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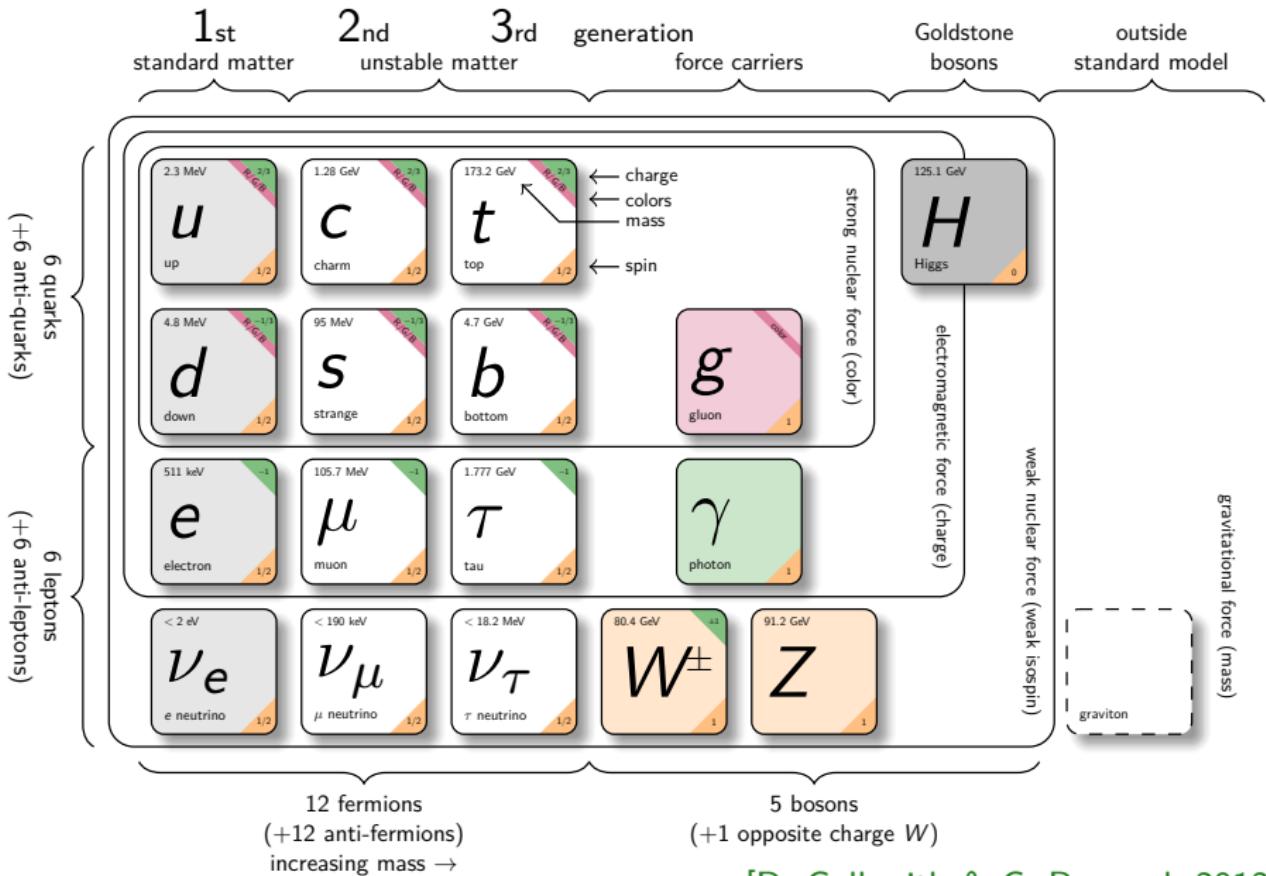
<http://personalpages.to.infn.it/~gariazzo/>

# NEURAL

*Neutrinos Re-fitted with Active Learning*

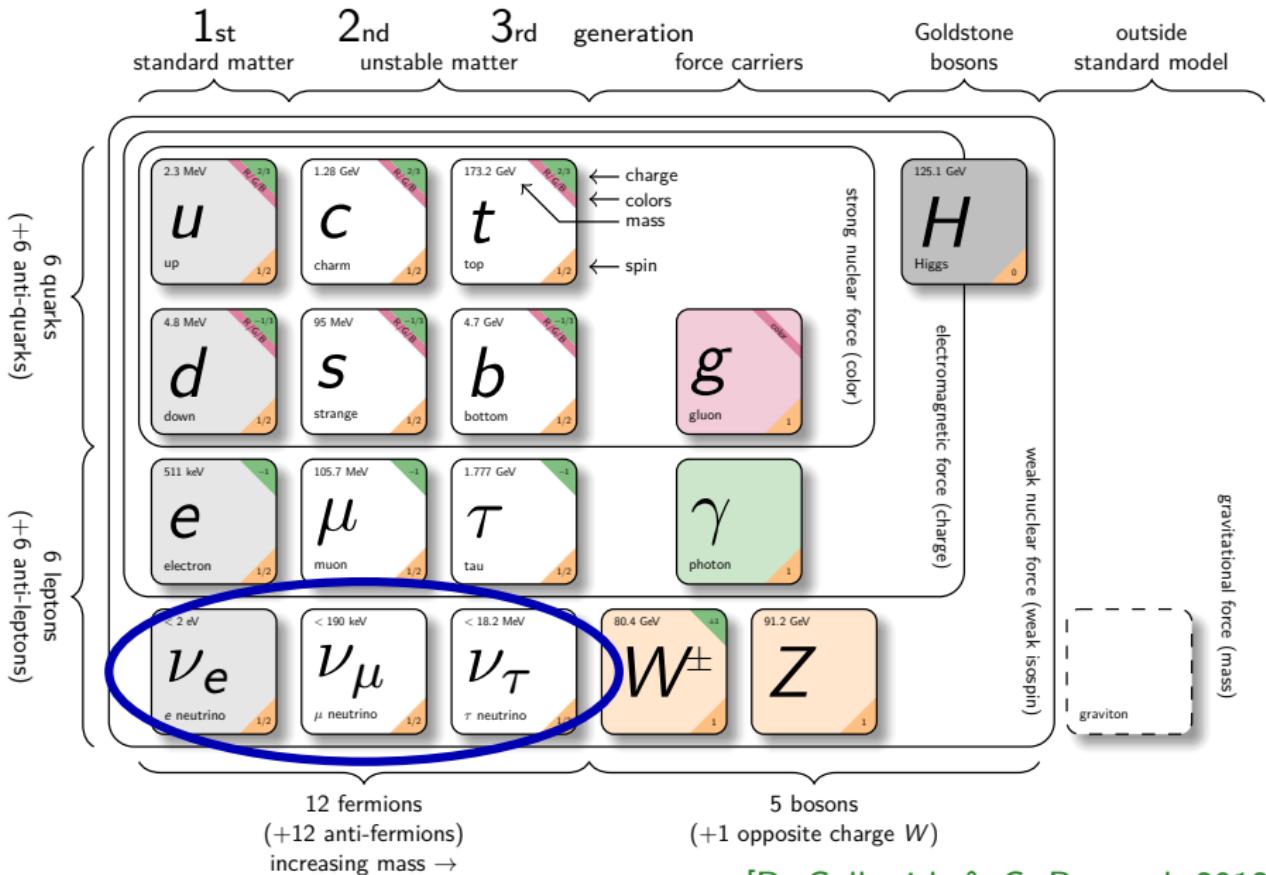
General Meeting of the Fellini programme, 14/02/2023

