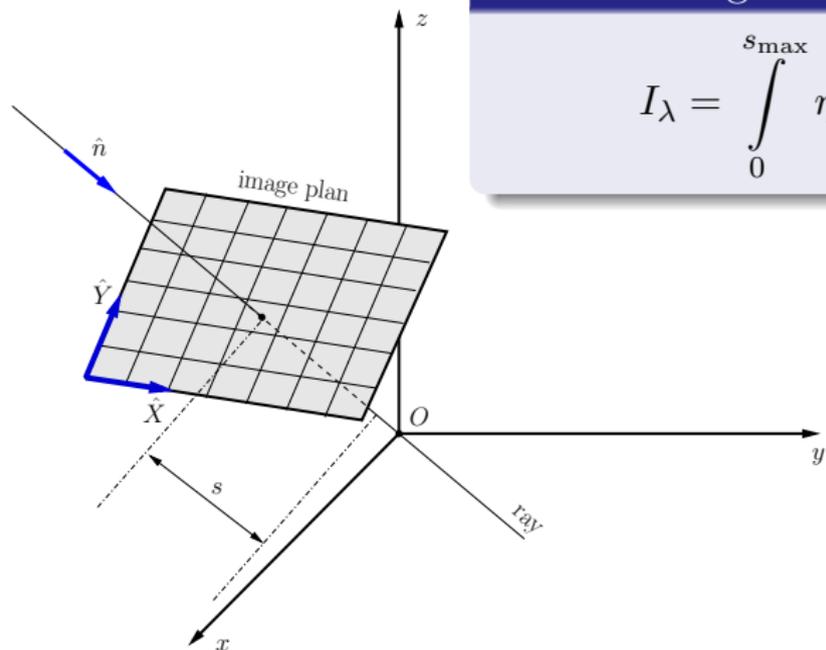


Raytracing



We can treat the RT eq. as an ODE:

$$\frac{dI_\nu}{ds} = \eta_\nu(\vec{r}_s) e^{-\tau_\nu(s)} ,$$
$$\frac{d\tau_\nu}{ds} = \kappa_\nu(\vec{r}_s) .$$



or as an integral

$$I_{\lambda} = \int_0^{s_{\max}} \eta_{\lambda}(s) e^{-\tau_{\lambda}(s)} ds .$$

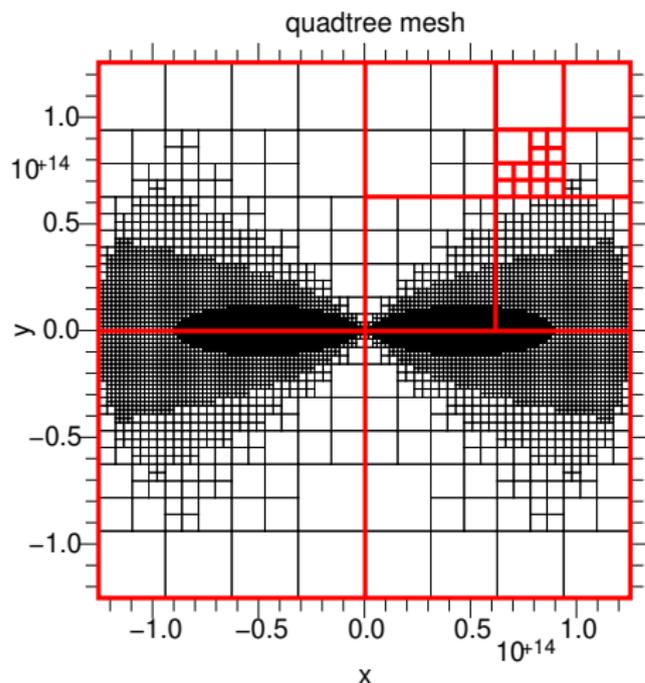
Quadtree mesh

- You put the computation effort where needed:
 - you save time,
 - you save memory.
- We used a quadtree mesh (see [Kurosawa & Hillier 2001](#), for a [description](#)) with cylindrical coordinates.
- Similar to [Barnes & Hut \(1986\)](#) tree code use in many body problem.
- We divide recursively each cell in four child cells until e.g.

$$\frac{\iiint_{V_\xi} [\kappa_\lambda(\vec{r})] d^3\vec{r}}{\iiint_{V_{\text{tot}}} [\kappa_\lambda(\vec{r})] d^3\vec{r}} < \eta . \quad (1)$$

- N.B: This type of criterion is used in the literature but it is not the best one I think (I'll get back to this latter).

