







IFIC, Valencia (ES) CSIC – Universitat de Valencia



Horizon 2020 European Union funding for Research & Innovation gariazzo@ific.uv.es http://ific.uv.es/~gariazzo/

Hands in cosmology

23/05/2018 - 8th IDPASC School - Valencia (ES)

1 Distances

² Bayesian statistics and GW

- Some introduction
- The physics case

3 Thermodynamics in the early universe

1 Distances

2 Bayesian statistics and GW
 Some introduction
 The physics case

3 Thermodynamics in the early universe

Distances in the Universe

Open this tool: http://www.astro.ucla.edu/~wright/ACC.html

Consider flat universe, $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$, $\Omega_m = 0.31$, $T_0 = 2.725 \text{ K}$, massless neutrinos

How old is an object which was created at z = 1?

How old was the universe when the oldest known galaxy ("GN-z11", z = 11.1) emitted the light we observe now?

What's the angular size distance D_A at photon decoupling?

4

2

What's the angle subtended by an object of 5 kpc if it is located at z = 0.1? (remember the definition of D_A)

Distances in the Universe

Open this tool: http://www.astro.ucla.edu/~wright/ACC.html

Consider flat universe, $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$, $\Omega_m = 0.31$, $T_0 = 2.725 \text{ K}$, massless neutrinos

How old is an object which was created at z = 1? 7.635 Gyr

How old was the universe when the oldest known galaxy ("GN-z11", z = 11.1) emitted the light we observe now?

What's the angular size distance D_A at photon decoupling?

What's the angle subtended by an object of 5 kpc if it is located at z = 0.1? (remember the definition of D_A)

 $\overline{ heta = d/D_A \ 1.3 imes 10^{-5} \ {
m rad} }$

12.051 Mpc

2



1 Distances

2 Bayesian statistics and GW

- Some introduction
- The physics case

3 Thermodynamics in the early universe



[Trotta, arxiv:0803.4089]

What is probability?

[Trotta, arxiv:0803.4089]

What is probability?

a frequency

"the number of times the event occurs over the total number of trials, in the limit of an infinite series of equiprobable repetitions"

[Trotta, arxiv:0803.4089]

What is probability?

a frequency

"the number of times the event occurs over the total number of trials, in the limit of an infinite series of equiprobable repetitions"

[Trotta, arxiv:0803.4089]

What is probability?

a frequency

"the number of times the event occurs over the total number of trials, in the limit of an infinite series of equiprobable repetitions"

another subtle point: "randomness" of the trial series

what is really "random"?

do we properly know the initial state (and do not cheat)?

[Trotta, arxiv:0803.4089]

What is probability?

a frequency

a degree of belief

"the number of times the event occurs over the total number of trials, in the limit of an infinite series of equiprobable repetitions"

another subtle point: "randomness" of the trial series

what is really "random"?

do we properly know the initial state (and do not cheat)?

"probability is a measure of the degree of belief about a preposition"

[Trotta, arxiv:0803.4089]

What is probability?

a frequency

"the number of times the event occurs over the total number of trials, in the limit of an infinite series of equiprobable repetitions"

another subtle point: "randomness" of the trial series

what is really "random"?

do we properly know the initial state (and do not cheat)?

a degree of belief

"probability is a measure of the degree of belief about a preposition"

Advantages:

- recovers frequentist on the long run;
- can be applied when frequentist cannot;
- no need to assume a distribution of possible data;
- deals effortlessly with nuisance parameters (*marginalization*);
- relies on prior information.

how to deal with Bayesian probability?

Bayes theorem:

$$p(H|d, I) = \frac{p(d|H, I) p(H|I)}{p(d|I)}$$

how to deal with Bayesian probability?

