

# Single-voxel debugging

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## 1 Single-voxel setup

Here we will examine the current setup of the calculations of `kosmat3d`. These will give a basis on how the probabilistic calculation works for a single voxel, and what assumptions are present when using the single-voxel model. The observed intensity is calculated from the radiative transfer equation,

$$dI_\nu = -I_\nu \kappa_\nu ds + \epsilon_\nu ds,$$

we can assume  $\kappa$  and  $\epsilon$  (the absorption and emissivity coefficients, respectively) are constant in the voxel. Therefore they are calculated using the voxel-averaged emission:

$$\epsilon_\nu(v_{obs}) = \lim_{\Delta s \rightarrow 0} \left( \frac{\langle I_\nu \rangle_{vox}(v_{obs})}{\Delta s} \right),$$
$$\kappa_\nu(v_{obs}) = \lim_{\Delta s \rightarrow 0} \left( \frac{\langle \tau_\nu \rangle_{vox}(v_{obs})}{\Delta s} \right),$$

where  $\Delta s$  is the size of the voxel, and  $\langle \dots \rangle_{vox}$  indicates a property averaged over the voxel. In order to properly understand these voxel-averaged values, it is necessary to have some insight for what is happening inside the voxel. The clumpy PDR is approximated by an ensemble of spherically-symmetric KOSMA- $\tau$  'clumps'. The number of clumps with a particular mass ( $N_j$ ) follows the clump mass distribution:

$$\frac{dN}{dM} = \mathcal{A} M^{-\alpha}.$$

Here we adopt  $\alpha = 1.84$  from Heithausen et al. (1998), and  $\mathcal{A}$  is a constant. Henceforth the subscript  $j$  will refer to a property specific for clumps with mass  $M_j$ .

The ensemble of clumps has a normal velocity distribution centered at  $v_{vox}$  with dispersion  $\sigma_{ens,j}$ , which determines the velocity  $v_{j,i}$  of clump  $j$  in the ensemble. We use an internal velocity grid  $v_{j,i} \in [v_{vox} - 3\sigma_{ens,j}, v_{vox} + 3\sigma_{ens,j}]$  to model the clumps in the ensemble, and any quantity that depends on this internal velocity will also have this subscript  $i$ . Each clump also has an intrinsic velocity dispersion  $\sigma_{cl,j}$  (this value depends on which underlying KOSMA- $\tau$  grid is used, but currently it is  $\sim 0.71 \frac{km}{s}$  for all clump sizes). Now the number of clumps with a particular radial velocity  $v_{j,i}$  is determined by the number of clumps of a particular mass  $N_j$  and velocity distribution of the ensemble  $\sigma_{ens,j}$ .

$$\Delta N_{j,i} = \frac{N_j}{\sqrt{2\pi}\sigma_{ens,j}} \exp\left(-\frac{(v_{vox} - v_{j,i})^2}{2\sigma_{ens,j}^2}\right) \Delta v_j,$$

where  $\Delta v$  is the step size in  $v_{j,i}$  ( $\Delta v_j \equiv v_{j,i+1} - v_{j,i}$ ). This step size is necessarily smaller than  $\sigma_{cl,j}$  to ensure the velocity distribution is adequately sampled in the ensemble. (ie. One should not be able to see the contributions of different internal velocities in the emission). The probability  $p_{j,i}$  of having  $k_{j,i}$  clumps in a line-of-sight observed at velocity  $v_i$  is determined by Binomial distribution of the number of clumps at that velocity:

$$p_{j,i} = \binom{N_{j,i}}{k_{j,i}} p_j^{k_{j,i}} (1 - p_j)^{N_{j,i} - k_{j,i}},$$

where  $p_j$  is equivalent to the area-filling factor of clump  $j$  ( $p_j = \frac{\pi R_j^2}{\Delta s^2}$ ). If  $p_j N_{j,i} > 5$ , then a gaussian expression is used with  $\mu_{j,i} = p_j N_{j,i}$  and  $\sigma_{j,i} = \sqrt{N_{j,i} p_j (1 - p_j)}$ .

