

# Bayesian Analysis of Hybrid EoS Based on Astrophysical Observational Data

**Alexander Ayriyan**<sup>1</sup>

D. Alvares<sup>2,3</sup>, D. Blaschke<sup>3,4</sup> and H. Grigorian<sup>1,5</sup>

<sup>1</sup>Laboratory of Information Technologies, JINR

<sup>2</sup>Instituto de Física, Universidad Autónoma de San Luis Potosí

<sup>3</sup>Bogoliubov Laboratory for Theoretical Physics, JINR

<sup>4</sup>Institute for Theoretical Physics, University of Wroclaw

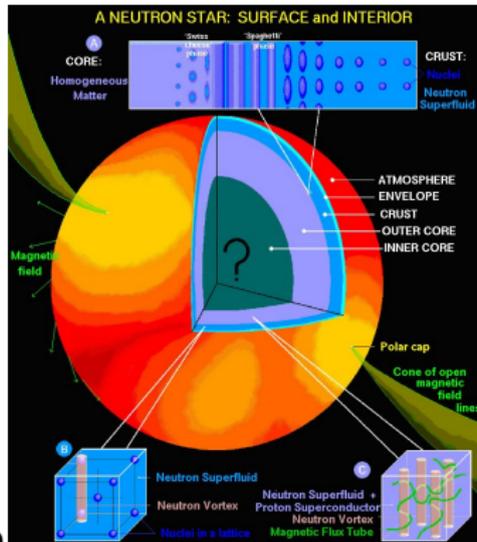
<sup>5</sup>Department of Theoretical Physics, Yerevan State University

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## Qualification and Classification of EoS

- Estimation of different models of EoS from observational constraints
- Applying Bayesian Analysis for the estimation
- Finding suggestions for observation which could be most selective for the models of EoS

# Neutron Star Structure

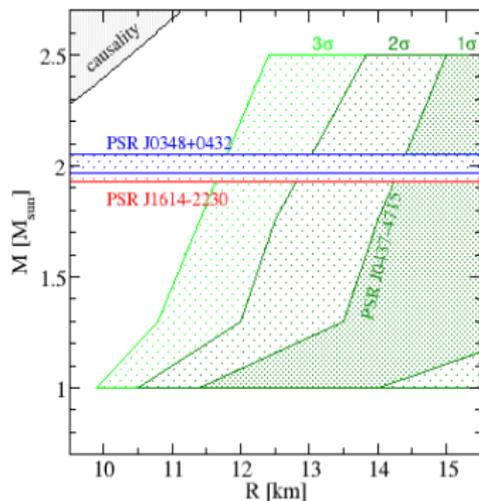


Credit: Dany Page

# Observational Constraints

## Mass and Radius Constraints

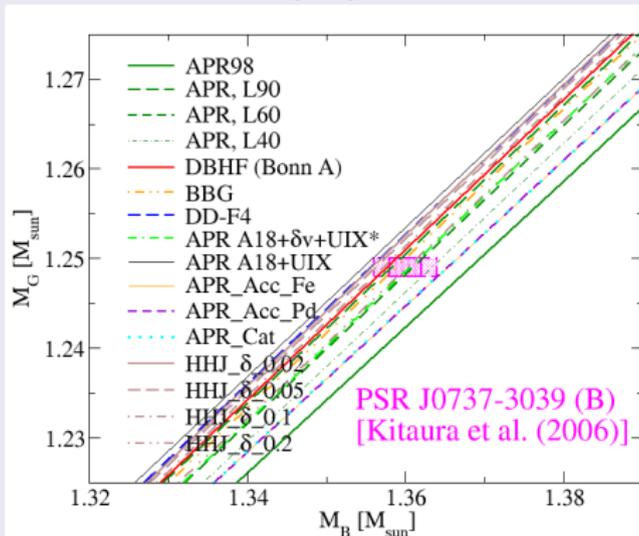
Radius and maximum mass constraints are given from PSR J0437-4715 [1] and PSR J0348+0432 [2] correspondingly.



# Observational Constraints

## Gravitational Binding Energy Constraint

A constraint on the gravitational binding energy is taken from the neutron star B in the binary system J0737-3039 (B) [3].



# Observational Constraints

## Three Statistically Independent Constraints

- A radius constraint from the nearest millisecond pulsar PSR J0437-4715 [1].
- A maximum mass constraint from PSR J0348+0432 [2].
- A constraint on the gravitational binding energy from the neutron star  $B$  in the binary system PSR J0737-3039 (B) [3].

