Constraining the EoS for neutron star from theory and data

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— Online Talk at S@INT Seminar —

Equation of State for Neutron Stars

### **Compact Stars**



Gravitational force is sustained by the pressure from inside.

**Hydrostatic condition for**  $r \sim r + dr$ 

$$\frac{dp(r)}{dr} = -G\frac{M(r)}{r^2}\varepsilon(r)$$

M(r) represents the integrated mass in r-sphere.

$$\frac{dM(r)}{dr} = 4\pi r^2 \varepsilon(r) \quad \text{One condition is missing!}$$

# Equation of State for Neutron Stars $\frac{dp(r)}{dr} = -G\frac{M(r)}{r^2}\varepsilon(r)$ TOV Equations

General  
Relativistic 
$$\frac{dp(r)}{dr} = -G\frac{M}{r^2}(\varepsilon+p)\left(1+\frac{4\pi r^3 p}{M}\right)\left(1-\frac{2GM}{r}\right)^{-1}$$

### **Missing condition**

A relation between p and  $\varepsilon \longrightarrow Equation of State (EoS)$ 

InitialFinal
$$r = 0$$
 $r = R$  $\varepsilon(r = 0) = \varepsilon_{\max}$  free parameter $p(r = R) = 0$  $p(r = 0) = p_{\max} = p(\varepsilon_{\max})$  $M = \int dr 4\pi r^2 \varepsilon(r)$ 

# EoS from Deep Neural Network EoS from resummed pQCD EoS and gravitational waves

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### **Conventional Model Approach**

### Model $\rightarrow$ Solving TOV $\rightarrow M$ -R Curve $\rightarrow$ Observation



**Initial condition:** 
$$p(r \simeq 0) = p(\rho_{\max}), \quad \varepsilon(r \simeq 0) = \varepsilon(\rho_{\max})$$
  
*M-R:*  $p(r = R) = 0, \quad M = \int_{R}^{R} d^3x \, \varepsilon(r)$   
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**Conventional Model Approach** 



[Very Famous Example]

**Demorest et al. (2010-2016) 1.928(17)** *M*<sub>sun</sub> (J1614-2230)

Some models excluded from observations

**Even more massive NSs have been discovered later.** 

### **Conventional Model Approach**

Model  $\rightarrow$  Solving TOV  $\rightarrow M$ -R Curve  $\rightarrow$  Observation



[Model Independent Analysis]

Alford-Burgio-Han-Taranto-Zappala (2015)

$$\varepsilon(p) = \begin{cases} \varepsilon_{\rm NM}(p) & p < p_{\rm trans} \\ \varepsilon_{\rm NM}(p_{\rm trans}) + \Delta \varepsilon + c_{\rm QM}^{-2}(p - p_{\rm trans}) & p > p_{\rm trans} \end{cases}$$

### Still relies on several scenarios...

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### **Model Independent Approach**

**EoS** -Solving TOV -*M-R* Curve - Observation



**Once one** *M-R* **curve is identified, one EoS is concluded.** The best we can do is to find the "likely" *M-R* curve.

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**Model Independent Approach** 

**EoS** —Solving TOV —*M*-*R* Curve — Observation

Ozel et al., Steiner et al. (2015~)

A : EoS Parameters B : M-R Observation

Normalization (Bayes' theorem)

$$P(A|B)P(B) = P(B|A)P(A)$$
  
Want to know Likelihood prior

Want to know

**Bayesian Analysis** 

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prior

Model

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Bayesian Analysis

Ozel et al., Steiner et al. (2015~)

If *B* (observation data) is abundant, the likelihood would become sharper  $\rightarrow$  the prior dependence can be reduced... but...

**Raithel-Ozel-Psaltis (2017)** 

Mock data (SLy + Noises)

Very powerful approach but a complementary is desirable...



