### Nuclear equation of state from nuclear experiments and neutron stars observations

IRL NPA workshop on Dense Matter EoS, FRIB, East Lansing, Michigan Pietro Klausner 31/10/2024







## Collaborators

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# Structure of the presentation

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Nuclear equation of state from nuclear experiments and neutron stars observations

#### **- First Part: constraints on EoS from nuclear experiments1**

- Bayesian inference - Skyrme Interaction

#### **- Second Part: constraints on EoS from Neutron Stars observations**

- Second Bayesian inference





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## Parameters of the model



#### Parameters



**Effective** masses

 $0 =$  isoscalar;  $1 =$  isovector

*<sup>ρ</sup>*0, *<sup>E</sup>*0, *<sup>K</sup>*0, *<sup>J</sup>*, *<sup>L</sup>* Nuclear matter parameters

Surface term  $G_0, G_1$  **G** barameters

> Spin-orbit parameter

*m*\* <sup>0</sup> /*m*, *m*\* <sup>1</sup> /*m*

 $W_0$ 

## Parameters of the model

**2** 1L.-W. Chen et al. Phys. Rev. C 80, 014322 (2009)



**Effective** masses

 $0 =$  isoscalar;  $1 =$  isovector

### Parameters



1-to-1 correspondence with usual Skyrme parameters<sup>1!</sup>

*<sup>ρ</sup>*0, *<sup>E</sup>*0, *<sup>K</sup>*0, *<sup>J</sup>*, *<sup>L</sup>* Nuclear matter parameters

> Spin-orbit parameter

Surface term parameters

*m*\* <sup>0</sup> /*m*, *m*\* <sup>1</sup> /*m*

 $G_0, G_1$ 

 $W_0$ 

*<sup>ρ</sup>*0, *<sup>E</sup>*0, *<sup>K</sup>*0, *<sup>J</sup>*, *<sup>L</sup>* Nuclear matter parameters related to the above-introduced parameters as follows:  $T_{\text{S}}$  defined above, with the only except  $\frac{1}{2}$ 



**Effective** masses

Spin-orbit parameter  $W_0$  one op the original with one or the original spin-original  $W_0$  $\frac{1}{2}$  and the nuclear matter parameterial matter parameteristic with the nuclear matter parameteristic matter parameteristic matter  $\frac{1}{2}$ 

 $\Omega = i$ eorglar: 1  $-$  ienvecto tion is in the secondary of the list boundaries are listed in Table I.  $0 =$  isoscalar;  $1 =$  isovector

1-to-1 correspondence with usual and exprime parameters (see Table 1) Skyrme parameters<sup>1!</sup>

Surface term  $G_0, G_1$  **G** parameters  $G_0, G_1$  buildce Skyrme's parameters defined above (see Refs. [18, 19]).

#### Parameters of the model We will use for the surface parameters *<sup>G</sup>*<sup>0</sup> ⌘ *C*⇢ *Parame* term. Also, for simplicity in our notation, we use *W*<sup>0</sup> to  $T_{\rm max}$  of the prior delated been as of the though in the sense in discutere come discutere come discutere come discutere (brevemente) la stabilitativa dei risultativa discutere<br>Come discutere come discutere discutere discutere discutere discutere discutere discutere discutere discutere

### indicate the spin-orbit parameter. This coincides with



 $W_0$ 

 $m_0^*/m, m_1^*/m$ 





1L.-W. Chen et al. Phys. Rev. C 80, 014322 (2009)



## Observable chosen for the fit

"hfbcs-qrpa1" code to compute observables from parameters





#### Observable chosen for the fit Table 1: Observables and initial adopted errors (see text for details).



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> $\bm{B}$  .  $\bm{E}$  . : Binding Energy : Charge radius *Rch*  $\Delta E_{SO}$  : Spin-orbit splitting





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1G. Colò, X. Roca-Maza, arXiv:2102.06562v1 [nucl-th]









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\* Theoretical error



## The need for emulation

#### $\longrightarrow$  Computing all the observables  $\longrightarrow$  ~2 hours!



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Bayesian inference (Sampling: Metropolis- $\longrightarrow$  10<sup>6-7</sup> model evaluations! Hastings algorithm)

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# The need for emulation

Computing all the observables  $\longrightarrow$   $\sim$  2 hours!  $\longrightarrow$ 

> 2 h. x 10'000'000 points… Just too much time

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**4** 1https://madai.phy.duke.edu/



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## Corner plot and mean values







### Posterior observables means and uncertainties

#### $|\mu_{exp} - \mu_{theo}|$  in units of  $\sigma_c$

#### Inference

$$
\begin{array}{c} \vdots \left[1,2\right)\sigma_c \\ \vdots \left[2,\infty\right)\sigma_c \end{array}
$$