For having  $k_{j,i}$  clumps in a line-of-sight, the intensity and optical depth ( $I_{\nu,j,i}$  &  $\tau_{\nu,j,i}$ ) can be calculated. Here the subscript  $\nu$  means the properties refer to a particular transition (which is what we obtain from the KOSMA- $\tau$  grid).

$$I_{\nu,j,i}(v_{obs}) = k_{j,i} I_{cl,j} \exp\left(-\frac{(v_i - v_{obs})^2}{2\sigma_{cl,j}^2}\right),$$

$$\tau_{\nu,j,i}(v_{obs}) = k_{j,i} \tau_{cl,j} \exp\left(-\frac{(v_i - v_{obs})^2}{2\sigma_{cl,j}^2}\right),$$

where the factor  $\exp(-\frac{(v_i - v_{obs})^2}{2\sigma_{cl,j}^2})$  accounts for the contribution of the clumps with radial velocity  $v_i$  at observing velocity  $v_{obs}$ . Finally the intensity and optical depth can be averaged over the voxel using all possible combinations and their corresponding probabilities to determine voxel properties we require.

$$\langle I_{\nu} \rangle_{vox}(v_{obs}) = \sum_i \left[ \left( \prod_j p_{j,i}(k_{j,i}) \right) \left( \sum_j I_{\nu,j,i}(v_{obs}) \right) \right],$$

$$\langle \tau_{\nu} \rangle_{vox}(v_{obs}) = -\ln \left\{ \sum_i \left[ \left( \prod_j p_{j,i}(k_{j,i}) \right) \exp\left(-\sum_j \tau_{\nu,j,i}(v_{obs})\right) \right] \right\}.$$

Here the sums and products ensure we consider contributions from all clump masses at all radial velocities, since there is a velocity dispersion to each clump's intensity and optical depth. Now we can finally substitute these into the radiative transfer equation to determine the intensity we expect to observe from this voxel, accounting for any background intensity  $I_{bg,\nu}$ :

$$I_{vox,\nu}(v_{obs}) = \frac{\epsilon_{\nu}(v_{obs})}{\kappa_{\nu}(v_{obs})} \left( 1 - e^{-\kappa_{\nu}(v_{obs}) \Delta s} \right) + I_{bg,\nu} e^{-\kappa_{\nu}(v_{obs}) \Delta s}.$$

## 2 Calculation error

There is clearly some issue with the single voxel calculation, since there is an absorption feature that should not be present. Perhaps this was noticed initially when setting up the single-voxel model, but at the time it was dismissed due to the nonphysical model parameters (a volume filling factor  $f_V > 1$ ). Yoko has explored more of the parameter space to compare with observations, though, and encountered this problem again. In this use-case, an over-filled voxel is used to compare to various lines-of-sight. This makes enough sense as the clumps overflow behind the voxel. I now need to revise my intensity calculations not only to correct this absorption feature, but to ensure that the previous calculations (without this error) also agree.

For a densely-filled voxel, there could exist a saturation plateau in the intensity profile  $I(v_{obs})$ , however the error is that there still exists some additional absorption. Due to the calculation of the voxel intensity (see §1), there are two separate modes of calculation: standard and normalised. The standard calculation of the intensity uses the clump numbers calculated using  $\Delta N_{j,i}$ , while the normalised calculation resizes the voxel to ensure a given number of the largest clump are included in the voxel (typically 1 for the dense clumpy ISM). There is also part of the code which resizes the voxel if it is too small to fit the largest clump. It is the combination of these two features that make debugging this error more difficult. For that reason, I will debug these calculation methods separately. What follows in this section and the next are just for voxels normalised to have 1 of the largest clump in the ensemble. The un-normalised comparison will follow in a later version of this document.