# The Standard Model of Particle Physics



[D. Galbraith & C. Burgard, 2012]

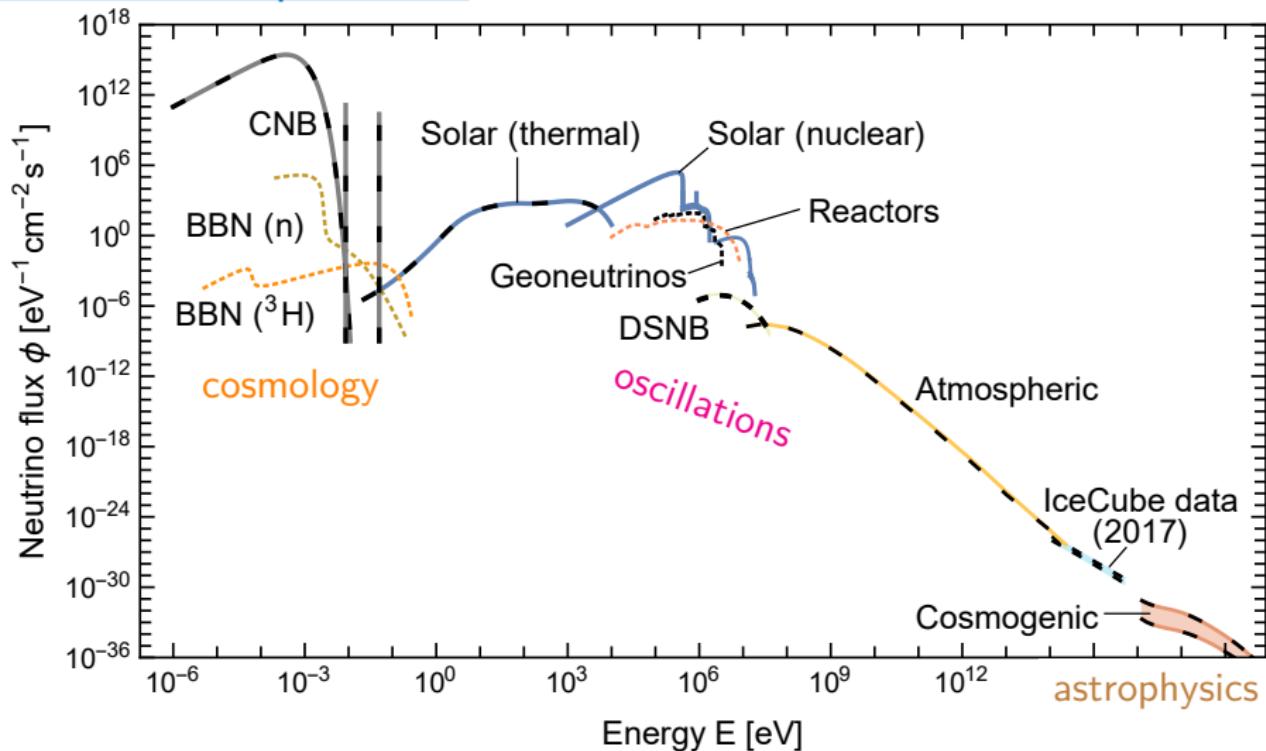
# The Standard Model of Particle Physics



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# Neutrino spectrum

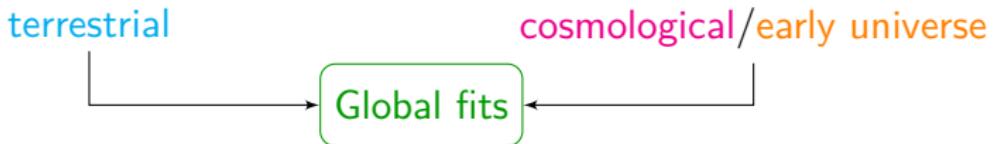
[Vitagliano+, RMP 92 (2020)]



neutrinos at all energies provide valuable information!