#### Experiment  $T$

<sup>3</sup>Zalewski et al., Phys. Rev. C **77**, 024316 (2008) Isoscalar resonances  $AC/2$ <sup>208</sup>Pb 13.5 *<sup>±</sup>* 0.1 10.9 *<sup>±</sup>* 0.3



Isoscalar resonances Fivierig vvarig *et al 202* i<br>*Chinese Phys. C* 45 030003 <sup>208</sup>Pb 13*.*<sup>5</sup> *<sup>±</sup>* <sup>0</sup>*.*3 10*.*<sup>8</sup> *<sup>±</sup>* <sup>0</sup>*.*<sup>4</sup> 1Meng Wang *et al* 2021



2Angeli et al., Atomic Data and Nuclear Data Tables 99 (2013)

 $\mathsf{V}$  $= \sqrt{\sigma_{exp}^2 + \sigma_{theo}^2}$ 





#### Posterior observables means and uncertainties GROUND-STATE PROPERTIES Table 2: Observables and initial adopted errors (see text for details). The contract for details  $\mathbf{r}$ aground-state properties properties and the properties of the properties of the properties of the properties o<br>Second-state properties of the properti

#### $\frac{1}{4}$  1<sup>1</sup>  $\frac{1}{4}$   $\frac{1}{4}$   $\frac{1}{4}$   $\frac{1}{4}$   $\frac{1}{4}$  $|\mu_{exp} - \mu_{theo}|$  in units of  $\sigma_c$ <sup>68</sup>Ni 590 *<sup>±</sup>* <sup>1</sup>*.*0- -

#### $Inference$ <sup>90</sup>Zr 784 *<sup>±</sup>* <sup>1</sup>*.*3 4*.*<sup>27</sup> *<sup>±</sup>* <sup>0</sup>*.*02 -

#### Inference Experiment <sup>90</sup>Zr 783.9 *<sup>±</sup>* <sup>1</sup> ⇥ <sup>10</sup><sup>4</sup> 4.27 *<sup>±</sup>* 0.001 -

*B.E.* [MeV] *R*ch [fm] *E*SO [MeV]





$$
=\sqrt{\sigma_{exp}^2+\sigma_{theo}^2}
$$

2Y.K. Gupta et al., Physics Letters B

3Youngblood et al., Phys. Rev. C 69, 034315 (2004)

$$
\frac{1}{\exp + \sigma_{theo}^2}
$$
 : [1,2)  $\sigma_c$   
 : [2,  $\infty$ )  $\sigma_c$ 

*B.E.*<sup>1</sup> [MeV] *R*ch

<sup>2</sup> [fm] *E*SO

<sup>3</sup> [MeV]



#### Inference Experiment <sup>90</sup>Zr 17.7 *<sup>±</sup>* 0 -

<sup>68</sup>Ni 590.4 *<sup>±</sup>* 0- -







#### <sup>48</sup>Ca 416.0 *<sup>±</sup>* 0 3.48 *<sup>±</sup>* 0 1.72 *<sup>±</sup>* 0\* ns and uncertaintic  $\overline{1}$ Posterior observables means and uncertainties <sup>48</sup>Ca 417 *<sup>±</sup>* <sup>1</sup>*.*2 3*.*<sup>51</sup> *<sup>±</sup>* <sup>0</sup>*.*02 1*.*<sup>92</sup> *<sup>±</sup>* <sup>0</sup>*.*<sup>20</sup> **Posterior observa** <sup>56</sup>Ni 482 *<sup>±</sup>* <sup>1</sup>*.*4- -

#### $\frac{1}{2}$   $\frac{1}{2}$   $\frac{1}{2}$   $\frac{1}{2}$  in  $\frac{1}{2}$  $|\mu_{exp} - \mu_{theo}|$  in units of  $\sigma_c$

#### $I$ nference <sup>90</sup>Zr 17*.*<sup>8</sup> *<sup>±</sup>* <sup>0</sup>*.*4 -

framework of Bayesian inference, and the parameters are fit on data framework of Bayesian inference, and the p<br>Inference, and the parameters are fit on data from nuclear from nuclear from nuclear from nuclear from nuclear et al., Phys. 4PREX Collaboration, Phys. 5CREX Collaboration, Phys. 4309 (2020) Rev. Lett. 126, 172502 (2021) Rev. Lett. 129, 042501 (2022) **7** <sup>1</sup>Tamii et al., PRL <sup>2</sup>Birkhan et al., PRL <sup>3</sup>S. GORIELY et al., Phys. 107, 062502 (2011) 118, 252501 (2017) Rev. C 102, 064309 (2020) 1Tamii et al., PRL 107, 062502 (2011) 2Birkhan et al., PRL 118, 252501 (2017) 4PREX Collaboration, Phys. Rev. Lett. 126, 172502 (2021)

$$
\begin{array}{ccc}\n & \cdot & [1,2) \sigma_c \\
\hline\n\tau_{theo} & & \cdot & [2,\infty) \sigma_c\n\end{array}
$$