Quadtree mesh



N.B. the cells are **tori**.

- This is a rough grid ($\eta \sim 10^{-3}$) to avoid representation problems
- Monte Carlo volume integration
- Uninteresting comment : coding this type of mesh is actually fun

Example: the wind model of a B[e] star

- The density is described as

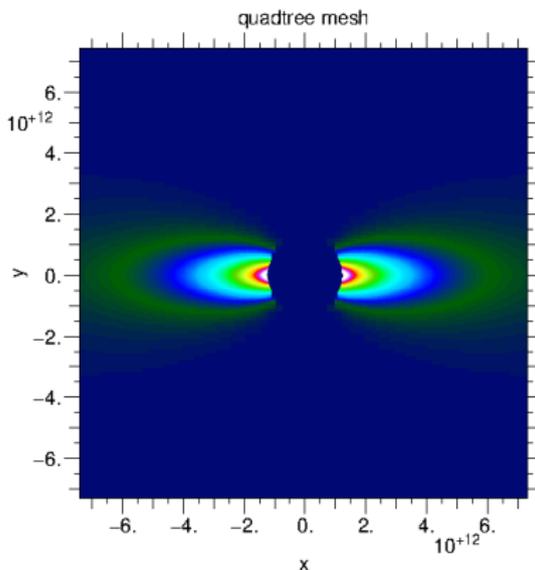
$$n(r, \theta) = n_{\text{in}} \left(\frac{R_{\text{in}}}{r} \right)^2 \frac{1 + A_2}{1 + A_1} \frac{1 + A_1 (\sin \theta)^m}{1 + A_2 (\sin \theta)^m},$$

- Dust grain opacities are computed from the Mie theory
- Dust temperature is parameterised by

$$T(r) = T_{\text{in}} \left(\frac{R_{\text{in}}}{r} \right)^\gamma.$$

- Emission from the central source

$$I_\lambda^{\text{s}} = I_{\lambda_0}^{\text{s}} \left(\frac{\lambda_0}{\lambda} \right)^\alpha.$$



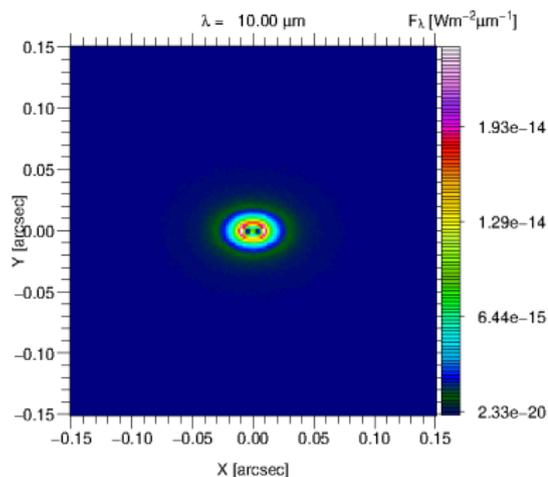
Model vs model

Parameters	Values	Unit
A_1	150	-
A_2	-0.8	-
R_{in}	30	R_s
n_{in}	0.015/0.15	m^{-3}
T_{in}	1500	K
γ	0.75	-
$I_{\lambda_0}^s$	6500	$W m^{-2} \mu m^{-1} str^{-1}$
α	3	-
PA_d	125	deg
i	20/50/90	deg
a_{min}	0.5	μm
a_{max}	50	μm
β	-3.5	-