# NEURAL: Neutrinos Re-fitted with Active Learning

We obtain neutrino properties from different probes:



Numerical techniques for global fits need improvements:

multi-parameter fits      systematic parameters      computation time

Many of these issues can be addressed with machine learning methods!

advanced interpolation  
of pre-computed results

smart selection of points  
for training neural networks

Other issues must be tackled with new numerical codes

Neutrino calculations at  
terrestrial experiments

early universe (neu-  
trino decoupling+BBN)

extended proposal submitted as ERC StG 2023 (evaluation ongoing)

## ■ Publications

- de Salas+, JHEP 02 (2021) 071 [arxiv:2006.11237].
- Archidiacono+, JCAP 12 (2020) 029 [arxiv:2006.12885].
- Vagnozzi+, Phys.Dark Univ. 33 (2021) 100851 [arxiv:2010.02230].
- Bennett+, JCAP 04 (2021) 073 [arxiv:2012.02726].
- Gariazzo+ CPC 271 (2022) 108205 [arxiv:2103.05027].
- de Salas+, Phys.Lett.B 820 (2021) 136508 [arxiv:2105.08168].
- di Valentino+, Phys.Rev.D 104 (2021) 083504 [arxiv:2106.15267].
- di Valentino+, Phys.Rev.D 105 (2022) 103511 [arxiv:2110.03990].
- Gariazzo+, Phys.Rev.D 106 (2022) 023530 [arxiv:2111.03152].
- Corona+, JCAP 06 (2022) 010 [arxiv:2112.00037].
- Archidiacono+, Universe 8 (2022) 175 [arxiv:2201.10319].
- Gariazzo+, JCAP 10 (2022) 010 [arxiv:2205.02195].
- di Valentino+, Phys.Rev.D 106 (2022) 043540 [arxiv:2207.05167].
- Gariazzo+, under review [arxiv:2211.10522].
- di Valentino+, under review [arxiv:2212.11926].

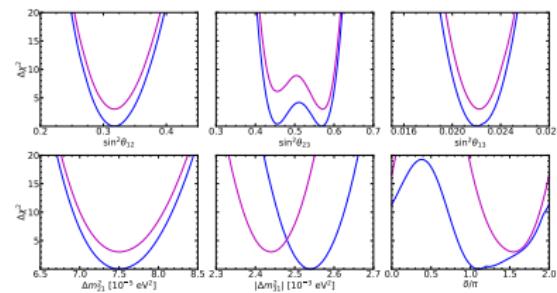
## 1 Constraints on neutrino properties

## 2 Neutrinos in the universe

## 3 Secondment in Chile (12/2021–05/2022)

## 4 Secondment in Valencia (03-09/2023)

## 5 Conclusions



# Three Neutrino Oscillations

Analogous to CKM mixing for quarks:

[Pontecorvo, 1968]

[Maki, Nakagawa, Sakata, 1962]

$$\nu_\alpha = \sum_{k=1}^3 U_{\alpha k} \nu_k \quad (\alpha = e, \mu, \tau)$$

$\nu_\alpha$  flavour eigenstates,  $U_{\alpha k}$  PMNS mixing matrix,  $\nu_k$  mass eigenstates.

Current knowledge of the 3 active  $\nu$  mixing: [JHEP 02 (2021)]

$$\Delta m_{ji}^2 = m_j^2 - m_i^2, \theta_{ij} \text{ mixing angles}$$

NO/NH: Normal Ordering/Hierarchy,  $m_1 < m_2 < m_3$

IO/IH: Inverted O/H,  $m_3 < m_1 < m_2$

$$\Delta m_{21}^2 = (7.50^{+0.22}) \cdot 10^{-5} \text{ eV}^2$$

$$|\Delta m_{31}^2| = (2.54 \pm 0.03) \cdot 10^{-3} \text{ eV}^2 \text{ (NO)}$$
$$= (2.44 \pm 0.03) \cdot 10^{-3} \text{ eV}^2 \text{ (IO)}$$

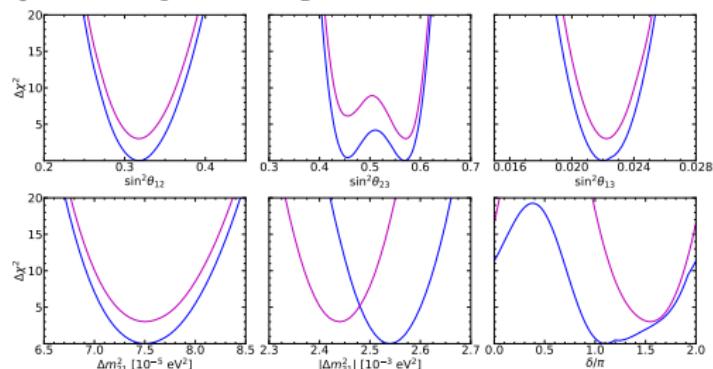
$$10 \sin^2(\theta_{12}) = 3.18 \pm 0.16$$

$$10^2 \sin^2(\theta_{13}) = 2.200^{+0.069}_{-0.062} \text{ (NO)}$$
$$= 2.225^{+0.064}_{-0.070} \text{ (IO)}$$

$$10 \sin^2(\theta_{23}) = 4.55 \pm 0.13 \text{ (NO)}$$
$$= 5.71^{+0.14}_{-0.17} \text{ (IO)}$$

$$\delta/\pi = 1.10^{+0.27}_{-0.12} \text{ (NO)}$$

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mass ordering  
still unknown