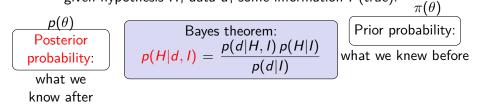
given hypothesis H, data d, some information I (true):

Bayes theorem:

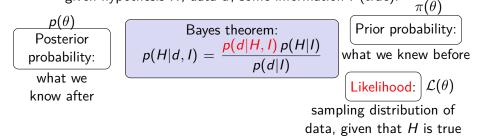
$$p(H|d, I) = \frac{p(d|H, I) p(H|I)}{p(d|I)}$$
what we knew before

 $\pi(\theta)$

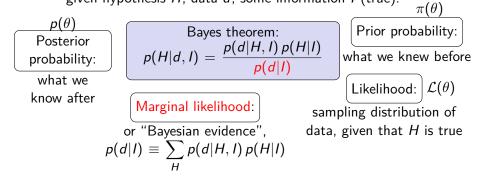
how to deal with Bayesian probability?



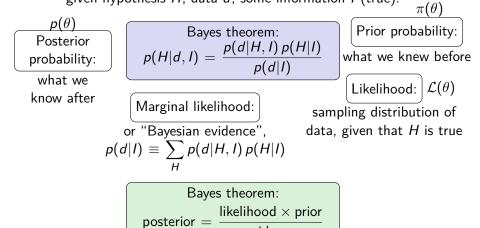
how to deal with Bayesian probability?



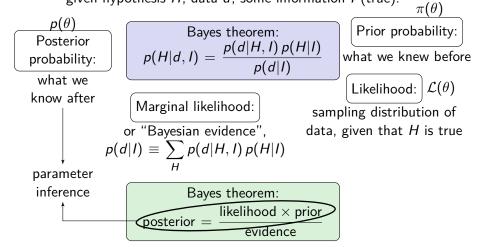
how to deal with Bayesian probability?



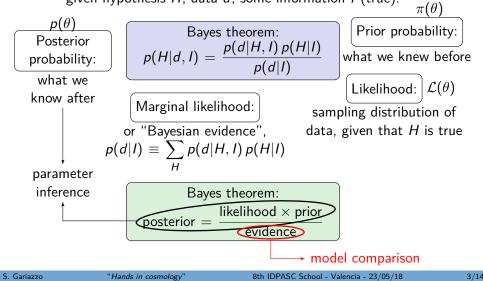
how to deal with Bayesian probability?

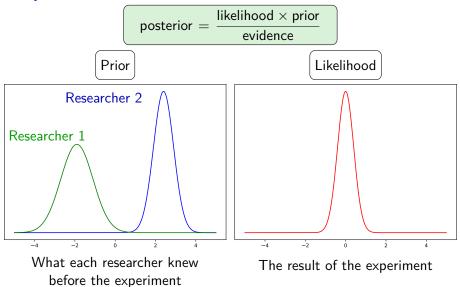


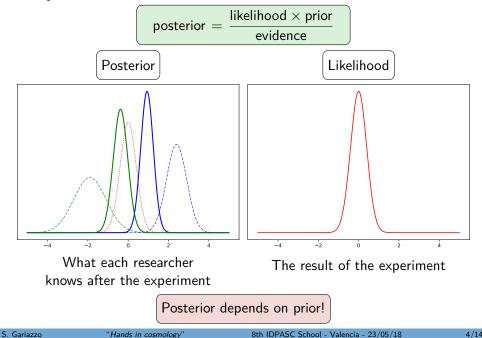
how to deal with Bayesian probability?

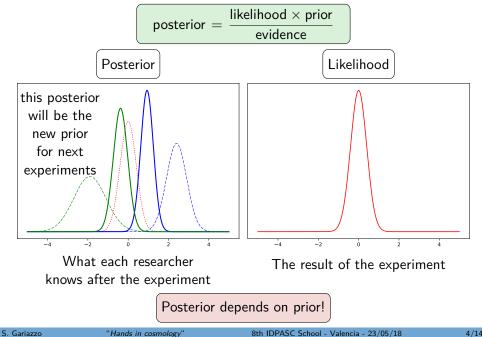


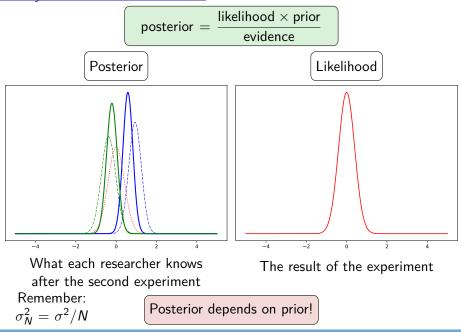
how to deal with Bayesian probability?