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**Model Independent Approach** 

**EoS** -Solving TOV -*M*-*R* Curve - Observation

Machine Learning Inference Fujimoto-Fukushima-Murase (2018,19,20)

Several *M-R* observation points with errors  $\{M_i, R_i\} \quad \{P_i\} = F(\{M_i, R_i\}) \quad \{P_i\}$ Several parameters to characterize EoS

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### **Model Independent Approach**

### **EoS** -Solving TOV -*M*-*R* Curve - Observation



Fujimoto-Fukushima-Murase (2018,19,21)

EoS parametrized by speed of sound  $c_s^2$ 

Convoluted with error bands (**Data Augmentation**)

### **Model Independent Approach**

### **EoS** -Solving TOV -*M*-*R* Curve - Observation

Machine Learning Inference





We took 14 NS data and approximated the data with 4 parameters (M, R,  $\sigma_M$ ,  $\sigma_R$ , neglecting distribution shapes).

How to infer the most likely EoS?

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Machine Learning Inference

Fujimoto-Fukushima-Murase (2018,19,21)

### **Training Data and NN Architecture**



| Layer index | Neurons | Activation Function |
|-------------|---------|---------------------|
| 0           | 56      | N/A                 |
| 1           | 60      | ReLU                |
| 2           | 40      | ReLU                |
| 3           | 40      | ReLU                |
| 4           | 5       | anh                 |

[Input Layer] 14 NSs times 4 parameter  $(M, R, \sigma_M, \sigma_R) = 56$  neurons [Output Layer] 5 EoS Polytropic Indices

Most Likely EoS from ML Fujimoto-Fukushima-Murase (2018,19,21)



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**Uncertainty Quantification** Training data D  $10^{3}$  $\gamma$ EFT+astro Bootstrapping Pressure *p* [MeV/fm<sup>3</sup>] This work (Validation) (random sampling) This work (Bagging) Bayesian (Steiner et al.)  $10^{2}$ Training data Training data Training data L 📜 Bayesian (Özel et al.) D  $\mathcal{D}_{\gamma}$  $\mathcal{D}_N$ 10<sup>1</sup> Training Neural Network Neural Network Neural Network  $10^{0}$  $NN_1$ NN<sub>2</sub>  $NN_N$  $10^{3}$  $10^{2}$ Output Energy density  $\varepsilon$  [MeV/fm<sup>3</sup>] Output Output  $\hat{o}_1$  $\hat{o}_2$  $\hat{o}_N$ Aggregating (combine all NN outputs by averaging) This is an uncertainty within **Output:**  $\hat{o} = \langle \hat{o}_i \rangle$ 

this method, not including the uncertainty of this method. Uncertainty:  $\Delta \hat{o}^2 = \langle (\hat{o}_i - \hat{o})^2 \rangle$ 

# **Most Likely EoS from ML** Fujimoto-Fukushima-Murase (2018,19,21) Independently learned NNs lead to acceptable EoSs Some among 100NNs contain a 1st-order transition



### **1st-order transition not necessarily excluded !**

**Most Likely EoS from ML** Fujimoto-Fukushima-Murase (2018,19,21)

### Speed of sound may exceed the conformal limit (=1/3)



### Is this a hint for the presence of quark matter?

### Not strongly constrained in the high density region...

# EoS from Deep Neural Network EoS from resummed pQCD EoS and gravitational waves

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### At high density perturbation theory should work.

Gorda-Kurkela-Romatschke-Sappi-Vuorinen: 1807.04120



**Perturbations at zero quark mass** 

[LO] 
$$P_{(0)} = \frac{N_{\rm c}}{12\pi^2} \sum_f \mu_f^4$$
  
[NLO]  $P_{(2)} = -\frac{\alpha_s}{4\pi} \frac{d_A}{4\pi^2} \sum_f \mu_f^4$   $(d_A = N_{\rm c}^2 - 1)$ 

[NNLO]  

$$P_{(4)} = \left(\frac{\alpha_s}{4\pi}\right)^2 \frac{d_A}{4\pi^2} \sum_f \mu_f^4 \left[2\beta_0 \ln \frac{\mu_i^2}{\mu_0^2} + \cdots\right]$$