$\delta$  still unknown

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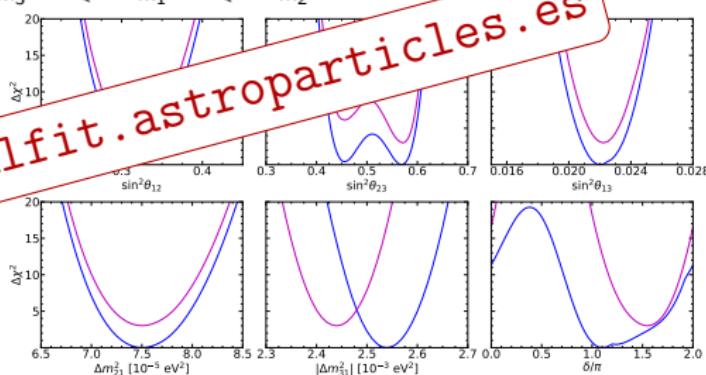
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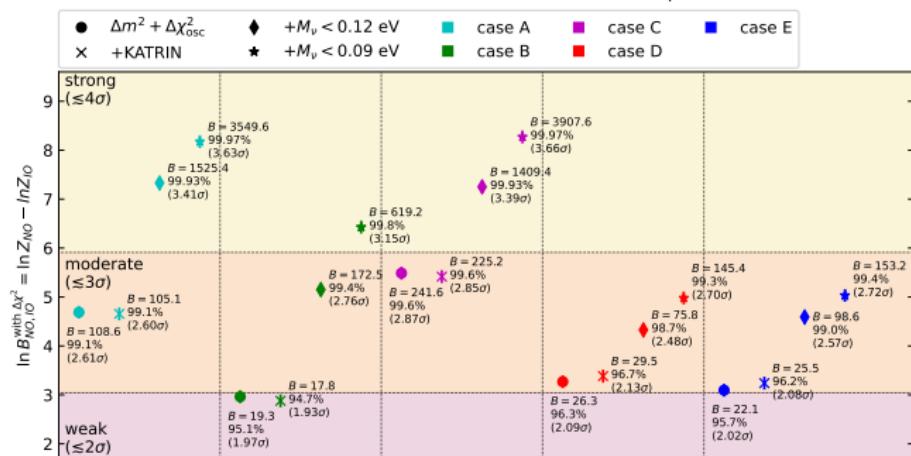
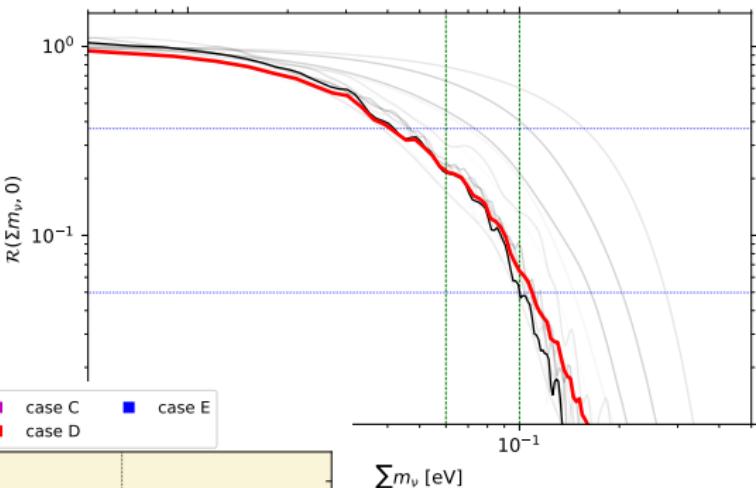
# Constraints on $\nu$ masses and mass ordering

## Constraints on $\Sigma m_\nu$ :

marginalize over extended cosmological models

$\Sigma m_\nu \lesssim 0.1$  eV at 95% CL,  
Planck+BAO+SN

[PRD 106 (2022)]



Constraints on mass ordering: careful with the choice of parameterizations/priors for Bayesian model comparison [JCAP 10 (2022)]

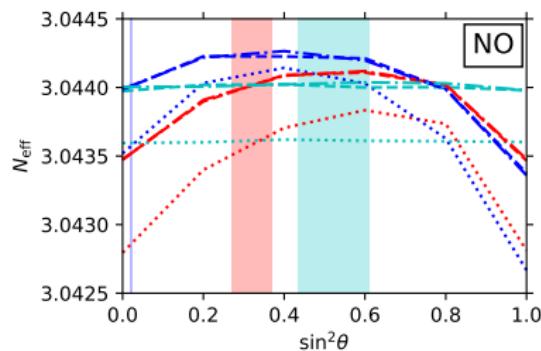
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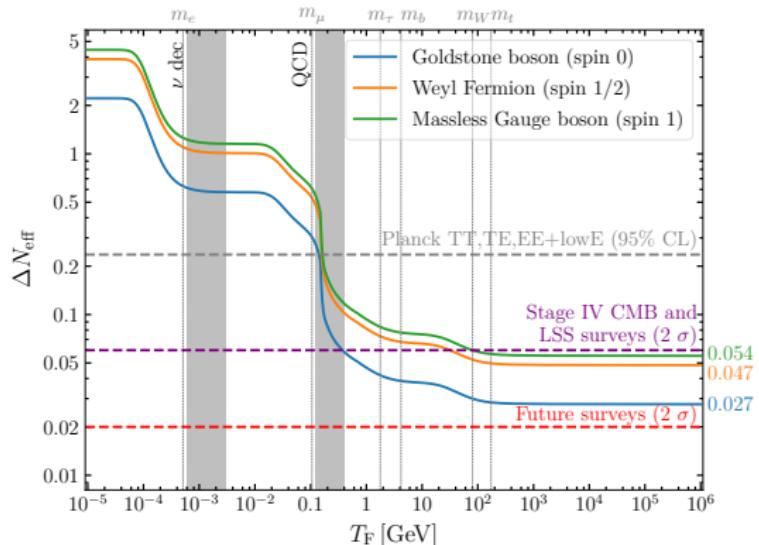
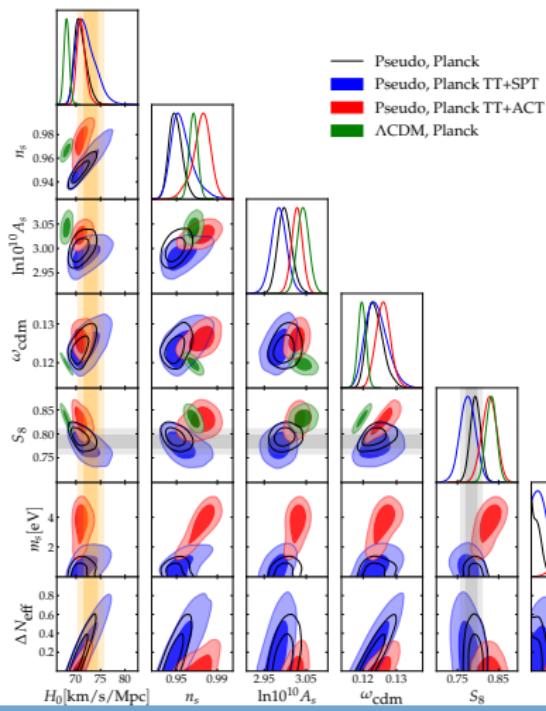
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# Dark radiation studies