<sup>68</sup>Ni 590 *<sup>±</sup>* <sup>1</sup>*.*0- -



$$
=\sqrt{\sigma_{exp}^2+\sigma_{theo}^2}
$$

# Why is L so small?









# Effect of  $A_{PV}$  without  $\alpha_D$



**10**

#### Sensitivity analysis: *J* fixed Training grids

- *L* only free parameter - fixed to (28,…,38) MeV *J* Other parameters fixed at best log(Likelihood) values

**10**

#### Sensitivity analysis: *J* fixed Training grids



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**10**

#### Sensitivity analysis: *J* fixed Training grids

Which is the optimal observable set that encodes all the necessary information to constrain the nuclear matter parameters? Which should be their uncertainties?



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Meta-Model (M.M.): Taylor expansion of the nuclear equation of state around saturation<sup>1</sup>

1Margueron et al., Phys. Rev. C **97**, 025805 (2018) **11**



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## **M.M. Neutron star EoS**<sup>2</sup>

<sup>1</sup>Margueron et al., Phys. Rev. C 97, 025805 (2018) <sup>2</sup>Developed by T. Carreau and later by H. Dinh-Tin 11







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Crust computed consistently in extended Thomas Fermi





Meta-Model (M.M.): Taylor expansion of the nuclear equation of state around saturation<sup>1</sup>

# **M.M. Neutron star EoS**<sup>2</sup> **Neutron star observables!**

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Crust computed consistently in extended Thomas Fermi





**Parameters and prior distribution:**



*ρ*0, *E*0, *K*0, *J*, *L*, *m*\* <sup>0</sup> /*m*, *m*\* <sup>1</sup> /*m*  $Q_0$ ,  $Z_0$ ,  $Q_{sym}$ ,  $Z_{sym}$ *Ksym*

#### **Parameters and prior distribution:**

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Previous Posterior distribution



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#### **Parameters and prior distribution:**

Previous Posterior distribution



#### **Parameters and prior distribution:**

*ρ*0, *E*0, *K*0, *J*, *L*, *m*\* <sup>0</sup> /*m*, *m*\* <sup>1</sup> /*m*  $Q_0$ ,  $Z_0$ ,  $Q_{sym}$ ,  $Z_{sym}$ *Ksym Ksym*



Previous Posterior distribution

 $K_{sym} = K_{sym}(\rho_0, E_0, K_0, ...) \longrightarrow$  Not a free parameter!





*ρ*0, *E*0, *K*0, *J*, *L*, *m*\* <sup>0</sup> /*m*, *m*\* <sup>1</sup> /*m*  $Q_0$ ,  $Z_0$ ,  $Q_{sym}$ ,  $Z_{sym}$ 



#### **Parameters and prior distribution:**

- Previous Posterior distribution
- Uniform distribution  $K_{sym} = K_{sym}(\rho_0, E_0, K_0, ...) \longrightarrow$  **Not a free parameter!**





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- Maximum observed mass of Neutron Star; - Ligo-Virgo-Collaboration tidal deformability results; - NICER mission simultaneous mass-radius
- 
- measurements
- Ab-initio computations of neutron matter at low density

#### **Observational constraints:**

#### **Parameters and prior distribution:**



# Marginalized posteriors



## Equation of State



**14**

- Bayesian statistical analysis on nuclear matter parameters with nuclear

experiments :

- Bayesian statistical analysis on nuclear matter parameters with nuclear

- experiments :
	- Skyrme ansatz

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- Fit with experimental observables of different types (ground state, giant

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with  $A_{PV}$  of <sup>208</sup>Pb  $\,$ 

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- Bayesian statistical analysis on nuclear matter parameters with neutron star observations:
	- Final distribution of parameters informed by both nuclear physics and neutron star observations!

Thank you for your attention!

- was built for GP applied to bayesian inference are created to the created the sum of the sum of the created to a sum of the created to a sum of the Gaussian o random centered about die
- given the parameters prior distributions, it automatically builds the grid
- it does a MCMC to estimate the posterior distribution
- it extracts parameters sample following the posteriors values. TOI



#### **The MADAI package:** The MADAI nackage form assumed in Eq. (9). The curves

# Gaussian process (GP) emulator







## Validation quirement. As for the second, we want the correlation













# $B$  .  $E$  .,  $R_{ch}$  only corner plot





 $m_1^*/m$ 





#### Sensitivity analysis: *J* fixed Posterior distributions





### <sup>68</sup>Ni α<sub>D</sub> posterior distribution



## Crust core properties; crust radius



