#### CLASS

#### Cosmological Linear Anisotropy Solving System

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Les Karellis, France, 17-30 Aug 2025

Visit http://class-code.net/for more info!

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#### class in Les Karellis

#### What to expect in this *advanced* lecture:

Theory: What is class based upon?

Coding: Structure of class

• Coding: Essential rules and conventions

Coding: Implementing features (C and python)
 Coding: Using MontePython/Cobaya with class

We will learn the theory behind class and the fundamental rules of its code base.

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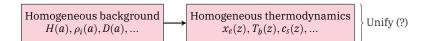
# class Theory

- 1 Fundamental layout of Einstein-Boltzmann solvers
- 2 Essential steps for each module
- 3 A few details for each of these steps

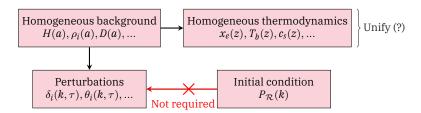


 $\begin{array}{c|c} \text{Homogeneous background} \\ H(a), \rho_i(a), D(a), \dots \end{array} \longrightarrow \begin{array}{c|c} \text{Homogeneous thermodynamics} \\ x_e(z), T_b(z), c_s(z), \dots \end{array}$ 

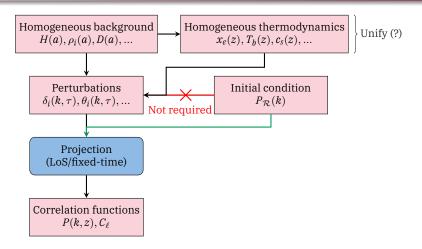


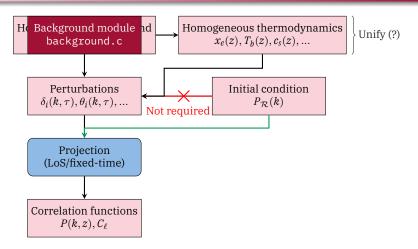




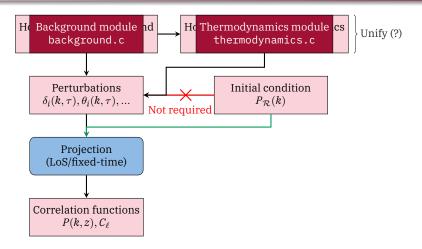


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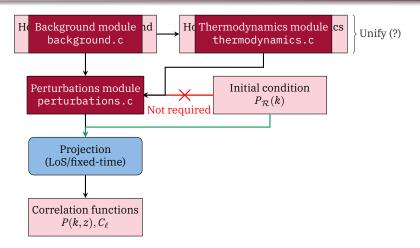


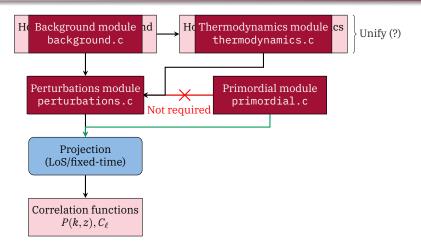


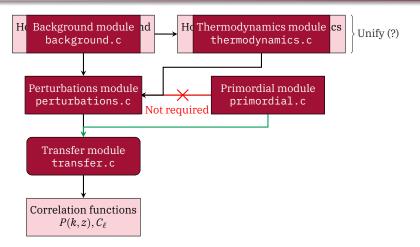
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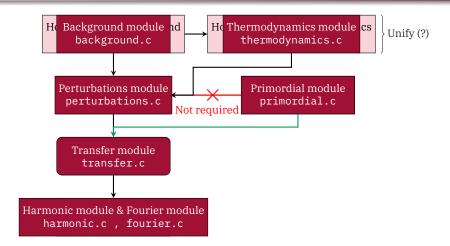