### 2.1 The correction

The issue identified thus-far is that the probabilistic description has been applied to the averaged *intensity* rather than the *emissivity*, and therefore there exists some excess absorption in the plateau region. The proposed fix for this is to modify the equation for  $I_{\nu,j,i}(v_{obs})$  to calculate instead  $\epsilon_{\nu,j,i}(v_{obs})$ :

$$\epsilon_{\nu,j,i}(v_{obs}) = \frac{k_{j,i} I_{\nu,j} \tau_{\nu,j}}{[1 - \exp(-\tau_{\nu,j})]} \frac{\pi R_{cl,j}^2}{V_j} \exp\left(\frac{(v_i - v_{obs})^2}{2\sigma_{cl,j}^2}\right).$$

This leads to a voxel-averaged emissivity of,

$$\langle \epsilon_{\nu} \rangle_{vox}(v_{obs}) = \sum_i \left[ \left( \prod_j p_{j,i}(k_{j,i}) \right) \left( \sum_j \epsilon_{\nu,j,i}(v_{obs}) \right) \right].$$

The corresponding modification for the optical depth in terms of opacity is,

$$\langle \kappa_{\nu} \rangle_{vox}(v_{obs}) = -\ln \left\{ \sum_i \left[ \left( \prod_j p_{j,i}(k_{j,i}) \right) \exp\left(-\sum_j \tau_{\nu,j,i}(v_{obs}) \times \frac{\pi R_{cl,j}^2}{V_{voxel}} \times \Delta s\right) \right] \right\}.$$

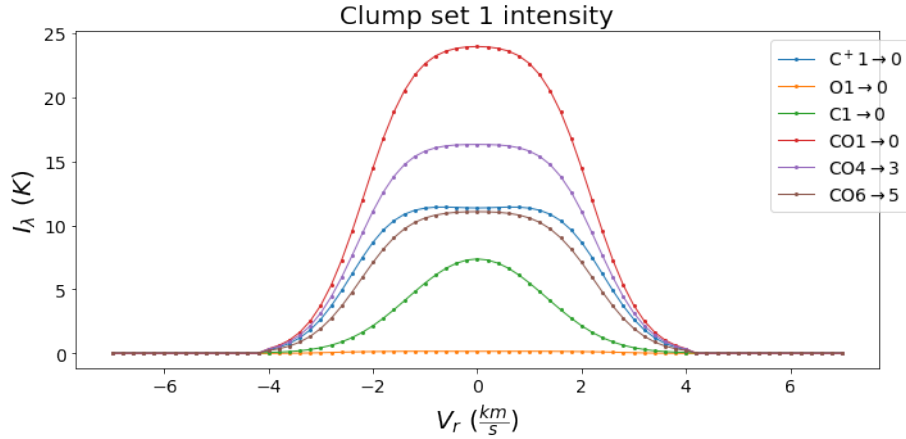
At least this is how the intended modification to the code should work. Its implementation tries to remain as faithful to this description as possible, but it was noted that there are still a couple errors. Therefore some flags were added to choose the type of implementation: `test_calc`, `test_pexp`, `test_opacity`,

and `test_fv`. `test_calc` chooses whether or not the test calculation is used, and it will definitely affect the emissivity. `test_opacity` is a flag to use either the original definition of opacity or to use the modified version given above. `test_pexp` is a test to see how the calculation of opacity changes if one considers how the result is changed if one applies the probabilistic approach to  $\kappa$  rather than  $e^{-\kappa\Delta s}$ . This should not be working since the probabilistic approach should work on the attenuation ( $e^{-\tau}$ ). In any case, this is included for testing purposes. The final flag, `test_fv`, tests a form of the calculation that should have been in the code from the beginning. Since only partially- to fully-filled voxels are considered in the 3D models ( $f_V \leq 1$ ), all of the computations depend on the extent of the voxel,  $\Delta s$ . This is not true in the case of an over-filled voxel ( $f_V > 1$ ), where the excess clumps are assumed to be located just behind the voxel. In this case of an over-filled voxel, the calculations are modified to ensure it is still physically correct. (ie. The voxel essentially becomes a column, with the voxel size  $\Delta s$  determining the observed area and the depth adjusted by  $f_C \equiv \max(1, f_V)$ .) As a crude approximation, this changes equations such as the voxel-averaged opacity to  $\langle \kappa_\nu \rangle = \frac{\sum \tau_\nu > \text{vox}}{f_C \Delta s}$ . This ensures all of the clumps are contained in the voxel being calculated. In the case of an over-filled voxel, the voxel calculated is actually a rectangle.