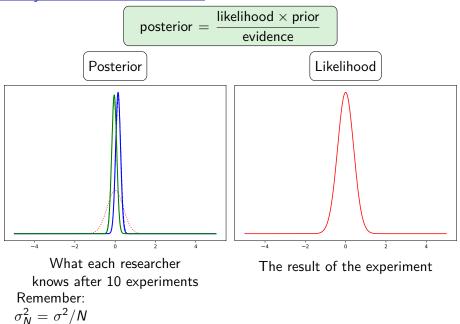


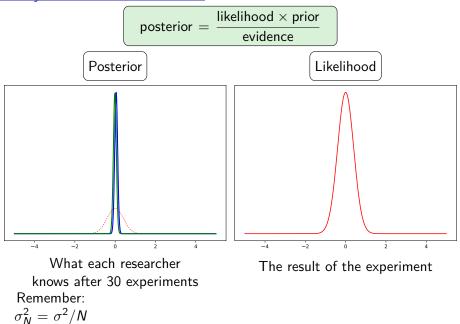


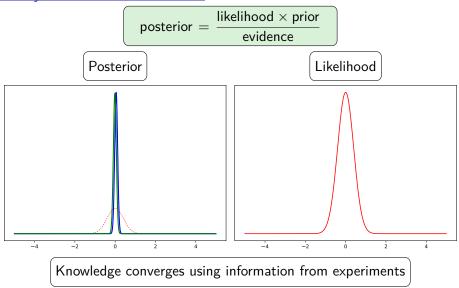


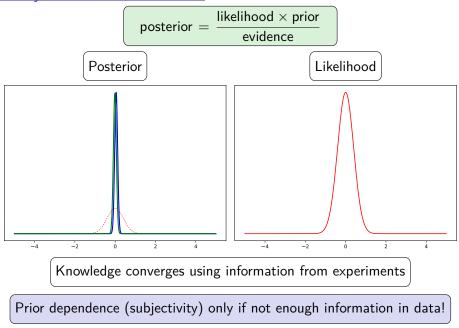








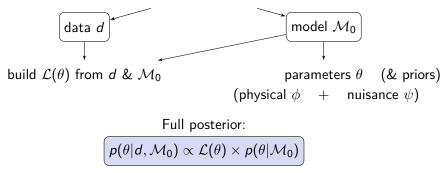




S. Gariazzo

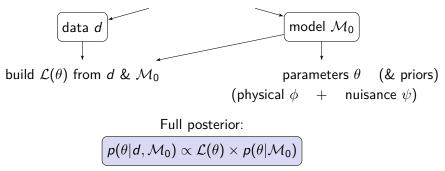
Bayesian) Parameter inference

Parameter inference = what we learn on the parameters, given:



Bayesian) Parameter inference

Parameter inference = what we learn on the parameters, given:



Marginalize over nuisance to obtain posterior for physical:

$$p(\phi|d, \mathcal{M}_0) \propto \int \mathcal{L}(\phi, \psi) p(\phi, \psi|\mathcal{M}_0) d\psi$$

marginalize over all the parameters except one (two)

→ 1D (2D) posterior

S. Gariazzo

"Hands in cosmology"

8th IDPASC School - Valencia - 23/05/18

Credible interval α ?

range of values within which an unobserved parameter value falls with a particular subjective probability α

Credible interval α ?

range of values within which an unobserved parameter value falls with a particular subjective probability α

Analogous to frequentist confidence intervals $\boldsymbol{\alpha}$

Bayesian credible interval:

- bounds as fixed;
- estimated parameter as a random variable.

Frequentist confidence interval:

- bounds as random variables;
- estimated parameter as fixed value.

Credible interval α ?

range of values within which an unobserved parameter value falls with a particular subjective probability α

Analogous to frequentist confidence intervals $\boldsymbol{\alpha}$

Bayesian credible interval:

- bounds as fixed;
- estimated parameter as a random variable.