# Tolman–Oppenheimer–Volkoff equations

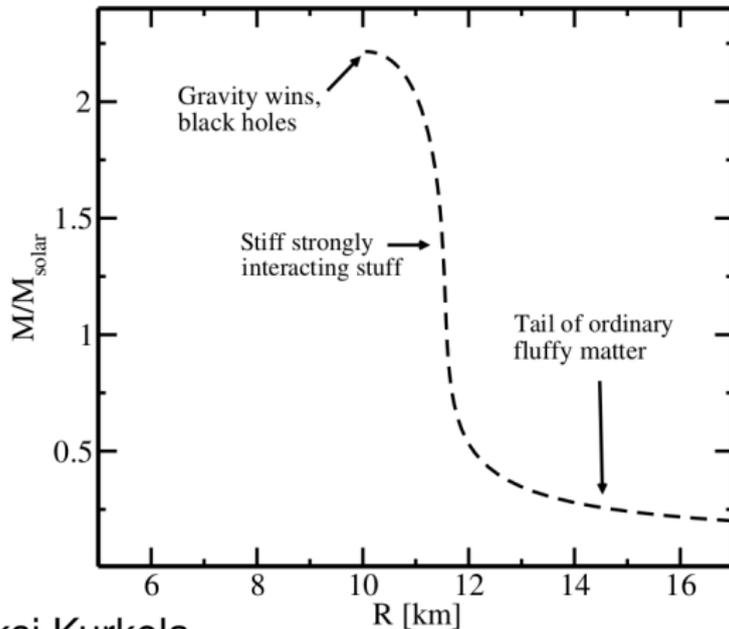
## TOV equations

$$\begin{cases} \frac{dm(r)}{dr} = C_1 \epsilon r^2 \\ \frac{dm_B(r)}{dr} = C_1 n_B m_N \frac{r^2}{(1 - 2C_2 m/r)} \\ \frac{dp(\epsilon, r)}{dr} = -C_2 \frac{(\epsilon + p)(m + C_1 p r^3)}{r(r - 2C_2 m)} \end{cases} \quad (1)$$

## Constants

$$C_1 = 1.11269 \cdot 10^{-5} \frac{M_\odot}{\text{km}^3} \frac{\text{fm}^3}{\text{MeV}} \quad C_2 = 1.4766 \frac{\text{km}}{M_\odot} \quad (2)$$

# Mass–Radius plot



Credit: Aleksii Kurkela

# EoS Parametrization

## Hybrid EoS

$$p(\epsilon) = p^I(\epsilon) \Theta(\epsilon_c - \epsilon) + p^I(\epsilon_c) \Theta(\epsilon - \epsilon_c) \Theta(\epsilon_c - \epsilon + \Delta\epsilon) + p^{II}(\epsilon) \Theta(\epsilon - \epsilon_c - \Delta\epsilon),$$

where  $p^I(\epsilon)$  is given by a pure hadronic EoS (here well known model of APR), and  $p^{II}(\epsilon)$  represents the high density nuclear matter [4] used here as quark matter given in the bag-like form.

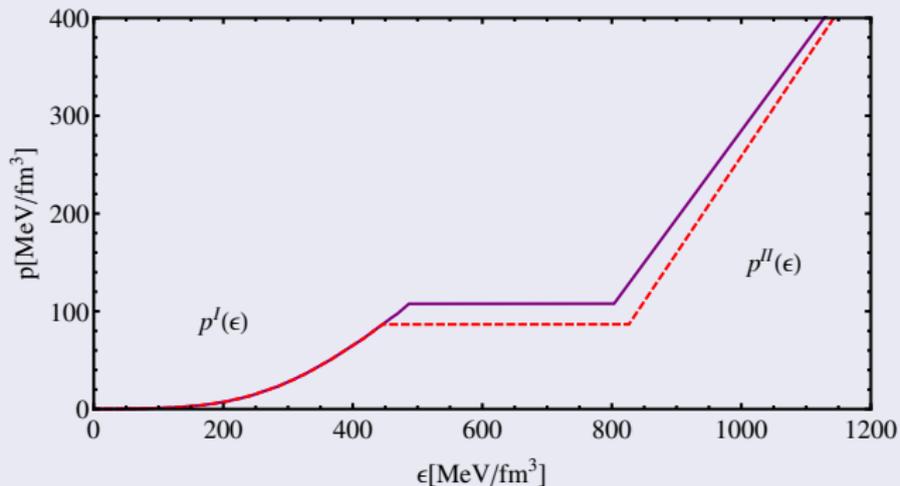
## Bag-Like Form of QM EoS

$$p^{II}(\epsilon) = c_{QM}^2 \epsilon - B,$$

where  $c_{QM}^2$  is the squared speed of sound in quark matter and  $B$  is the bag constant.