For the following tests in this section, we will use the same parameters used to identify the issue. This used four clump masses  $M_{cl} \in [10^{-3}, 10^{-2}, 10^{-1}, 10^0]M_\odot$ , voxel size  $\Delta s = 0.1pc$ , ensemble dispersion  $\sigma_{ens} = 1 \frac{km}{s}$ , ensemble mass  $M_{vox} = 10^{0.8}M_\odot$ , hydrogen number density  $n_H = 10^{4.8}cm^{-3}$ , and far-UV radiation  $\chi = 10^{1.7}\chi_0$ .

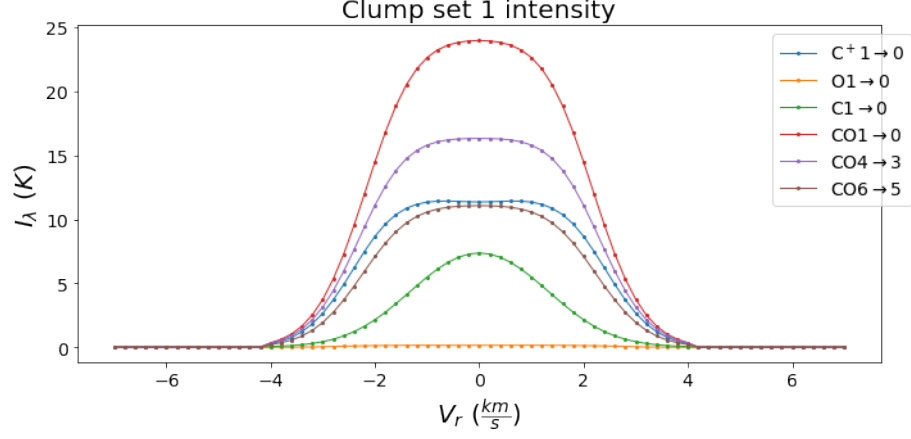
## 2.2 Standard calculation

Setting all flags to false will perform the original calculation, which for a partially-filled voxel acts as a benchmark. The issue noted by Yoko, however, was for a voxel with  $f_V \gtrsim 4$ . This case is thus included to show how the error was identified. The absorption feature in CII is the error that we will be tracking.



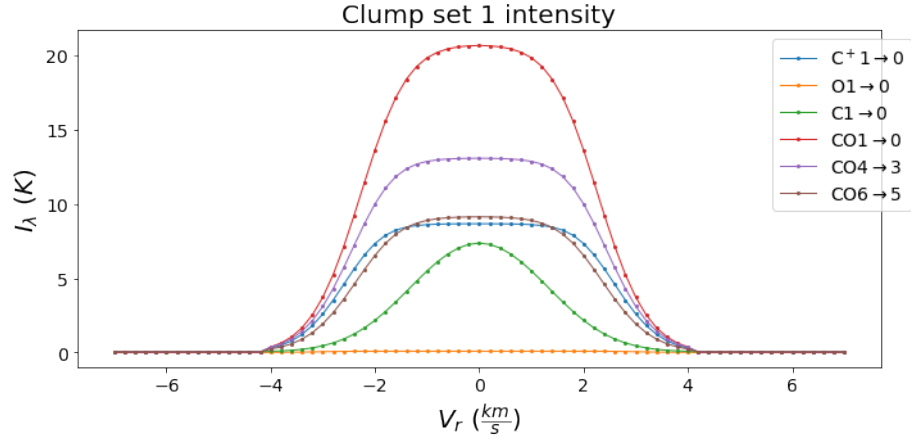
### 2.3 Using the correct $f_V$

In this model we set `test_fv` True while keeping the other flags False. This should be the correct calculation of an over-filled voxel using the old calculation.