Frequentist confidence interval:

- bounds as random variables;
- estimated parameter as fixed value.

Credible intervals are not uniquely defined!

highest posterior density interval: narrowest interval, includes values of highest probability density

equal-tailed interval:

same probability of being below or above the interval interval for which the mean is the central point

Credible interval α ?

range of values within which an unobserved parameter value falls with a particular subjective probability α

Analogous to frequentist confidence intervals $\boldsymbol{\alpha}$

Bayesian credible interval:

- bounds as fixed;
- estimated parameter as a random variable.

Frequentist confidence interval:

- bounds as random variables;
- estimated parameter as fixed value.

Credible intervals are not uniquely defined!

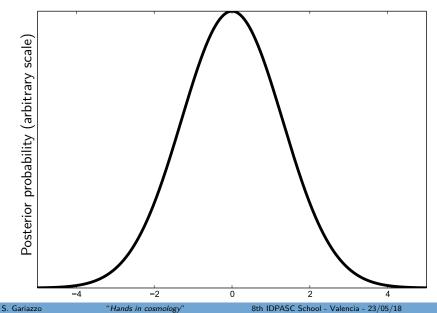
highest posterior density interval: narrowest interval, includes values of highest probability density

equal-tailed interval:

same probability of being below or above the interval interval for which the mean is the central point

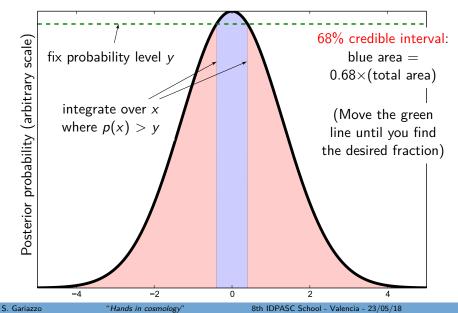
Computing credible intervals

Highest posterior density interval



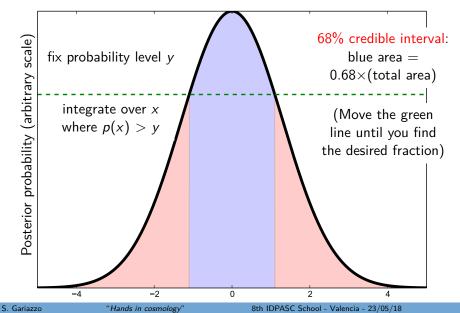
Computing credible intervals

Highest posterior density interval



Computing credible intervals

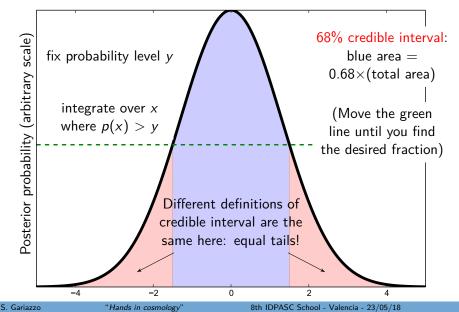
Highest posterior density interval



7/14

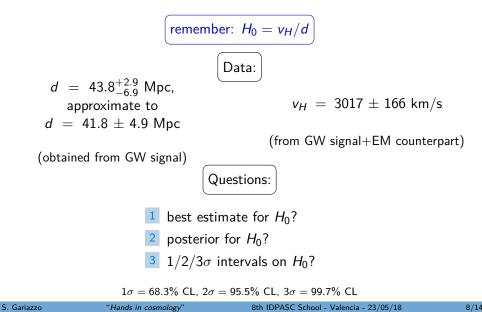
Computing credible intervals

Highest posterior density interval



A simplified application to determine H₀

Idea from [Nature 551 (2017) 85-88 [arxiv:1710.05835]]