## Review [Universe 8 (2022)]: status of dark radiation (including light sterile neutrino) searches



Light sterile neutrino:  
 $m_s \sim \mathcal{O}(\text{eV})$   
as a solution of the Planck vs  
ACT discrepancy?  
[JCAP 06 (2022) 010]

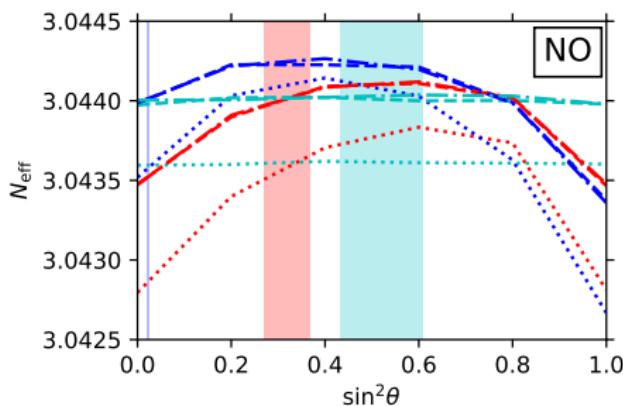
# Early universe calculations (public codes)

Neutrino decoupling:

state-of-the-art  $N_{\text{eff}} = 3.044$

plus study of dependence on  
oscillation and numerical parameters

[JCAP 04 (2021)]



see FortEPiano code

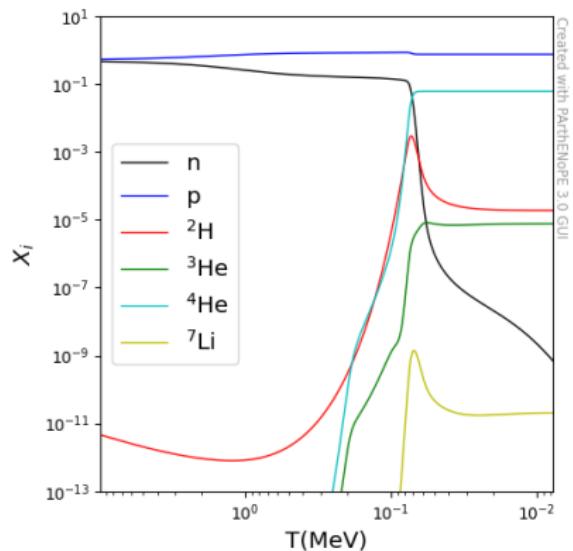
[https://bitbucket.org/ahep\\_cosmo/fortepiano\\_public/src](https://bitbucket.org/ahep_cosmo/fortepiano_public/src)

Big Bang Nucleosynthesis:

PArthENoPE v3.0

[CPC 271 (2022)]

<http://parthenope.na.infn.it/>



updated nuclear rates af-  
ter LUNA results, new GUI

# Neutrino properties from early universe physics

Impact of non-standard neutrino properties on neutrino decoupling:

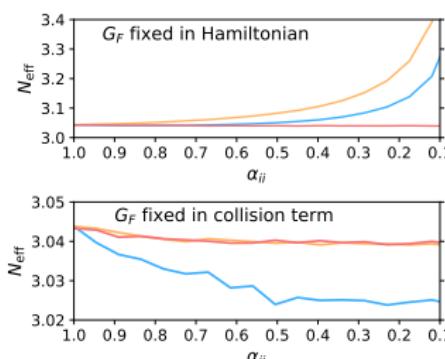
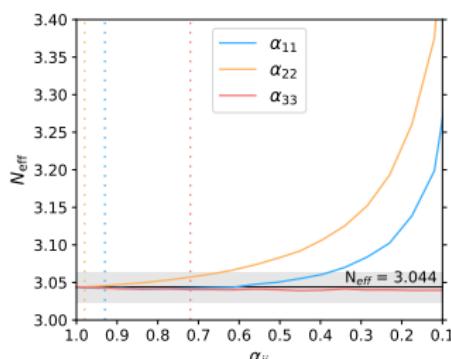
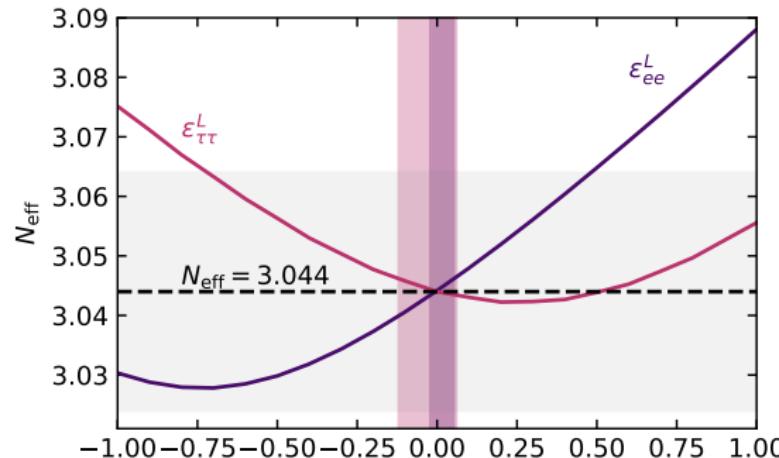
## Non-Standard Interactions

between  $\nu_e$  and electrons:

constraints on the *diagonal and off-diagonal*

new couplings  $\epsilon_{\alpha\beta}^{L,R}$

[PLB 820 (2021)]