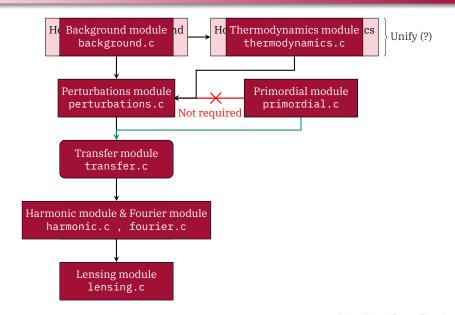
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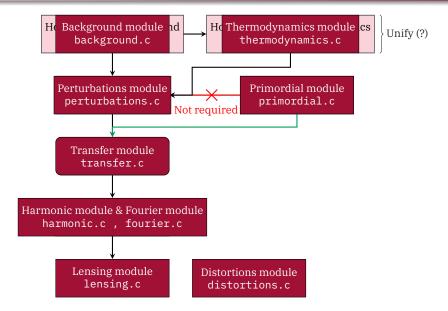


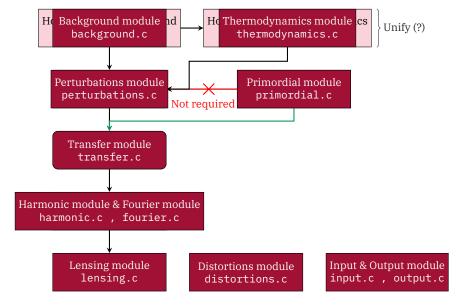












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Essential steps in Einstein-Boltzmann solver

Let's make a journey through each module!

### Essential steps in Einstein-Boltzmann solver

#### Module 1. Input

Read in input files, take care of shooting.

```
h = 0.7

#H0 = 70

Omega_m = 0.3

#omega_m = 0.14

sigma8=0.8
```

Special care for equivalent/unknown parameters

#### Terminal Python wrapper file xxx.ini input init(...) (parser) .set(...) struct file content fc; (all parameter names/values stored as arrays of strings) input read from file(...) input\_read\_parameters(...) (assign all default values + interprete input + update some parameters) Only relevant parameters get stored in the structures of each module

For indirect parameters, use shooting method

Repeated calls of input\_read\_parameters(...), class executions, from input\_read\_from\_file(...) until shooting target is met.



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#### Example:

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#### Example:

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Try out a few values and narrow down (Example: User wants  $100\theta_s = 1.04325$ )

h	$100\theta_s$
0.7	1.0522492086422521
0.65	1.0270326366580724
0.68215616173	1.0437999980620178
0.68110138476	1.0432819283581667
0.68103637942	1.0432499363679562
0.68103650871	1.0432499921072458
0.68103652701	1.0432500079710365
•••	

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In practice, use more sophisticated Ridder's method / Newton's method



For shooting parameters, establish mapping between *target parameter*, *unknown parameter* and *level*. Currently:

target parameter	unknown parameter	level
$100 \times \theta_s$	h	thermodynamics
$\Omega_{ m dcdm}$	$ ho_{ m dcdm}^{ m ini}$	background
<u>σ</u> 8	$A_{S}$	<del>spectra</del>
	•••	•••

... plus a few others (alternative parametrizations of decaying CDM, quintessence parameters).

This is what is used e.g. in models of early dark energy!

If you need to add such parameters: see how it is done e.g. for 100\*theta\_s and replicate the structure!

Special exception  $\tau_{\rm reio} \leftrightarrow z_{\rm reio}$  only concerns reionization and is done independently in thermodynamics.c New Special exception:  $\sigma_8 \leftrightarrow A_s$  can be very simply analytically re-scaled

(multiplicative property), therefore done independently in input.c

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#### Budget equation:

$$\sum_{X} \Omega_X = 1 + \Omega_k$$

To avoid over-constraining the input, one of the last three (Omega\_Lambda, Omega\_fld, Omega\_scf) must be left unspecified and class will assign it using budget equation.

Possibly more advanced in the future

- default: Omega\_Lambda is automatically adjusted
- if you pass Omega\_Lambda, Omega\_fld is automatically adjusted
- if you pass Omega\_Lambda and Omega\_fld: Omega\_scf is automatically adjusted (if you allow, by setting to -1)

This allows whatever combination.

E.g. to get  $\Lambda$  plus a DE fluid:

 ${\tt Omega\_Lambda=0.2, Omega\_scf=0} \quad {\tt or} \quad {\tt Omega\_fld=0.3, Omega\_scf=0}$ 

Helpful output by setting background verbose >= 2



### Essential steps in Einstein-Boltzmann solver

#### Module 2. Background

Get all background quantities as function of a scale factor a.