A simplified application to determine H_0 - solutions

1 $H_0 \simeq 68.9$ km/s/Mpc from central values

use priors:

$$\pi(d) \propto \exp\left[-\frac{1}{2}\left(\frac{(d-41.8)}{4.9}\right)^2\right]$$

$$\pi(v_H) \propto \exp\left[-\frac{1}{2}\left(\frac{(v_H-3017)}{166}\right)^2\right]$$

$$\pi(H_0) \propto 1$$

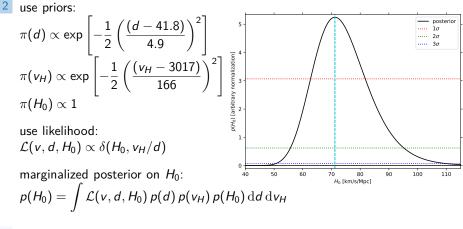
use likelihood: $\mathcal{L}(v, d, H_0) \propto \delta(H_0, v_H/d)$

marginalized posterior on H_0 : $p(H_0) = \int \mathcal{L}(v, d, H_0) p(d) p(v_H) p(H_0) dd dv_H$

3 find the various levels, e.g.:
68.27%: cut at
$$p = 3.069$$
, obtain
 $H_0 \in [62.7, 81.8] \rightarrow 71.2^{+10.6}_{-8.5}$ km/s/Mpc

A simplified application to determine H_0 - solutions

1 $H_0 \simeq 68.9 (71.2) \text{ km/s/Mpc}$ from central values (posterior)



3 find the various levels, e.g.: 68.27%: cut at p = 3.069, obtain $H_0 \in [62.7, 81.8] \rightarrow 71.2^{+10.6}_{-8.5}$ km/s/Mpc

A simplified application to determine H_0 - solutions

1 $H_0 \simeq 68.9 (71.2) \text{ km/s/Mpc}$ from central values (posterior)

2 use priors:

$$\pi(d) \propto \exp\left[-\frac{1}{2}\left(\frac{(d-41.8)}{4.9}\right)^{2}\right]$$

$$\pi(v_{H}) \propto \exp\left[-\frac{1}{2}\left(\frac{(v_{H}-3017)}{166}\right)^{2}\right]$$

$$\pi(H_{0}) \propto 1$$
use likelihood:

$$\mathcal{L}(v, d, H_{0}) \propto \delta(H_{0}, v_{H}/d)$$
marginalized posterior on H_{0} :

$$p(H_{0}) = \int \mathcal{L}(v, d, H_{0}) p(d) p(v_{H}) p(H_{0}) \, \mathrm{d}d \, \mathrm{d}v_{H}$$

3 find the various levels, e.g.:
68.27%: cut at
$$p = 3.069$$
, obtain
 $H_0 \in [62.7, 81.8] \rightarrow 71.2^{+10.6}_{-8.5} \text{ km/s/Mpc}$

S. Gariazzo

1 Distances

2 Bayesian statistics and GW
 Some introduction
 The physics case

3 Thermodynamics in the early universe

Number densities

Consider a particle with mass m, degeneracy g = 2and zero chemical potential.

What is its number density in the limits of large and small m/T?

Assume the three cases:

• Maxwell-Boltzmann, $f(p) \propto e^{-E/T}$

Fermi-Dirac,
$$f(p) = \left(e^{E/T} + 1\right)^{-1}$$

• Bose-Einstein,
$$f(p) = \left(e^{E/T} - 1\right)^{-2}$$

Remember:
$$n = g \int \frac{d^3p}{(2\pi)^3} f(p)$$

$$\zeta(s) = \frac{1}{\Gamma(s)} \int_0^\infty dx \frac{x^{s-1}}{e^x - 1} = \frac{1}{(1 - 2^{1-s})\Gamma(s)} \int_0^\infty dx \frac{x^{s-1}}{e^x + 1}$$
$$\zeta(2) = \pi^2/6, \qquad \zeta(3) = 1.202, \qquad \zeta(4) = \pi^4/90$$

S. Gariazzo

1

Number densities - Solutions

• MB, small T: this coincides with FD and BE when $E \simeq m \gg T$ (non relativistic)

$$e^{-E/T} \rightarrow e^{-m/T - p^2/(2mT)}$$
define $x \equiv p/\sqrt{2mT} \rightarrow n = \frac{e^{-m/T}}{\pi^2} [2mT]^{3/2} \underbrace{\int_0^\infty dx \, x^2 \, e^{-x^2}}_{\sqrt{\pi}/2}$