**Breakdown of the perturbation** 

Improved perturbations at zero quark mass

[NNLO]  
$$P_{(4)} = \left(\frac{\alpha_s}{4\pi}\right)^2 \frac{d_A}{4\pi^2} \sum_f \mu_f^4 \left[2\beta_0 \ln \frac{\mu_i^2}{\mu_0^2} + \cdots\right]$$

**Running (Screened) Coupling** 

$$\alpha_s \rightarrow \alpha_s(\bar{\Lambda}/\mu_0)$$
  
 $\ln \frac{\mu_i^2}{\mu_0^2} \rightarrow \ln \frac{\mu_i^2}{\bar{\Lambda}^2}$ 

Singular log terms can be reduced by a choice of  $\bar{\Lambda}^2 \sim \mu_i^2$ 

**But...** 
$$\mu$$
?  $2\mu$ ?  $4\mu$ ?

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Scale uncertainty appears from NNLO

[LO] 
$$P_{(0)} = \frac{N_c}{12\pi^2} \sum_f \mu_f^4$$
  
[NLO]  $P_{(2)} = -\frac{\alpha_s}{4\pi} \frac{d_A}{4\pi^2} \sum_f \mu_f^4$ 

As long as the chemical potential dependence is such simple, the EoS has no uncertainty even though  $\alpha_s$  changes. Uncertainty appears from the NNLO only.

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pQCD not quite predictable???



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pQCD not quite predictable???



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# Approach with resummation (one-loop of HTL/HDL prop.) Baier-Redlich: hep-ph/9908372

Zero temperature limit of HTL resummation (HDL)

### Andersen-Strickland: hep-ph/0206196

HDL EoS to solve dense quark stars



If the coupling constant runs, the results depends on the scale. Besides, nontrivial scale dependence appears from the Debye mass  $\alpha_s \mu_f^2$ . (Log terms also appear!)

Approach with resummation (one-loop of HTL/HDL prop.)

In terms of the 2PI language:

$$\Gamma = \frac{1}{2} \operatorname{tr} \ln G^{-1} - \frac{1}{2} \operatorname{tr} \ln(1 - G_0^{-1}G) + \Gamma_2[G]$$

using the propagator with the self-energy insertion

- \* Regarded as a "quasi-particle" approximation
- \* Usually the thermodynamics is dominated by this alone
- \* Not really a systematic expansion in the coupling

### **Conceptually straightforward but technically complicated especially with finite strange quark mass...**

 $P_{q,f}(T,\mu_f) = \operatorname{tr} \ln G_f^{-1}$  $= \sum_{i=1}^{n} \ln \det \left[ k - M_f - \Sigma(i\tilde{\omega}_n + \mu_f, k) \right]$ 

$$=2 \sum_{\{K\}} \int_{\{K\}} \ln\left[A_S^2(i\tilde{\omega}_n + \mu_f, k) + M_f^2 - A_0^2(i\tilde{\omega}_n + \mu_f, k)\right]$$



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QCD Approach

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### For massless pressure:

$$\frac{P_{\text{HDLpt}}}{P_{\text{ideal}}} \approx 1 - 6\frac{m_{\text{q}f}^2}{\mu_f^2} + \mathcal{O}\left(\frac{m_{\text{q}f}^4}{\mu_f^4}\right) = 1 - 4\frac{\alpha_s}{\pi} + \mathcal{O}(\alpha_s^2)$$
$$\frac{P_{\text{pQCD}}}{P_{\text{ideal}}} = 1 - 2\frac{\alpha_s}{\pi} + \mathcal{O}(\alpha_s^2)$$

This discrepancy was known since Baier-Redlich, and a correction term is necessary for order-by-order matching:

$$P_{\rm corr} = 2 \frac{\alpha_s}{\pi} P_{\rm ideal}$$

### We have checked that this is negligible at high density.

### Fujimoto-Fukushima: 2011.10891

**Smooth continuation from the nuclear side to the quark** side could be possible now! Slope change?



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### Fujimoto-Fukushima: 2011.10891