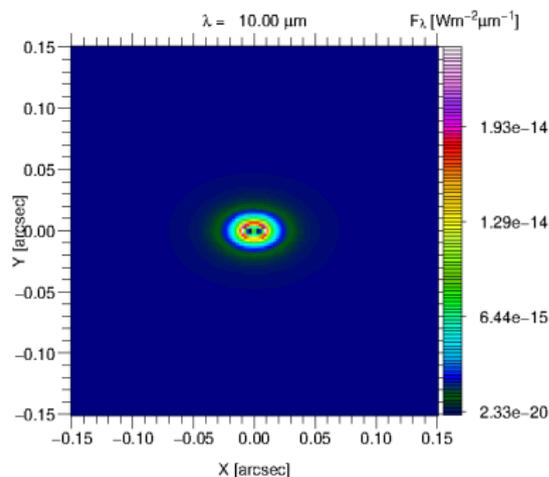
- 10 free parameters
- red : better than 10 %,
- blue : 10 to 25 %,
- green : larger than 25 %, less than 100 %,
- gray : larger than 100 %.

Comparison with a Monte Carlo code

Monte Carlo code vs ray-tracer (unfair comparison !)



Monte Carlo (Tapas, ~ 3 hours)



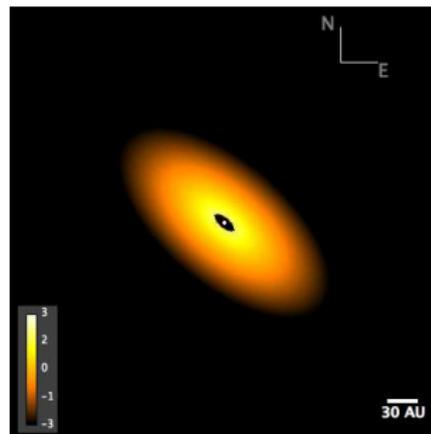
Ray-tracer (Fracs, ~ 0.2 s)

Example: B[e] star CPD-57 2874

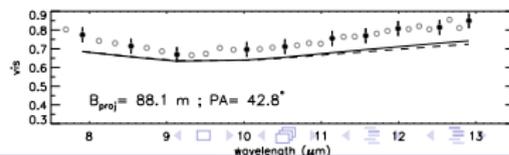
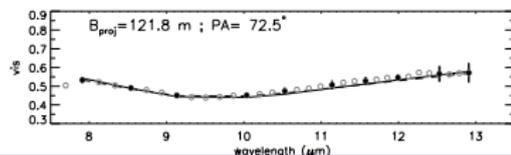
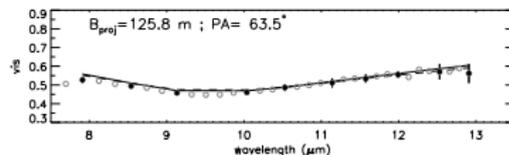
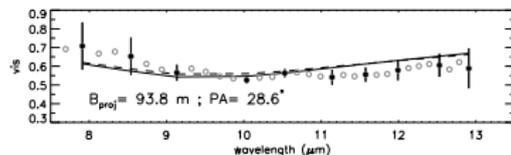
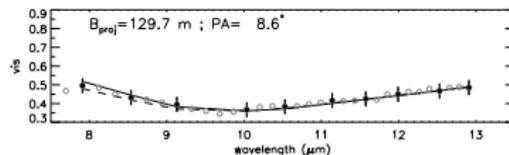
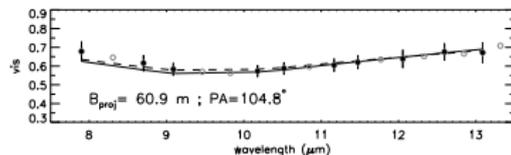
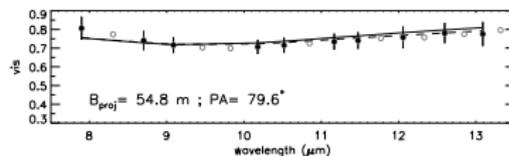
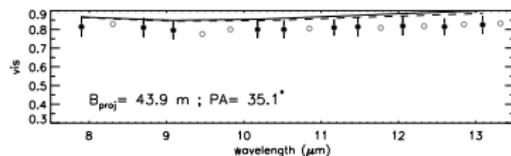
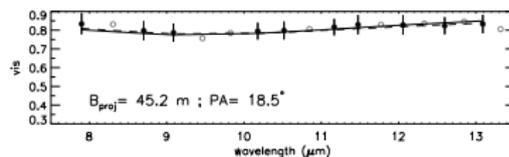
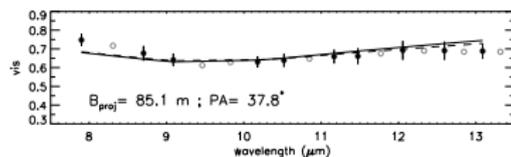
Domiciano de Souza et al. (2011)