**Non-Unitarity (NU) of the mixing matrix:**  
constraints on *diagonal and off-diagonal*  
NU parameters  $\alpha_{ij}$   
[arxiv:2211.10522]

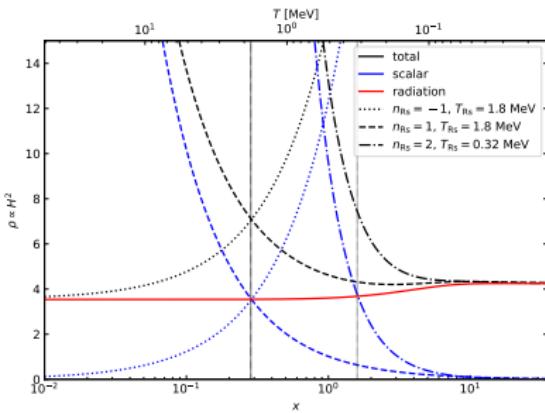
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## Additional particles in the early universe?

Sterile neutrinos are coupled via oscillations to the thermal plasma  
(photons, electrons, neutrinos, (muons), ...)

What if we add a decoupled particle?

let us assume a non-standard evolution of the energy density:  $\bar{\rho}_{\text{Rs}} \propto a^{n_{\text{Rs}}+4}$   
 $n_{\text{Rs}} = 0 \rightarrow \text{radiation}$ ;  $n_{\text{Rs}} = -1 \rightarrow \text{matter}$ ;  $n_{\text{Rs}} = -2 \rightarrow \text{curvature}$ , ...

effect on early universe phenomena is purely gravitational

total energy density:  $\rho = \rho_\gamma + \rho_e + \rho_\nu + \delta\rho_{\text{FTQED}} + \rho_{\text{Rs}}$

Hubble factor:  $H^2 = 8\pi\rho/(3M_{\text{Pl}}^2)$

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neutrino decoupling:  $\frac{d\varrho(y)}{dx} = \frac{1}{xH} \left\{ -i\frac{x^3}{m_e^3} [\mathcal{H}_{\text{eff}}, \varrho] + \frac{m_e^3}{x^3} \mathcal{I}(\varrho) \right\}$

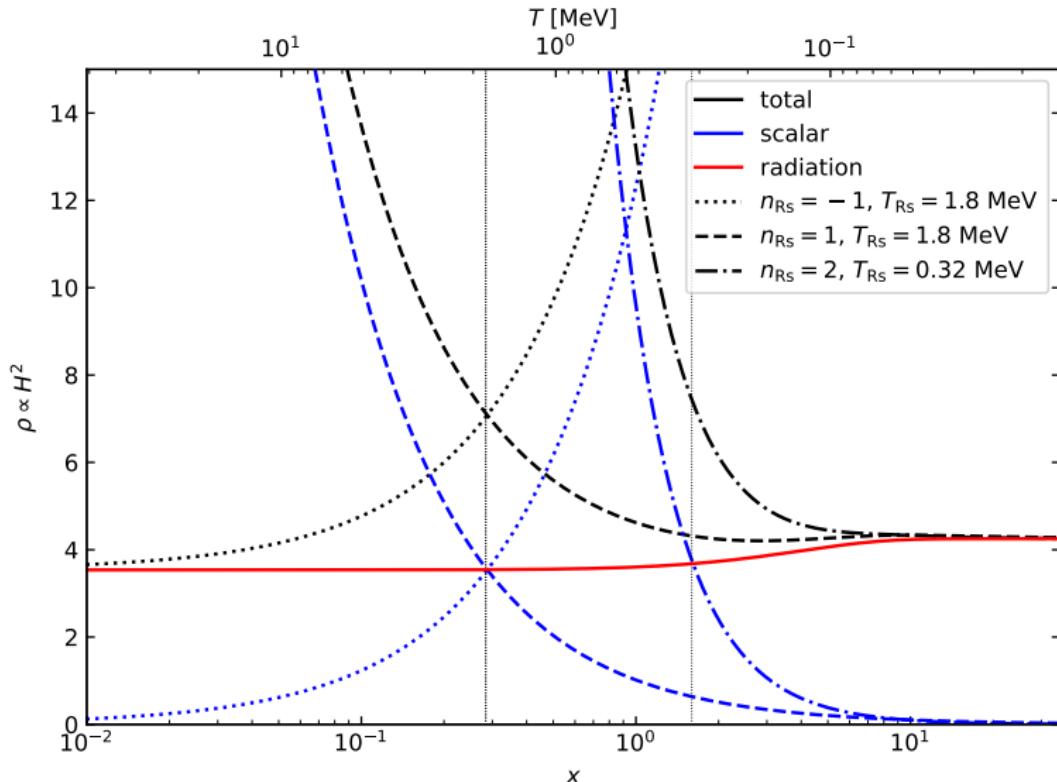
BBN abundances:  $\frac{dX_i}{dx} = \frac{\Gamma_i}{xH}$

$X_i = n_i/N_B$  abundance relative to total baryons,  $\Gamma_i$  effective reaction rate for nuclide  $i$

# Results from $N_{\text{eff}}$

consider  $\rho_{\text{Rs}} = \rho_{\text{rad}}$  at  $x_{\text{Rs}} = m_e/T_{\text{Rs}}$  for the new particle