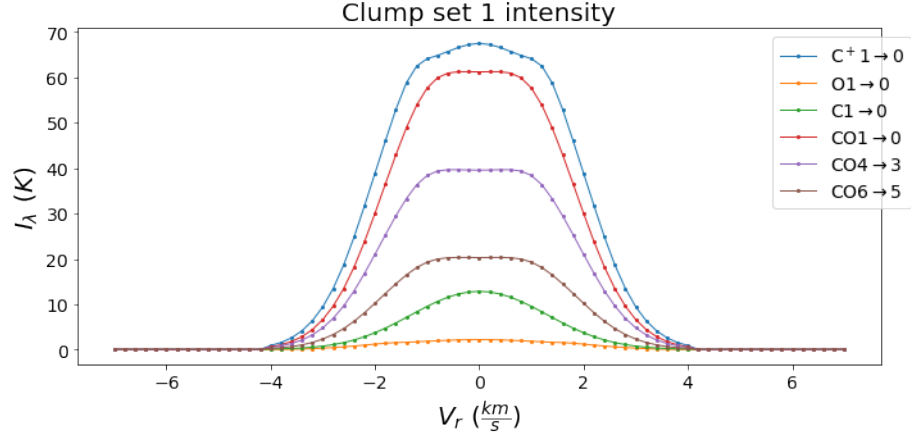
### 2.4 Setting `test_fv` and `test_pexp`

Here I test the validity of the way the probability approach is applied to the opacity. This test uses the probability on the  $\tau_\nu$  rather than  $e^{-\tau_\nu}$ . It can be seen that this test correctly removes the absorption features, however it is at the expense of a slightly-reduced intensity. The slightly-reduced intensity is understandable considering the result without setting `test_fv` was not physically correct.



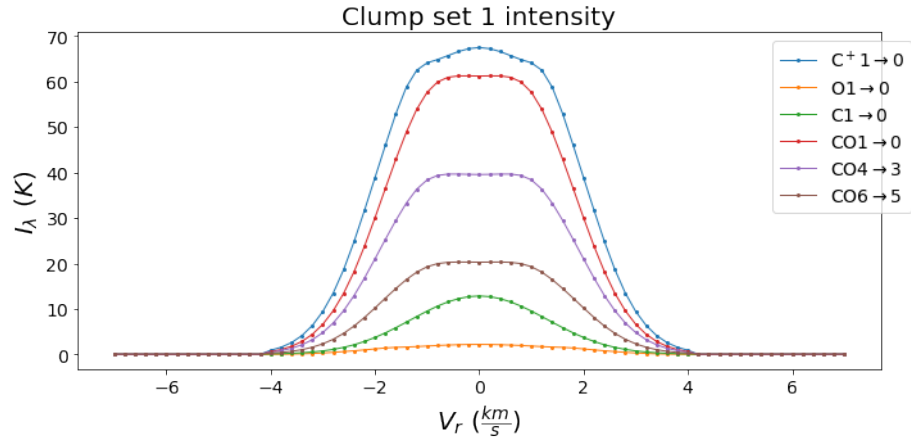
## 2.5 Setting test\_fv, test\_calc, and test\_opacity

Here we test the new calculation applied to both  $\epsilon_\nu$  and  $\kappa_\nu$ .