$$n(r, \theta) = \begin{cases} n_{\text{in}} \left(\frac{R_{\text{in}}}{r} \right)^2 & ; 90^\circ - 0.5\Delta\theta_d \leq \theta \leq 90^\circ + 0.5\Delta\theta_d \\ 0 & ; \theta < 90^\circ - 0.5\Delta\theta_d \text{ and } \theta > 90^\circ + 0.5\Delta\theta_d \end{cases}$$

Adopted distance	$d = 1.7$ kpc		$d = 2.5$ kpc	
Model parameters	value	error	value	error
$I_{\lambda_0}^s$	2.1	$+0.1$ -0.1	4.2	$+0.1$ -0.1
α	2.4	$+0.2$ -0.2	2.4	$+0.2$ -0.2
γ	0.92	$+0.07$ -0.07	0.85	$+0.05$ -0.05
R_{in} (AU)	11.0	$+2.0$ -2.0	13.9	$+2.4$ -2.4
i ($^\circ$)	60.5	$+1.5$ -1.5	59.3	$+1.5$ -1.5
PA_d ($^\circ$)	139.8	$+1.0$ -1.0	139.3	$+1.0$ -1.0
n_{in} (m^{-3})	0.09	$+0.06$ -0.06	0.11	$+0.07$ -0.07
$\Delta\theta_d$ ($^\circ$)	7.5	$+4.4$ -4.4	5.9	$+4.4$ -4.4



VLTI/MIDI visibilities



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Why we decided to write a new version

- New 3D mesh with neighbour search and more efficient tree traversal.
- free-free and bound-free continuum opacities
- line emission
- New integrator
- It should be flexible (adding new kind of features or new physics must be simple)
- MATISSE data are here !
- The program should be controlled from python
 - This will simplify post-processing (no need to communicate via config files)
 - We want to use [emcee](#), the Markov chain Monte Carlo python package ([Foreman-Mackey et al. 2013](#)).
 - [boost::python](#) to the rescue.