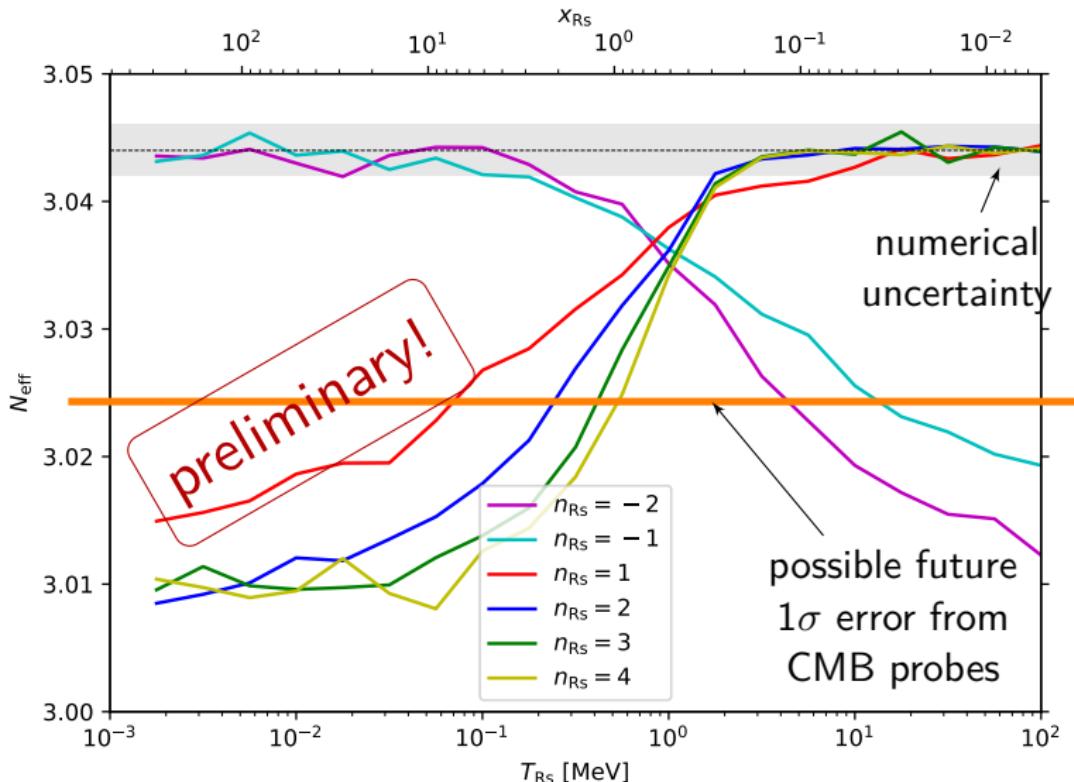
Evolution of the energy density:



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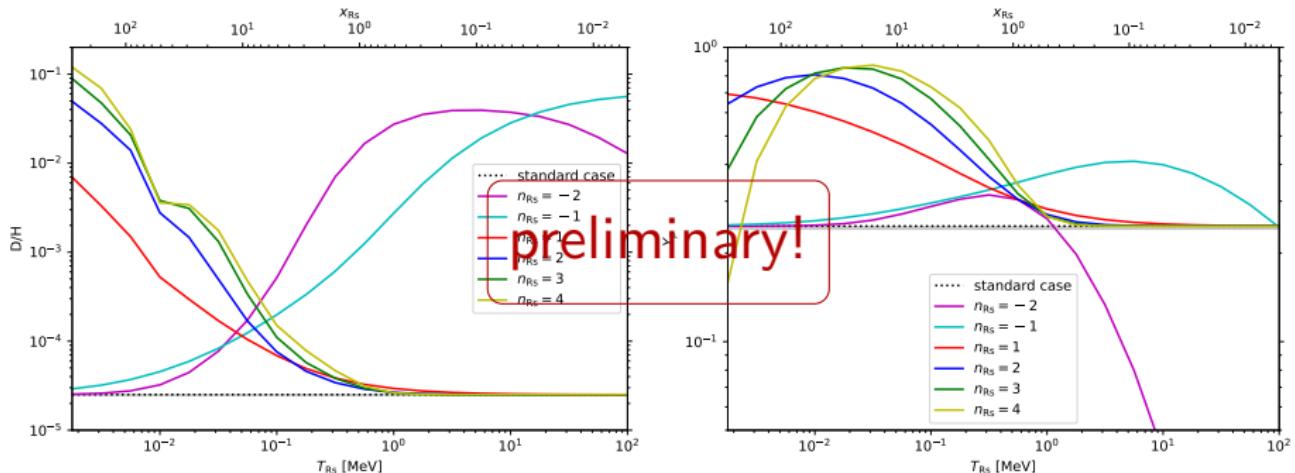
From neutrino decoupling we obtain:



# Results from BBN

consider  $\rho_{\text{Rs}} = \rho_{\text{rad}}$  at  $x_{\text{Rs}} = m_e/T_{\text{Rs}}$  for the new particle

Compare to current measurements (Deuterium, Helium):



error bands (gray) are current constraints on the abundances  
barely visible!! even current precision can strongly constrain  $T_{\text{Rs}}$

calculations ongoing with prof. D. Aristizabal and A. Villanueva (UTFSM)

1 *Constraints on neutrino properties*

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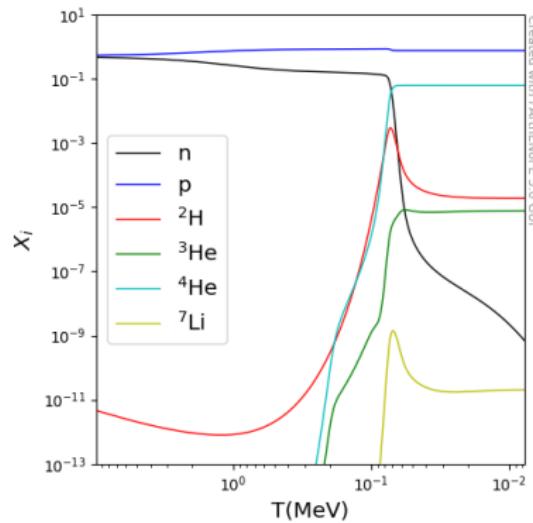
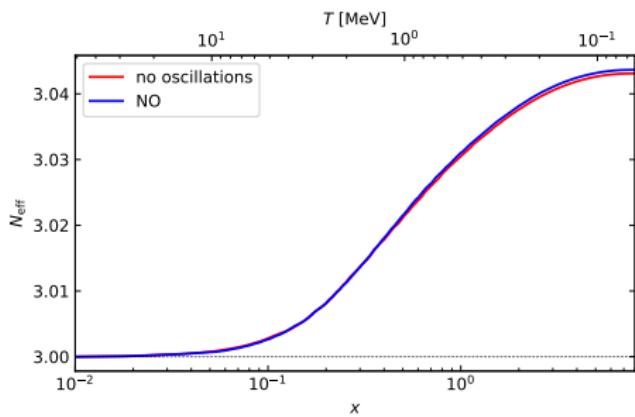
5 *Conclusions*

# Neutrino decoupling and BBN

NSI/NU constraints in previous slides only through  $N_{\text{eff}}$ , what about BBN?