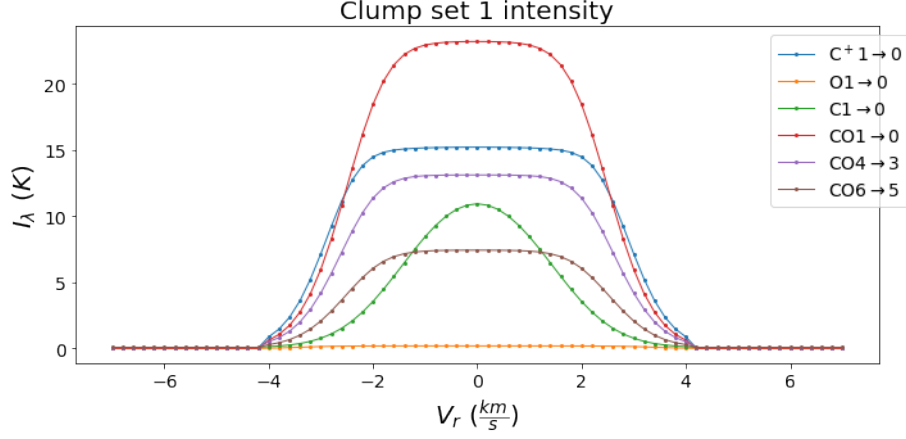
## 2.6 Setting test\_fv and test\_calc

Here we test the new calculation applied just to  $\epsilon_\nu$ , but  $\langle \kappa_\nu \rangle$  is still calculated from  $\langle \tau_\nu \rangle$  like in the old calculation.



## 2.7 Setting test\_fv, test\_calc, test\_opacity, and test\_pexp

Finally we calculate a model setting all of the flags. This also correctly results in the desired plateaux, but the relative intensities are different (since CII is now larger than OI).

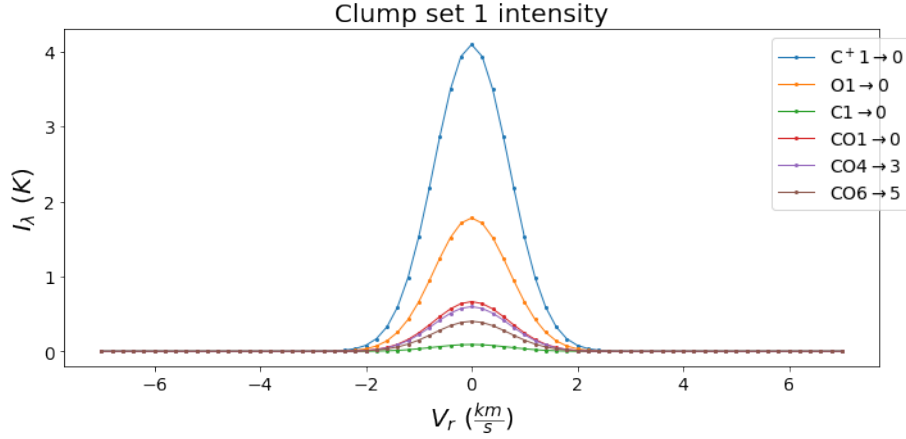


## 2.8 Summary

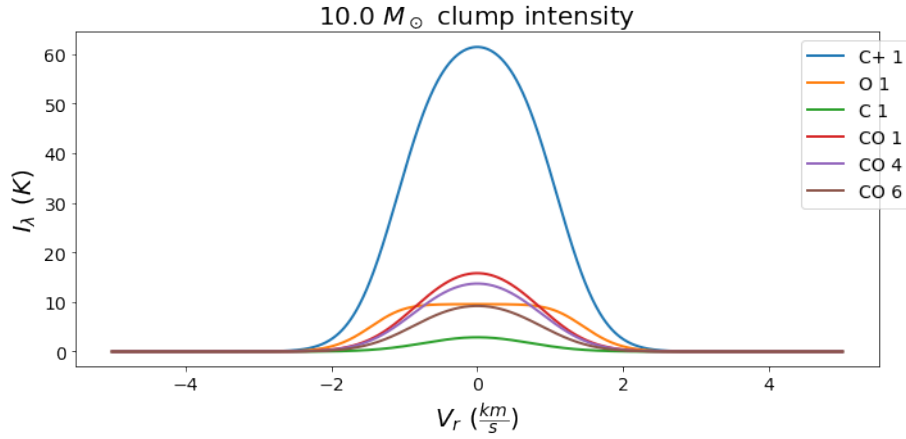
As shown in the previous subsections, the calculations which correctly model the saturation plateau features apply the probabilistic calculation directly to the opacity  $\kappa_\nu$ , rather than  $e^{-\kappa_\nu \Delta s}$ . These models differ, at least in these examples, by the relative intensities of the transitions. Notably the CII and CI lines differ. What remains is determining which calculation is correct.