For a given density the corresponding  $\mu$  is pushed up by the resummation

### Not so trivial because of the Debye and *s*-quark masses

Fujimoto-Fukushima: 2011.10891

### In principle we should require:

 $P(\mu,\alpha_s(\bar{\Lambda}),m(\bar{\Lambda});\bar{\Lambda})~~{\rm is~independent~of~the~scale.}$ 

It seems to be very hard in the resummed theory... but... The scale insensitivity of the EoS is good enough!

$$\frac{\partial P(\mu_{\rm B};\bar{\Lambda})}{\partial\bar{\Lambda}} - c_s^2 \frac{\partial \varepsilon(\mu_{\rm B};\bar{\Lambda})}{\partial\bar{\Lambda}} = 0$$

Surprisingly, this approximately holds in the resummation.

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### **Strangeness could be quantified:**

Fujimoto-Fukushima: 2011.10891



# Strange quark mass runs (like $\alpha_s$ ) and the threshold strongly depends on the scale choice...

# EoS from Deep Neural Network EoS from resummed pQCD EoS and gravitational waves

Phase transition (qualitative change) to Quark Matter?

Annala-Gorda-Kurkela-Nattila-Vuorinen: 1903.09121



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**High-T has been understood by HRG + pQCD** 



### How to find such crossover, if any??? 1-st order phase transition might be straightforward???

Most-Papenfort-Dexheimer-Hanauske-Schramm-Stocker-Rezzolla (2018)

CMF<sub>Q</sub> : EOS with a strong-1st PT to Quark Matter (3~4 times  $n_0$ ) CMF<sub>H</sub> : EOS without quarks



Quark matter shortens the lifetime of post-merger hypermassive neutron star. (Easier to collapse into BH.)

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### How to find such crossover, if any??? 1-st order phase transition might be straightforward???

#### Weih-Hanauske-Rezzola (2019)

Several different scenarios (but still a 1st-order assumed)



Finite-*T* treatment:

$$P = P_{\rm cold} + P_{\rm thermal}$$

$$\varepsilon = \varepsilon_{\rm cold} + \varepsilon_{\rm thermal}$$

$$P_{\rm thermal} \approx \rho \varepsilon_{\rm thermal} (\Gamma_{\rm th} - 1)$$

 $\Gamma_{\text{th}} = 1.75$  is fixed by hand

ARDA, ARDA, ARDA, ARDA, ARDA, ARDARDA, ARDA, ARDA, ARDA, ARDA, ARDA, ARDA, ARDA

### Crossover also detectable? ← YES! Thermal effect?? Fujimoto-Fukushima-Kyutoku-Hotokezaka (2022)



Similar trend can be confirmed. We also checked the thermal index dependence:

For small  $\Gamma_{\text{th}}$  thermal pressure is not enough and the lifetime is shortened to go to BH.

For  $\Gamma_{\text{th}} \sim 2$  the thermal pressure can sustain the hypermassive NS.

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### **Estimation of the (***T***-dependent) thermal index Thermal effect??** Fujimoto-Fukushima-Hidaka-Hiraguchi-Iida (2021)



### Van der Waals type EoS with interacting hadrons. Thermal index looks consistent with other approaches...?

### **Crossover also detectable? Thermal effect??** Fujimo

Fujimoto-Fukushima-Hidaka-Hiraguchi-Iida (2021)



Most probably the thermal pressure is not large (that is good!)

# Summary

### **Deep Neural Network (DENSE Collaboration)**

- □ Predicts the most likely EoS that stays close to the empirical nuclear EoS (SLy4).
- $\square$  Codes publicized very soon...

### **PQCD** Resummation

□ Many underestimate the predictability of pQCD at high density — resummation cures the problem better.

### **Gravitational wave signals?**

Crossover causes detectable effects (EoS softening is important), but the thermal pressure should be carefully considered (maybe not large, fortunately).