### Microphysics and chemistry in hydrodynamical numerical simulations Part II: Microphysics

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# Highlights from yesterday's talk



- chemistry is a mess!
- ► solve the ODEs system is computationally expensive (stiff)
- it requires accurate implicit solvers (high-order, adaptive step-size)
- build a chemical network is not an easy task
  - accuracy of rates
  - availability of rates
  - how to retrieve the rates
- chemistry is strongly coupled with other physical processes
- it's difficult to find a public package for the chemistry which is flexible, accurate, and well optimized

#### KROME T. Grassi, **SB**+ MNRAS, 2014





#### better science through chemistry

- KROME is a package which helps users to build their own microphysics
- ► KROME is open source
- KROME is a pre-processor (python)
- ► KROME is flexible and can be customized
- ► KROME allow users to choose between efficiency and accuracy
- ► to embed KROME into an external code requires a simple call
  - call krome(x(:), Tgas, dt)
- www.kromepackage.org
- ► VERY IMPORTANT:
  - we have implemented an auto-generator of networks
  - just give the species, types of reactions
  - But I personally, strongly discourage this!



```
$ git clone https://bitbucket.org/tgrassi/krome.git
Cloning into 'krome'...
remote: Counting objects: 4193, done.
remote: Compressing objects: 100% (2063/2063),
    done.
remote: Total 4193 (delta 2675), reused 3278
    (delta 2094)
Receiving objects: 100% (4193/4193), 16.81 MiB |
    673.00 KiB/s, done.
Resolving deltas: 100% (2675/2675), done.
Checking connectivity... done.
```

► you will generate a folder named "krome"



\$ ls

README.md	data	outtest.md5
alltest.py	gpl-3.0.txt	patches
argparse.py	krome	solver
build	kromelib.py	src
changelog.txt	kromeobj.py	tests
clean	networks	tools
custom.dat	options_example	wizard

- ► folders
- python files-the core of the package
- executable-pre-processor
- other files (e.g. clean to clean up your working dir)





# Forget that KROME exists

# Let's start with a practical example simulating an isolated galaxy





# Let's start with a practical example (cont'd)

simulating an isolated galaxy

07

Physical/Hydro parameters:

- Isolated disc galaxy of 4.4 kpc at z = 3
- Composition:
  - NFW DM halo
  - stellar bulge,  $M_{Bulge} = 1.8 \times 10^9 M_{\odot}$
  - stellar and gaseous disc,  $M_{disc} = 8.8 \times 10^9 M_{\odot}$
- Virial mass  $M_{vir} = 2.2 \times 10^{11} M_{\odot}$
- Disc gas fraction = 30%
- Disc scale length 1.1 kpc
- Kroupa IMF, 2Gyr-old stars
- Star formation
- ► Feedback: SNe type II, Ia, wind
- Some Radiative Transfer!
- Metal enrichment by SNe



# Let's start with a practical example (cont'd)



- ► Goal: follow the atomic-to-molecular transition
- ► or WORST, obtain information on CII abundance
- Do I need chemistry and microphysics?
  - YES, cooling affects the star formation rate (indirectly)
  - ► H<sub>2</sub> model to know when we reach the fully molecular stage
  - ADVANCED: need a network for CII
- What else?
  - Heating, Photochemistry, Dust...

Typical physical conditions:

- ▶  $10^{-8} \le n_{tot} \le 10^4 \text{ cm}^{-3}$
- ► 10 ≤ T ≤ 10<sup>8</sup> K

#### Chemical network first you want to solve kinetics



H<sub>2</sub> network we need:

- ► 9 species + ~ 40 reactions (including photochemistry)
  - ▶ if you need CII, you will end with min. 16 species and ~ 60-70 reactions, without including molecules like CO

Boring/tricky/dangerous?

- write down the rate equations (hard coding)
- ► if you want to remove or add a reaction becomes boring
- ► for large network almost impossible
- develop a solver or set the parameters for an existing solver

#### If you are lucky there is some chemistry in your hydro-code already implemented, suitable for your application (not so common)



#### convert kinetic energy in something else!

- 1. radiative loss
- 2. endothermic reactions
- 3. gas flows
- 4. gas-dust interaction







# Cooling example: collisional





# Cooling example: collisional







general expression (N levels)

$$\dot{n}_{i} = n_{i} \left( \sum_{j < i} A_{ij} + \sum_{i \neq j} \sum_{k} n_{ck} C_{ij}^{(k)} \right) + \left( \sum_{j > i} n_{j} A_{ij} + \sum_{i \neq j} n_{j} \sum_{k} n_{ck} C_{ji}^{(k)} \right)$$
$$\Lambda(n, T) = \sum_{i} n_{i} \sum_{j < i} \Delta E_{ij} A_{ji}$$