BBN has not been studied much with non-standard neutrino physics

Neutrino decoupling and BBN occur almost at the same time!



in preparation: neutrino decoupling+BBN code

secondment in collaboration with dr. S. Pastor, student P. Muñoz

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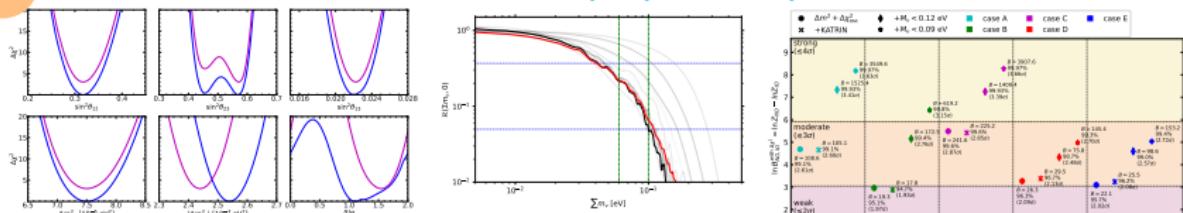
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# Conclusions

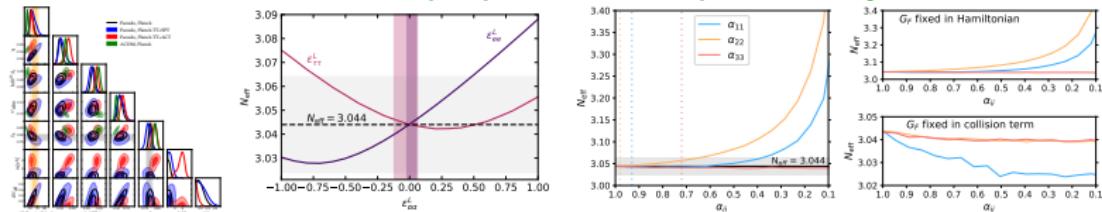
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## Standard neutrino properties: precision



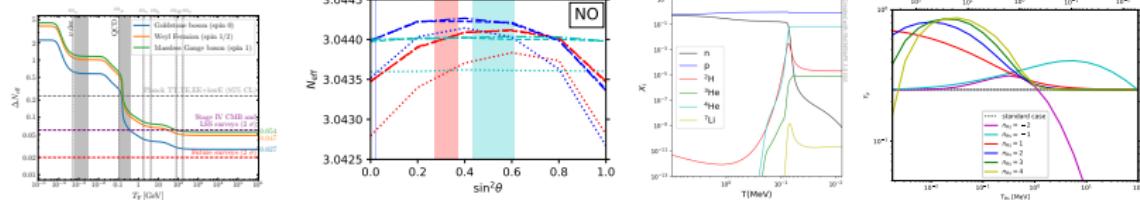
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## Non-standard neutrino properties: complementary constraints



3

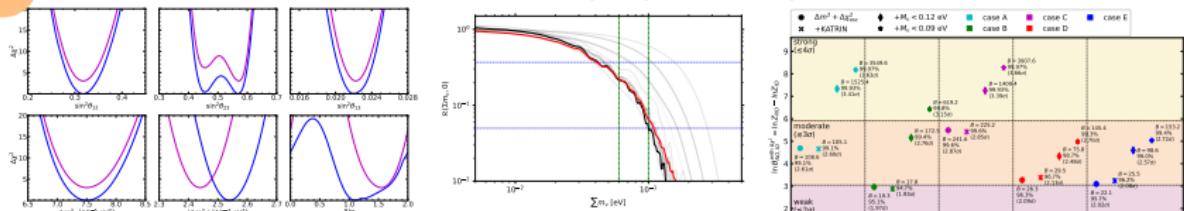
## Early universe probes must be studied better!



# Conclusions

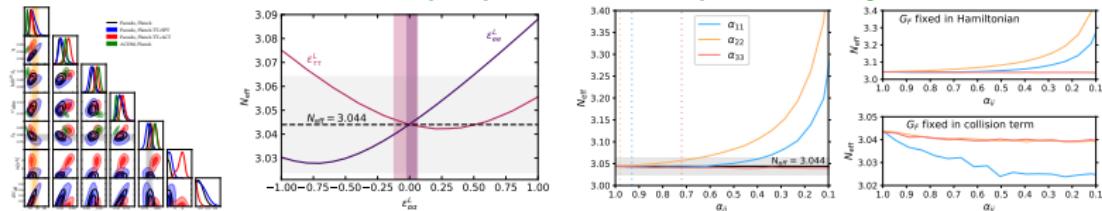
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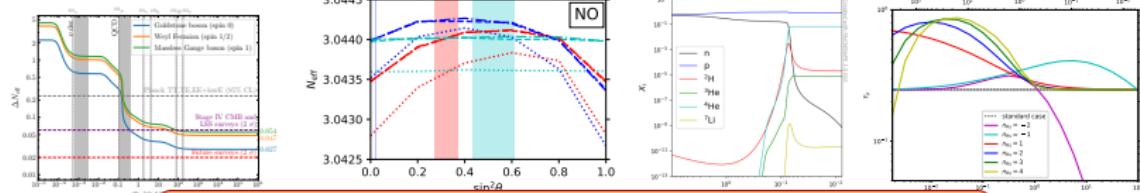
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3

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Thanks for your attention!