This also gives mapping  $a \leftrightarrow z \leftrightarrow t \leftrightarrow \text{conf.time}$ 

#### Let's formalize problem!

Three types of parameters:

- $\{A\}$  are analytical functions of scale factor and  $\{B\}$  quantities.
- $\{B\}$  need to be integrated over, and are used to compute  $\{A\}$
- $\{C\}$  also need to be integrated over, but are not used to compute  $\{A\}$ .



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ΛCDM and many simple extensions:

- $\{A\} = \{\rho_i(a), p_i(a), H(a), ..., \}$  with e.g.  $H(a) = \left(\sum_X \rho_X(a) \frac{K}{a^2}\right)^{1/2}$
- $\{B\} = \{\}$  (eliminated since v3.0)
- $\{C\} = \{t, \tau, r_s, D, f\}$  with e.g.  $\frac{dt}{da} = 1/H(a)$ ,  $\frac{dr_s}{da} = c_s(a)/(a \cdot H(a))$



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#### Example of DE/DM/DR fluid:

- $\{A\} = \{\rho_i(a), p_i(a), H(a), ..., w_{\text{fld}}(a)\}$
- $\{B\} = \{\rho_{\text{fld}}\}$  with  $\frac{d\rho_{\text{fld}}}{da} = -3(1 + w_{\text{fld}}(a))\rho_{\text{fld}}$



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Exemple of extended cosmology with quintessence  $\phi$ :

- $\{A\} = \{\rho_i, p_i, H, ..., V(\phi), \rho_{\phi}(\phi, \phi')\}$  with e.g.  $\rho_{\phi}(\phi, \phi') = \frac{1}{2}(\phi')^2 + V(\phi)$
- $\{B\} = \{\phi, \phi'\}$  with  $\frac{d\phi}{da} = \phi'/[aH(a)]$ ,  $\frac{d\phi'}{da} = -2\phi' aV(\phi)/H(a)$



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Also Cold Dark Matter decaying into Dark Radiation...

- $\{A\} = \{\rho_i, p_i, H, ...\}$
- $\{B\} = \{\rho_{\text{dcdm}}, \rho_{\text{dr}}\}\ \text{with}\ \frac{d\rho_{\text{dcdm}}}{da} = -3\rho_{\text{dcdm}} \Gamma(a)/H(a) \cdot \rho_{\text{dcdm}}$



#### Small details:

- Quantities as  $D_A(z)$ ,  $D_L(z)$ ,  $r_s$ ,  $t_{age}$  can be derived after all A,B,C are computed
- Takes care of NCDM integration of phase-space distribution
- Useful checks & output
- ullet ightarrow Budget equation output at verbosity level 2

## Essential steps in Einstein-Boltzmann solver

#### Module 3. Thermodynamics

Get all thermodynamics quantities as function of a time variable (class  $\rightarrow$  redshift z) after integrating differential equations like recombination equations:

$$\frac{dx_e}{dz}$$
,  $\frac{dT_b}{dz}$  = excitation, ionization, heating, ...

Then  $x_e(z) \to \kappa'(z)$  (Thomson scattering rate)

- $\rightarrow \kappa(z)$  (Optical depth)
- $ightarrow \exp(-\kappa(z))$  (factor for Integrated Sachs-Wolfe effect)
- $\rightarrow$  g(z) (visibility function for Sachs-Wolfe effect)
- $\rightarrow$  g'(z) (factor for Doppler effect)

Simplest model of recombination is the Saha equation.

It is well known that a non-relativistic ( $T \ll m$ ) species in thermal equilibrium obeys

$$n(\mu, T) \approx ge^{\mu/T} \left(\frac{mT}{2\pi}\right)^{3/2} e^{-m/T}$$
 (1)

Thus we find using complete thermal equilibrium with  $\mu_{\text{ionized}} + \mu_e = \mu_{\text{rec}}$  that

$$\frac{n_e n_{\rm ionized}}{n_{\rm rec}} \approx \left(\frac{m_e T}{2\pi}\right)^{3/2} e^{-E_{\rm bind}/T} \times \underbrace{\left[e^{\mu_{\rm ionized} + \mu_e - \mu_{\rm rec}} \left(\frac{g_e g_{\rm ionized}}{g_{\rm rec}}\right) \left(\frac{m_{\rm ionized}}{m_{\rm rec}}\right)^{3/2}\right]}_{\approx 1}$$