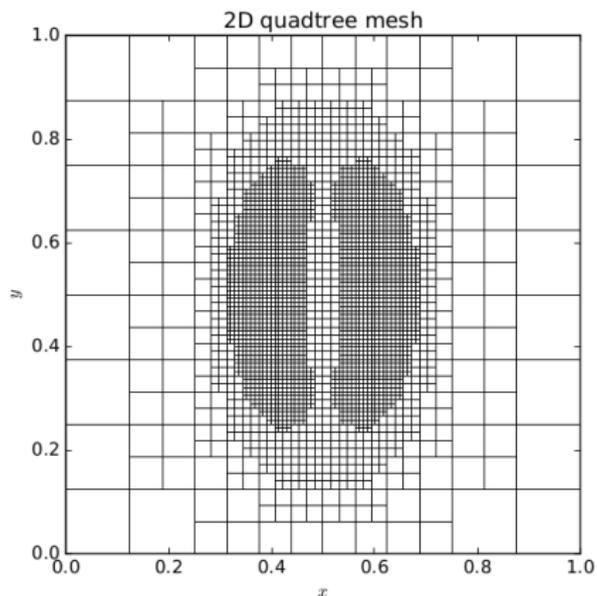
A new mesh implementation

Features

- The algorithm is described in [Frissen & Perry \(2002\)](#)
- Arbitrary number of dimensions (we use octrees)
- The algorithm uses binary locational codes (represent the position of the lower vertices)
- The tree is traversed following these codes.
- It allows a very efficient way to determine cell neighbours
- I fully implemented the mesh, as well as related tools (builder, smoother, writer, etc ...)

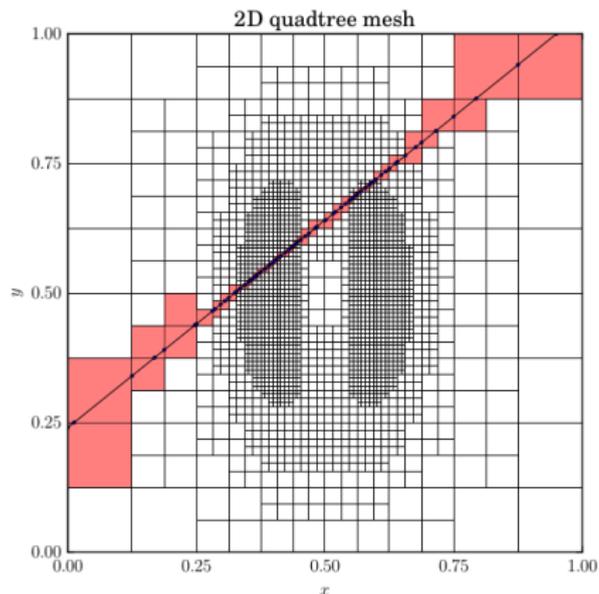
A new mesh implementation

Example : a quadtree refined on the **gradient** of a Gaussian + smoothing.



A new mesh implementation

Raytracer : give it a point \vec{r} to start from and a direction \hat{n} and it'll do its job.

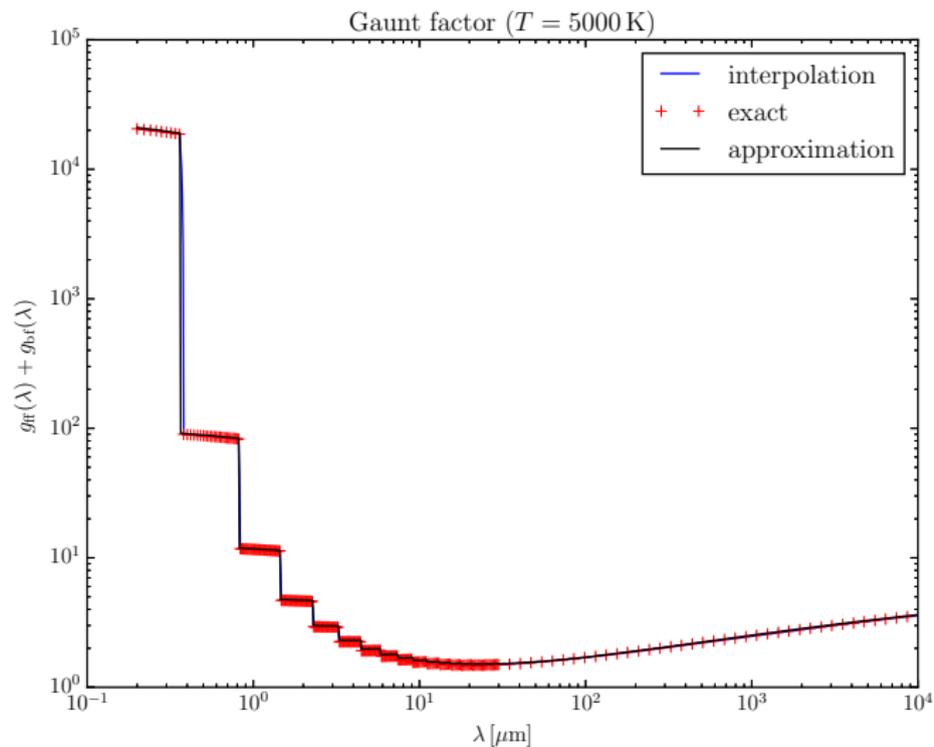


- Dust opacities are already implemented (using the Mie theory).
- Free-free and bound-free absorption coefficients