### 3 Convergence test

An initial test notebook was created to explain how the single-voxel object functions. The example was a voxel with side length  $\Delta s = 1pc$ , clump mass  $M_{cl} = 10M_{\odot}$ , ensemble mass  $M_{ens} = 10M_{\odot}$ , ensemble dispersion  $\sigma_{ens} = 0 \frac{km}{s}$ , hydrogen number density  $n_{H_1} = 10^5 cm^{-3}$ , and far-UV radiation  $\chi = 10^4 \chi_0$ . It is essentially a voxel containing one clump with no added velocity dispersion. This will be used as a benchmark result, and we will examine the two settings that worked on the over-filled voxel. The correction for an over-filled voxel is not necessary in this case since the model is partially filled.



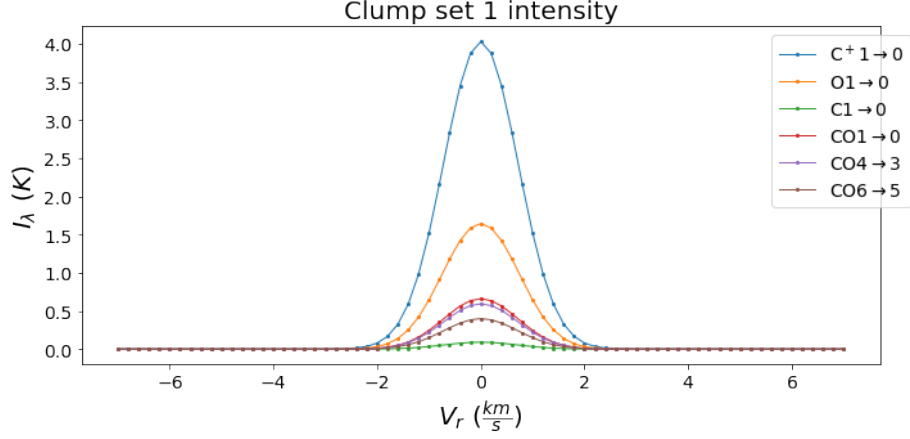
This model should contain just one clump of mass  $10M_{\odot}$ . The intensity of this clump (after calculating the radiative transfer equation) is given below.



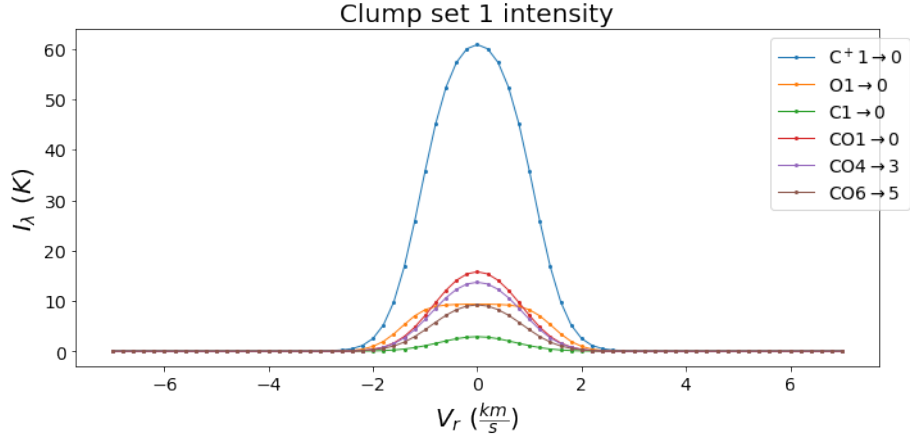


### 3.1 Setting test\_pexp

We first look at the intensity of the voxel with the adjusted probabilistic calculation of the voxel-averaged opacity  $\langle \kappa_\nu \rangle_v$  *ox*. The result is the same as the benchmark plot.