## Full Matrix

$$\begin{pmatrix} 1 & \cdots & 1 \\ M_{1,1} & \cdots & M_{1,N-1} \\ \vdots & \ddots & \vdots \\ M_{N-1,1} & \cdots & M_{N-1,N-1} \end{pmatrix} \times \begin{pmatrix} n_1 & \cdots & n_{N-1} \end{pmatrix} = \begin{pmatrix} n_{\text{tot}} \\ 0 \\ \vdots \\ 0 \end{pmatrix}$$

where

$$M_{l,m} = g_{l,m}(A_{ij}, C_{ij}, \{n_k\})$$

#### Linear solver

- 2 levels: analytic (fast)
- ► 3 levels: analytic (fast)
- ▶ > 3 levels: LAPACK (fast for  $N \gg 3$ )

# Cooling problems!



 $\dot{n}_i$  and  $\dot{T}$  must be solved together



# Cooling - Necessary atomic data



## E<sub>i</sub> - Energy of the *i*th level

- Needed to get  $\Delta E_{ij} = E_i E_j$  (erg or K)
- Easy to retrieve (e.g. NIST, literature), accurate
- Constants

## Aij - Einstein's coefficients

- Probability of spontaneous radiative de-excitations (1/s)
- Easy to retrieve (e.g. NIST, literature), accurate
- Constants

# $C_{ij}^{(k)}(T)$ - collisional (de)excitation rate coefficient

- ► Not-so-easy to retrieve (e.g. database and literature search), accuracy?
- Temperature dependence ( $\rightarrow$  functions,  $\rightarrow$  limits)
- ► Collider dependent <sup>(k)</sup> (CI-H<sub>2</sub>, CI-H, CI-e)



### Recap on problems

- Search for atomic data
- ► How to solve linear systems? (many caveats not shown here)
- Convert messy equations into efficient code (e.g. tables for  $C_{ii}^{(k)}$ )
- Avoid typos in atomic data (less trivial than expected)
- Adding a collider later could be troublesome



## What about fitting functions (or cooling eq/non-eq tables)?

- usually functions of T and of the chemical composition
- OK when parameters are independent
- PRO: very fast (depends)
- CON: less accurate (depends)
- CON: not always valid (time-scales)
- CON: difficult to update with new atomic data (re-build machinery)

## Examples

- ► H<sub>2</sub> from S. Glover (colliders H, H<sup>+</sup>, e<sup>-</sup>, H<sub>2</sub>, He)
- Metal cooling tables from Oppenheimer et al. 2013



Going back to your galaxy simulation!

- ► atomic cooling (e.g. Ly-alpha cooling by H)
- molecular cooling (H<sub>2</sub>)
- chemical cooling (endothermic reactions, formation of H<sub>2</sub>)
- dust-gas thermal cooling
- ▶ metal cooling (e.g. CI, CII, OI)
- ► simple fit
- on the fly
- ► tables (eq. or non-eq)

## Heating Mechanisms





#### **Template process**

something else  $\rightarrow$  kinetic energy

### Interesting processes

- 1. photochemistry
- 2. exothermic reactions
- 3. gas compression



There are different ways to heat the gas in the ISM, i.e. to transfer energy into the gaseous medium

- ► via photons/electrons
- via chemical reactions
- via dust grains
- via dynamical processes

Main processes:

- elastic collisions
- collisional de-excitations

# Heating processes overview

for our hypothetical galaxy simulation



- ► photo-heating (e.g. H, He ionizations, H<sub>2</sub> photodissociation)
- ► H<sub>2</sub> UV pumping (Solomon process, LW bands)
- photo-electric heating by dust
  - ► E > 6 eV
  - electron detachment
  - Coulomb losses  $\rightarrow$  gas heating
- chemical heating



# Interaction radiation-matter



a schematic summary



# Secondary ionizations

some more information





## Photochemistry - Equations first



### Photochemistry process

$$H + \gamma \xrightarrow{\sigma_0(E)} H^+ + e^-$$
 (1)

$$OH + \gamma \xrightarrow{\sigma_1(E)} OH^+ + e^-$$
 (2)

$$OH + \gamma \xrightarrow{\sigma_2(E)} O + H$$
 (3)