$$\kappa_{\text{ff+bf}}(\lambda, T) = \frac{4e^6}{3m_e^2 hc (4\pi\epsilon_0)^3} \left(\frac{2\pi m_e}{3k} \right)^{\frac{1}{2}} \frac{Z^2 n_e n_i}{T^{\frac{1}{2}}} \left(\frac{\lambda}{c} \right)^3 \left(1 - e^{-\frac{hc}{\lambda k T}} \right) (g_{\text{ff}}(\lambda, T) + g_{\text{bf}}^{\text{tot}}(\lambda, T))$$

- The nasty and tricky part is the computation of the Gaunt factors (see Armando for more details).
- A paper has been recently submitted using these opacities in a specific raytracer ([V. Hocuk et al.](#) on Cepheids).
- The code already exists in python (the equivalent code in c++ is on the way)

Continuum opacities



If we assume

$$\kappa_\nu(s) \approx \kappa_\nu^i + \frac{\kappa_\nu^{i+1} - \kappa_\nu^i}{\Delta s_i} (s - s_i)$$

$$S_\nu(s) \approx S_\nu^i \left(\frac{S_\nu^{i+1}}{S_\nu^i} \right)^{\frac{s-s_i}{\Delta s_i}}$$

The optical depth is then quadratic

$$\Delta\tau_\nu(s) \approx \kappa_\nu^i (s - s_i) + \frac{1}{2} \frac{\Delta\kappa_\nu^i}{\Delta s_i} (s - s_i)^2,$$

The integral for the intensity in one cell is given by

$$\Delta I_{\lambda}^i = S_{\lambda}^i e^{-\tau_{\lambda}^i} \int_0^{\Delta s_i} \left[\kappa_{\lambda}^i + \frac{\Delta \kappa_{\lambda}^i}{\Delta s_i} s \right] e^{\left[\frac{1}{\Delta s_i} \ln \left(\frac{S_{\lambda}^{i+1}}{S_{\lambda}^i} \right) - \kappa_{\lambda}^i \right] s - \frac{1}{2} \frac{\Delta \kappa_{\lambda}^i}{\Delta s_i} s^2} ds .$$

Remembering that we want to compute

$$I_{\lambda} = \int_0^{s_{\max}} \kappa_{\lambda}(s) S_{\lambda}(s) e^{-\tau_{\lambda}(s)} ds .$$

It can be simplified in

$$\Delta I_{\nu}^i \approx S_{\nu}^i e^{-\tau_{\nu}^i} \int_0^{\Delta s_i} \left[\kappa_{\nu}^i + \frac{\Delta \kappa_{\nu}^i}{\Delta s_i} s \right] e^{\left[\frac{1}{\Delta s_i} \ln \left(\frac{S_{\nu}^{i+1}}{S_{\nu}^i} \right) - \bar{\kappa}_{\nu}^i \right] s} ds ,$$

with

$$\bar{\kappa}_{\nu}^i = \frac{\kappa_{\nu}^{i+1} + 2 \kappa_{\nu}^i}{3} .$$

up to $O(\Delta s_i^4)$ terms. This integral can be done analytically (similar trick in [Woitke et al. \(2009\)](#) but not of the highest order)

The basics

- A spectral line is characterised by the absorption coefficient and its emissivity:

$$\kappa_\nu = n_l \sigma_{ul} \Phi_{ul}(\nu)$$

$$\eta_\nu = \kappa_\nu B_\nu(T_{\text{ex}}) .$$

- The cross section (corrected for stimulated emission) σ_{ul} is given by:

$$\sigma_{ul} = \frac{c^2 A_{ul}}{8\pi\nu_{ul}^2} \frac{g_u}{g_l} \left(1 - e^{-\frac{h\nu_{ul}}{kT_{\text{ex}}}} \right) ,$$

where A_{ul} is the *Einstein* coefficient for spontaneous emission.