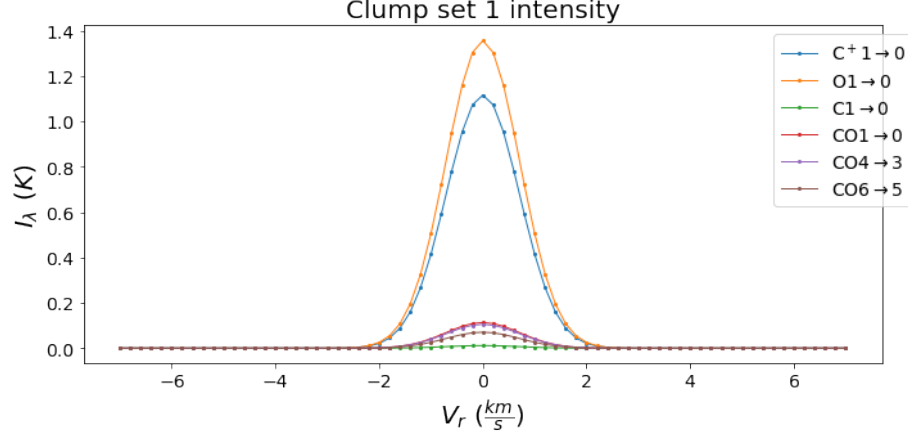


We also look into the result for a voxel area with a comparable area to the projected area of the clump, which is a voxel with side length  $\Delta s = 0.16 pc$ . This should result in the same plot as the clump intensity plot.

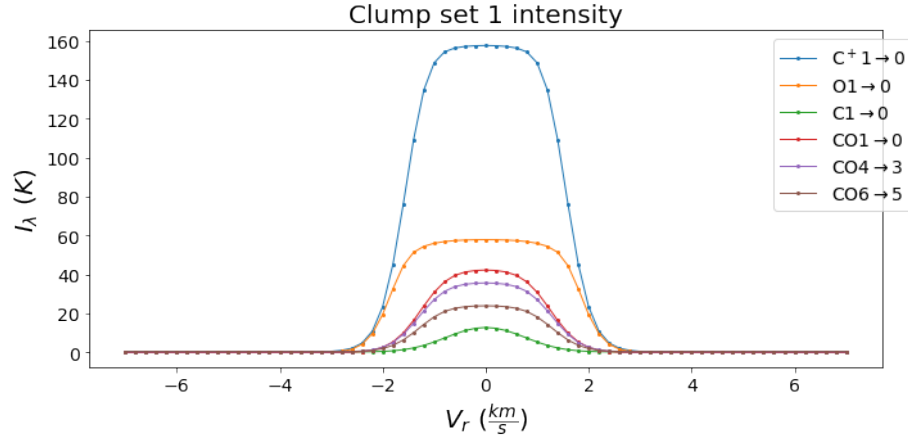


### 3.2 Setting test\_calc, test\_opacity, and test\_pexp

Now the  $1pc$  voxel with the suggested calculation correction results in an intensity plot that is lower by a factor of 4. The relative intensities of the various transitions are also different.



Finally the  $0.16pc$  voxel, which should have an intensity profile similar to the benchmark profile of a single clump, is greater by about a factor of 4. There are also different transitions that are saturated ().



### 3.3 Summary/Issues

In the end the implementation that appears successful is the original calculation, but including the correction for over-filled voxels and applying the probabilities to  $\kappa$  rather than  $e^{-\kappa\Delta s}$ . This is not the end of the issue, though. As noted by Markus, the intensity value used in the plots is the integrated intensity. That means the intensity profile of the single clump used in the calculation is incorrect. It could very-well be that the proposed corrected voxel-averaged calculations would work if the code uses the correct clump emissivity/opacity. To that end, I guess I have a question for Markus: is it possible to get the maximum emissivity/opacity of the clumps in the grid (which is assumed to be the peak of a Gaussian with  $\sigma_{cl} \approx 0.71 \frac{km}{s}$ )?