Number densities - Solutions

• MB, small T: this coincides with FD and BE when $E \simeq m \gg T$ (non relativistic)

define
$$x \equiv p/\sqrt{2mT} \rightarrow n = \frac{e^{-m/T}}{\pi^2} [2mT]^{3/2} \underbrace{\int_0^\infty dx \, x^2 \, e^{-x^2}}_{\sqrt{\pi}/2}$$

• MB, large T: use
$$x \equiv p/T$$
, so $n = \frac{T^3}{\pi^2} \underbrace{\int_0^\infty dx \, x^2 \, e^{-x}}_2$

Number densities - Solutions

• MB, small T: this coincides with FD and BE when $E \simeq m \gg T$ (non relativistic) $e^{-E/T} \rightarrow e^{-m/T-p^2/(2mT)}$

define
$$x \equiv p/\sqrt{2mT} \rightarrow n = \frac{e^{-m/T}}{\pi^2} [2mT]^{3/2} \underbrace{\int_0^\infty dx \, x^2 \, e^{-x^2}}_{\sqrt{\pi}/2}$$

• MB, large T: use
$$x \equiv p/T$$
, so $n = \frac{T^3}{\pi^2} \int_0^\infty dx \, x^2 \, e^{-x}$

• FD/BE, large T: use again $x \equiv p/T$, so $n = \frac{T^3}{\pi^2} \int_0^\infty dx \, \frac{x^2}{e^x \pm 1}$

Now you can use the $\zeta(x)$ definitions, so the integral is:

 $\mathsf{BE} \rightarrow \zeta(3) \mathsf{\Gamma}(3) = 2\zeta(3) \qquad \qquad \mathsf{FD} \rightarrow 3/4\zeta(3) \mathsf{\Gamma}(3) = 3\zeta(3)/2$

1b

Repeat the previous exercise, but now compute $\rho = g \int \frac{d^3p}{(2\pi)^3} E f(p)$

1b

Repeat the previous exercise, but now compute $\rho = g \int \frac{d^3p}{(2\pi)^3} E f(p)$

• (non relativistic), that is MB, FD or BE, small $T (E \simeq m \gg T)$: $E \simeq m + p^2/(2mT), x \equiv p/\sqrt{2mT}$ as before Same steps as before, now get $\rho = m \cdot n \left(1 + \frac{3T}{2m}\right)$

1b

Repeat the previous exercise, but now compute $\rho = g \int \frac{d^3p}{(2\pi)^3} Ef(p)$

• (non relativistic), that is MB, FD or BE, small $T \ (E \simeq m \gg T)$: $E \simeq m + p^2/(2mT), \ x \equiv p/\sqrt{2mT}$ as before Same steps as before, now get $\rho = m \cdot n \left(1 + \frac{3T}{2m}\right)$

• MB, large T, $E \simeq p$: use $x \equiv p/T$, so ...

1b

Repeat the previous exercise, but now compute $\rho = g \int \frac{d^3p}{(2\pi)^3} Ef(p)$

• (non relativistic), that is MB, FD or BE, small $T (E \simeq m \gg T)$: $E \simeq m + p^2/(2mT), x \equiv p/\sqrt{2mT}$ as before Same steps as before, now get $\rho = m \cdot n \left(1 + \frac{3T}{2m}\right)$

• MB, large T, $E \simeq p$: use $x \equiv p/T$, so . . .

• FD/BE, large T, $E \simeq p$: $x \equiv p/T$, so $\rho = \frac{T^4}{\pi^2} \int_0^\infty dx \frac{x^3}{e^x \pm 1}$

As done for computing *n*, use the $\zeta(n)$ definition:

 $\mathsf{BE} \to \ \zeta(4) \Gamma(4) = \ \pi^4 / 15 \qquad \qquad \mathsf{FD} \to \ 7 / 8 \zeta(4) \Gamma(4) = \ 7 \pi^4 / 120$