Line profile

- The line profile $\Phi_{ul}(\nu)$ describing Doppler broadening due to thermal motion and microturbulence is

$$\Phi_{ul}(\nu) = \frac{c}{\sqrt{\pi} b \nu_{ul}} e^{-\frac{1}{b^2} \left[\frac{c}{\nu_{ul}} (\nu_{ul} - \nu) - \vec{v} \cdot \hat{n} \right]^2}$$
$$b^2 = \frac{2kT_{\text{kin}}}{m_{\text{mol}}} + v_{\text{turb}}^2 .$$

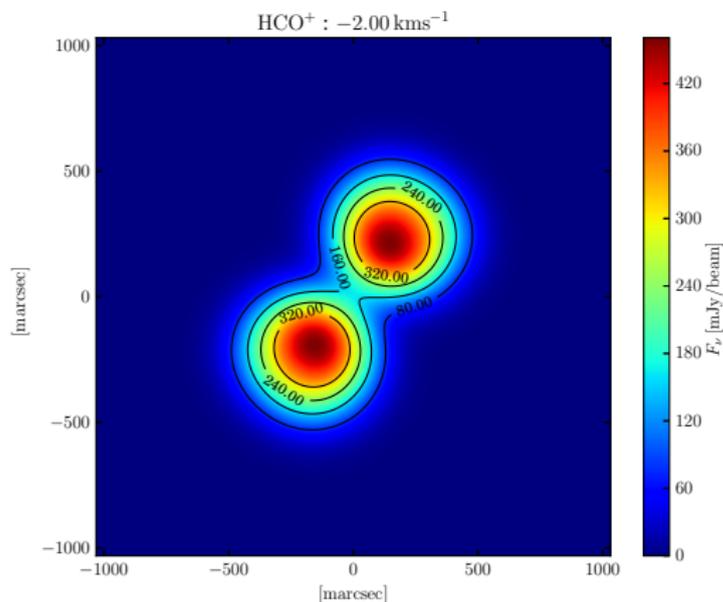
- That stuff is just the *Maxwellian* distribution in disguise.
- $\frac{c}{\nu_{ul}} (\nu_{ul} - \nu)$ is the velocity at which we observe.
- $\vec{v} \cdot \hat{n}$ is the projection of the macroscopic velocity of the gas along the line of sight.

- When we integrate, ν (or the velocity of observation) is fixed and we integrate in space.
- Remember: $\Phi_{ul}(\nu) = \frac{c}{\sqrt{\pi} b \nu_{ul}} e^{-\frac{1}{b^2} \left[\frac{c}{\nu_{ul}} (\nu_{ul} - \nu) - \vec{v} \cdot \hat{n} \right]^2}$
- And $\vec{v} = \vec{v}(s)$, s being the distance along the ray.
- The size is roughly :

$$\Delta s \approx \frac{b}{\left| \hat{n} \cdot \frac{d\vec{v}}{ds}(s) \right|}.$$

Example : IRAS 15103-5754

A specific raytracer for lines (written in python)



- Water-fountain observed with ALMA
- Emission of a toroidal structure
- Gómez et al. (see 2018)

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Let's recap ...

- **Frac**s is a raytracer.
- Project started in 2008
- Reborn (prematurely) in 2015 (mesh, raytracer).
- Complete rewrite
- Now working on continuum opacities (including gas)
- I expect to have a working version “quite soon” (at least for the continuum) ...
- Post-processing is on the way as well.
- For the lines, I expect to work again on water fountains with my IAA colleagues. It is a good playground.

For further reading . . .

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