This gives 
$$\frac{x_e^2}{1 - x_e} \approx \left(\frac{1.1 \cdot 10^{-10}}{n_{\rm H,0}/T_{\rm cmb,0}^3}\right) \left(\frac{\rm eV}{T}\right)^{3/2} \exp(39.9 - 13.6 \frac{\rm eV}{T})$$
 (2)

and thus recombination at  $T \approx \frac{13.6 \text{eV}}{39.9} \approx 0.34 \text{eV} \rightarrow z \approx 1400$ .

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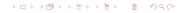
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recombination is a non-equilibrium process



The effective multi-level atom is the basis for recombination codes.

1s 2s 2p 3s 3p 3d ... ionized  $\rightarrow$  1s 2s 2p ionized



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Reason: Intermediate transitions  $(4p\rightarrow 3s)$  or  $(3s\rightarrow 2p)$  are comparatively instant. Why? Direct transition  $2s\rightarrow 1s$  is forbidden, and  $2p\rightarrow 1s$  is immediately reversed by  $1s\rightarrow 2p$ . The medium is optically thick during recombination.

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Instead, focus on  $2p \to 1s$  with subsequent redshifting of photon to escape reabsorption (slow) or  $2s \to 1s$  with two-photon decay (slow).

#### Peeble's equation

$$\dot{x_e} \approx f_{\text{photo-ion}}(T)x_{\text{rec}} - f_{\text{rec}}(T)x_ex_{\text{ionized}}$$
 (3)

Solved numerically, basis of recfast



recfast only resolves  $2s \approx 2p$ 



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Improvement: HyRec with EMLA resolves 2s, 2p. Even more, can do 2s, 2p, 3s, ... with *effective* rates.

Fullest code to date: CosmoRec does full numerical computation (iteratively). Comparatively slow, but highest achievable accuracy

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Further complication: Helium (higher elements don't contribute)

User can choose to model approximate recombination and get  $x_{\ell}(z)$ ,  $T_{h}(z)$  from:

- RECFAST (Wong, Moss & Scott 2008)
- HyRec-2 (Y. Ali-Haïmoud, N. Lee)
- Possibly soon? CosmoRec (J. Chluba)



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Recombination needs one more cosmological parameter: the primordial Helium fraction  $Y_{\text{He}}$ .

- Fix it (Y\_He = 0.25)
- Get it from BBN (Y\_He = BBN). class has interpolation table pre-promputed with a BBN code (Parthenope), for each given value of  $N_{\rm eff}$ ,  $\omega_b$  (assumes  $\mu_{\nu_e}=0$ , easy to generalize).
- BBN interpolation table located in separate directory (in external/bbn/sBBN 2017.dat, update inbound)



#### For reionization:

- tanh with complicated argument (like CAMB)
- multi-tanh
- half tanh
- from file (either linear or tanh)



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Mini-shooting to find  $z_{\rm reio}$  for given  $\tau_{\rm reio}=\kappa_{\rm reio}$ . Optical depth  $\kappa(z)$  = inverse number of expected interactions  $\Rightarrow \kappa'(z)=an_Hx_e\sigma_T$ 



#### We also include

- Energy injection (increases ionization, heats  $T_b$ )
  This can cause changes in scattering  $\kappa(z)$  and thus be observable with CMB
- Time-dependent fundamental constants  $\rightarrow$  Causes shift in recombination due to fundamental dependencies such as  $E_{\rm binding} = \frac{1}{2} \alpha^2 m_e = 13.6 {\rm eV} \, (137 \alpha)^2 \, \left( \frac{m_e}{511 {\rm keV}} \right)$  We remind ourselves  $1 + z_{\rm rec} = T_{\rm rec}/T_{\rm cmb} \approx \frac{E_{\rm binding}}{12.57 {\rm meV}}$
- Computation of useful quantities  $z_{rec}, z_{drag}, z_*, D_A(z_{rec}), r_s(z_{drag}), \dots$