### Photochemistry equations (thin)

$$k_{ph} = \frac{4\pi}{h} \int_{E_0}^{\infty} \frac{I(E)\sigma(E)}{E} dE$$
(4)

$$H_{ph} = \frac{4\pi}{h} \int_{E_0}^{\infty} \frac{I(E)\sigma(E)}{E} (E - E_0)\eta(E)dE$$
(5)

$$\Gamma^{i}_{\rho h} = H^{i}_{\rho h} n_{i} \tag{6}$$



### Photochemistry equations (thin)

$$k_{ph} = \frac{4\pi}{h} \int_{E_0}^{\infty} \frac{I(E)\sigma(E)}{E} dE$$
(7)

$$H_{ph} = \frac{4\pi}{h} \int_{E_0}^{\infty} \frac{I(E)\sigma(E)}{E} (E - E_0)\eta(E)dE$$
(8)

$$k_{ph} = \begin{bmatrix} s^{-1} \end{bmatrix}$$
(9)

$$H_{ph} = \left[\frac{\text{erg}}{\text{s}}\right] \tag{10}$$

$$E = [eV] \tag{11}$$

$$I(E) = \left[\frac{eV}{cm^2 s Hz sr}\right] = \left[\frac{eV}{cm^2 sr}\right]$$
(12)

$$\sigma(E) = \left[ \mathrm{cm}^2 \right] \tag{13}$$

## Photochemistry - bins



$$k_{ph} = \frac{4\pi}{h} \int_{E_0}^{\infty} \frac{I(E)\sigma(E)}{E} dE$$
(14)

$$H_{ph} = \frac{4\pi}{h} \int_{E_0}^{\infty} \frac{I(E)\sigma(E)}{E} (E - E_0)\eta(E)dE$$
(15)

### Discretization by bins

$$\begin{split} \kappa_{ph} &= \frac{4\pi}{h} \sum_{i=1}^{N_{bins}} \frac{I_i \sigma_i}{\langle E_i \rangle} (E_i^{right} - E_i^{left}) \qquad \langle E_i \rangle > E_0 \\ H_{ph} &= \frac{4\pi}{h} \sum_{i=1}^{N_{bins}} \frac{I_i \sigma_i}{\langle E_i \rangle} (E_i^{right} - E_i^{left}) (\langle E_i \rangle - E_0) \\ \langle E_i \rangle &= \frac{E_i^{right} + E_i^{left}}{2} \end{split}$$

 $(E) 3 \cdot 10^{4} 2 \cdot 10^{4} 1 1 3 \cdot 6 14 \cdot 0 14 \cdot 4 16 \cdot 0$ 



#### Problems

- collect cross-sections
- ► coupling with chemistry, dust, and thermal evolution
- coupling with radiative transfer scheme (consistently)





- different compositions and size
- different optical properties
- interact with the gas
- interact with radiation
- catalyze formation of molecules
- ► generally speaking → quite messy!

# Dust physics





 $\beta$  = 3.5, Mathis, Rumpl, and Nordsieck 1977





$$\Lambda_{g
ightarrow d}(a,T_d)=2\pi a^2 n_g n_d v_g k_B (T_g-T_d)$$

Dust formation and destruction depends on

- the grain size ( $\propto \pi a^2$ )
- dust and gas temperature
- sticking coefficient

## Gas-dust-radiation interaction

$$\Gamma_{em} = \Lambda_{g \rightarrow d} + \Gamma_{CMB} + \Gamma_{abs}$$

$$\int Q(a,E)B[E,T_d(a)]dE = \int Q(a,E)I(E)dE + \int Q(a,E)B(E,T_{CMB})dE + \Lambda_{g \rightarrow d}$$

#### To be solved bin-by-bin to obtain the dust temperature!!!



# and $H_2$ formation on dust and heating





- most relevant process
- energy distributed as following
  - 0.2 eV as kinetic energy
  - 4.2 eV in roto-vibrational state of H<sub>2</sub>
  - heating of grain negligible

$$\Gamma^d_{\rm H_2} = \textit{R}_f(0.2 + 4.2\epsilon)\textit{n}_{tot}\textit{n}_{\rm H}$$

#### WARNING: different rates available



$${}^{1}R_{f} = 3 \times 10^{-17} n_{\text{tot}} n_{\text{H}}$$

$${}^{2}R_{f} = 3 \times 10^{-17} Z/Z_{\odot} C_{\rho} n_{\text{tot}} n_{\text{H}}$$

$${}^{3}R_{f} = 3 \times 10^{-17} \frac{T_{2}^{0.5} f_{a}}{1 + 0.4 (T_{2} + T_{d_{2}})^{0.5} + 0.2T_{2} + 0.09T} n_{\text{tot}} n_{\text{H}}$$

$${}^{4}R_{d} = 0.5 v_{g} \pi a^{2} \varepsilon_{\text{H}_{2}} S(T, T_{d}) n_{\text{H}} n_{d}$$