2 Determine $\eta_b \equiv n_b/n_\gamma$ in terms of $\Omega_b h^2$.

Baryon asymmetry

2 Determine $\eta_b \equiv n_b/n_\gamma$ in terms of $\Omega_b h^2$. Solution start from $n_b = \frac{\rho_b}{m_p} = \frac{\rho_{crit}\Omega_b}{m_p}$ $[\Omega_i \equiv \rho_i/\rho_{crit}]$

where $\rho_{\it crit}\simeq 1.88 h^2\times 10^{-32}~{\rm kg~cm^{-3}}$ and $m_p\simeq 1.7\times 10^{-27}~{\rm kg}$

photon number density: $\rho_{\gamma} \simeq 410 \text{ cm}^{-3}$

Baryon asymmetry

2 Determine
$$\eta_b \equiv n_b/n_\gamma$$
 in terms of $\Omega_b h^2$.
Solution
start from $n_b = \frac{\rho_b}{m_p} = \frac{\rho_{crit}\Omega_b}{m_p}$ $[\Omega_i \equiv \rho_i/\rho_{crit}]$

where $ho_{crit}\simeq 1.88 h^2 imes 10^{-32}~{
m kg~cm^{-3}}$ and $m_p\simeq 1.7 imes 10^{-27}~{
m kg}$

photon number density: $ho_\gamma \simeq 410~{
m cm}^{-3}$

put everything together ...

$$\left(\eta_b \simeq \frac{\Omega_b h^2 \ 1.88 \times 10^{-32} \ \text{kg cm}^{-3}}{1.7 \times 10^{-27} \ \text{kg}} \ \frac{1}{410 \ \text{cm}^{-3}} \simeq 2.7 \times 10^{-8} \ \Omega_b h^2\right)$$

Baryon asymmetry

2 Determine
$$\eta_b \equiv n_b/n_\gamma$$
 in terms of $\Omega_b h^2$.
Solution
start from $n_b = \frac{\rho_b}{m_p} = \frac{\rho_{crit}\Omega_b}{m_p}$ $[\Omega_i \equiv \rho_i/\rho_{crit}]$

where $ho_{crit}\simeq 1.88 h^2 imes 10^{-32}~{
m kg~cm^{-3}}$ and $m_p\simeq 1.7 imes 10^{-27}~{
m kg}$

photon number density: $ho_\gamma \simeq 410~{
m cm}^{-3}$

put everything together...

Baryon-to-photon ratio



Determine the evolution of $R\equiv {3
ho_b\over 4
ho_\gamma}$ as a function of a.

You can use $\Omega_\gamma^0 h^2 \simeq 2.5 imes 10^{-5}$ today

Baryon-to-photon ratio



Determine the evolution of $R\equiv {3
ho_b\over 4
ho_\gamma}$ as a function of a.

You can use
$$\Omega^0_\gamma h^2 \simeq 2.5 imes 10^{-5}$$
 today

Solution

Start from
$$ho_b \propto T^3$$
 and $ho_\gamma \propto T^4$

remember
$$aT = a_0T_0$$
 and $a_0 = 1$

Then you have
$$rac{
ho_\gamma(T)}{
ho_\gamma^0}=\left(rac{T}{T_0}
ight)^4=a^{-4}$$
 and also $ho_b(T)=
ho_b^0\,a^{-3}$

Baryon-to-photon ratio



Determine the evolution of $R\equiv {3
ho_b\over 4
ho_\gamma}$ as a function of a.

You can use
$$\Omega^0_\gamma h^2 \simeq 2.5 imes 10^{-5}$$
 today

Solution

Start from
$$ho_b \propto T^3$$
 and $ho_\gamma \propto T^4$

remember
$$aT = a_0 T_0$$
 and $a_0 = 1$

Then you have
$$rac{
ho_\gamma(T)}{
ho_\gamma^0}=\left(rac{T}{T_0}
ight)^4=a^{-4}$$
 and also $ho_b(T)=
ho_b^0\,a^{-3}$

$$\left(R = \frac{3\rho_b^0 a^{-3}}{4\rho_\gamma^0 a^{-4}} = a \frac{3\Omega_b^0 \rho_{crit}^0}{4\Omega_\gamma^0 \rho_{crit}^0} = 3 \times 10^4 a \Omega_b^0 h^2\right)$$