<sup>1</sup>Jura 1975 <sup>2</sup>Gnedin+ 2009 <sup>3</sup>Hollenbach& McKee 1979 <sup>4</sup>Cazaux & Tielens 2004, state-of-the-art

# Final ingredients to cook our galaxy

#### RECIPE

- minimal H<sub>2</sub> chemical network (easiest part)
- ► cooling
  - metal cooling
  - H<sub>2</sub> cooling
  - dust cooling
  - atomic cooling
  - chemical cooling
- heating
  - photo-heating
  - photo-electric heating by dust
  - chemical heating
- dust
  - dust-gas interaction (cooling)
  - most important: H<sub>2</sub> catalysis on dust
- ▶ icing on the cake → shielding (by molecules and dust)!







# How this is in KROME



## Options file: my\_options

- -n networks/react\_galax<sup>5</sup>
- -heating CHEM, PHOTO, PHOTODUSTNET, H2PUMPING
- -cooling ATOMIC, CHEM, H2, Z\_EXTENDED
- -conserve
- -photoBins=100
- -dustTabs=H2,COOL,HM2012
- -compact

## Run KROME, effective python pre-processor

./krome -options=my\_options

### Build folder

In  ${\tt build}/$  you find the F90 routines to be coupled with your hydro-code

 $^5 \rm the$  network is already part of the package but users should carefully check that this is updated;  ${\rm KROME}$  is not a network provider.

# Look into the modules



```
k(:) = coe_tab(n(:)) !compute coefficients
```

```
!H2+
dn(1) = \&
   -k(1) *n(idx H2j) *n(idx Hk) &
   -k(2) *n(idx_H2j) *n(idx_H) &
   +k(3) *n(idx_Hk) *n(idx_Hj)
1H-
dn(2) = \&
   -k(1) *n(idx_H2j) *n(idx_Hk) &
   -k(3) *n(idx_Hk) *n(idx_Hj)
<sup>1</sup>H2
dn(3) = \&
   +k(1) *n(idx_H2j) *n(idx_Hk) &
   +k(2) *n(idx_H2j) *n(idx_H)
```

# Look into the modules



```
! **********************
  !init DLSODES (see DLSODES manual)
  neg = nspec !number of egns
  liw = size(iwork)
  lrw = size(rwork)
  iwork(:) = 0
  rwork(:) = 0.d0
  itol = 4 !both tolerances are arrays
  rtol(:) = 1.000000d-04 !relative tolerance
  atol(:) = 1.00000d-20 !absolute tolerance
  icount max = 100 !maximum number of iterations
  itask = 1
  iopt = 0
  !MF =
   ! = 222 internal-generated JAC and sparsity
   ! = 121 user-provided JAC and internal generated sparsity
  ! = 22 internal-generated JAC but sparsity user-provided
   ! = 21 user-provided JAC and sparsity
  MF = 2.22
  !end init DLSODES
```

#### A quick summary on how to include KROME in your simulations





#### A quick summary on how to include KROME in your simulations





- enable options you need
- run KROME
- inlcude the krome modules
  - use krome
  - use krome\_user
- call krome\_init()
  - once and for all
- be sure to have initialized the species (make use of krome\_nmols and other common arrays)
- change your Makefile accordingly
  - solver files (opkd\*.F)
  - krome routine (krome\_all)

#### Very preliminary test run gasoline (SPH) + KROME



#### Initial conditions (no UV background)





#### Evolution, first 50 Myr (relaxation)



#### Very preliminary test run GASOLINE (SPH) + KROME





## Final remarks



- modelling astrophysical environments is not an easy task
- chemistry in most cases is out of equilibrium
- ► chemistry/microphysics is CPU demanding but necessary
- KROME helps users to build a proper chemical model for astrophysical applications
  - open-source
  - in continuous development
  - extended based on the users needs
  - comprehensive and accurate microphysics included
  - flexible
- chemistry is strongly coupled with hydro and radiation

## If you are interested in KROME



#### ► join the KROME community

- www.kromepackage.org
- http://bitbucket.org/tgrassi/krome
- ► participate to one of the KROME schools (~ organized yearly)
  - 1st in Göttingen October 2014
  - 2nd in Copenhagen July 2015
  - ► 3th TBD (Florence, Italy?) 2016 or 2017
- contact me or Tommaso
  - stefano.bovino@uni-hamburg.de
  - tommaso.grassi@gmail.com

#### Thank you for your attention!