# EoS Parametrization

## Hybrid EoS



# EoS Parametrization

## Hybrid EoS Parameters

$$400 \leq \epsilon_c [MeV/fm^3] \leq 1000 : \epsilon_c(k) \quad k = 1 \dots N_1 = 10$$

$$0 \leq \gamma = \frac{\Delta\epsilon}{\epsilon_c} \leq 1 : \gamma(l) \quad l = 1 \dots N_2 = 10$$

$$0.3 \leq c_{QM}^2 \leq 1 : c_{QM}^2(m) \quad m = 1 \dots N_3 = 10$$

## Vector of Parameters

For the BA, we have to sample the above defined parameter space and to that end we introduce a vector of the parameter values:

$$\pi_i = \vec{\pi} \left( \epsilon_c(k), \gamma(l), c_{QM}^2(m) \right),$$

$$i = 1 \dots N \text{ (here } N = \prod_{q=1}^3 N_q \text{) and } i = N_1 \times N_2 \times k + N_2 \times l + m$$

# Qualification of EoS Set from Observation

## Goal

To find the set  $\pi_i$  corresponding to an EoS and thus a sequence of configurations which contains the most probable one based on the given constraints using BA (calculate of *a posteriori* probabilities of  $\pi_i$ ).

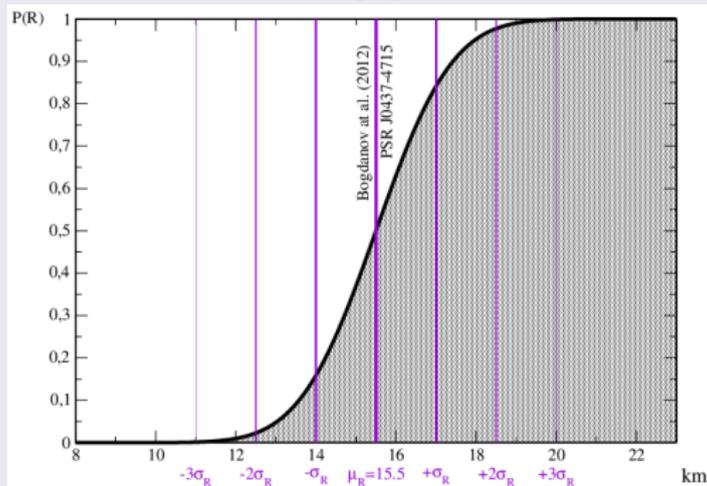
## Unification of *a priori* probabilities

$$P(\pi_i) = 1 \text{ for } \forall i.$$

## Calculation of Probabilities

### Probability of Corresponding to Radius Constraint for $\pi_i$

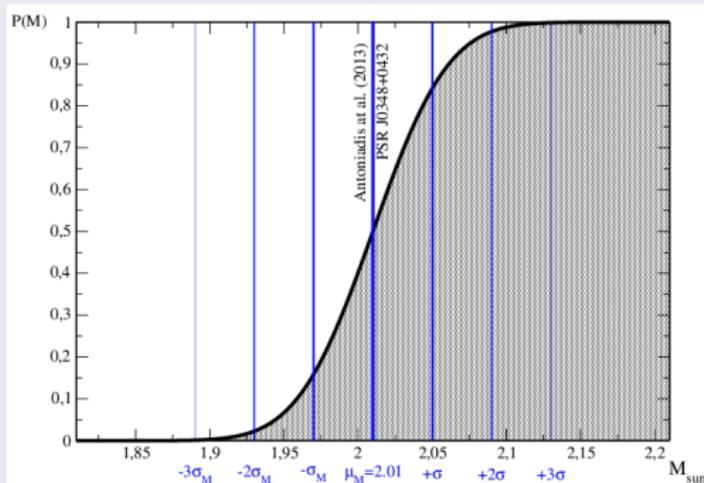
$P(E_B | \pi_i) = \Phi(R_i, \mu_B, \sigma_B)$ , here  $R_i$  is max radius given by  $\pi_i$ .  
 $\mu_B = 15.5$  km and  $\sigma_B = 1.5$  km [1].



## Calculation of Probabilities

### Probability of Corresponding to Mass Constraint for $\pi_i$

$P(E_A | \pi_i) = \Phi(M_i, \mu_A, \sigma_A)$ , here  $M_i$  is max mass given by  $\pi_i$ .  
 $\mu_A = 2.01 M_\odot$  and  $\sigma_A = 0.04 M_\odot$  [2].



## Calculation of Probabilities

### Probability of Corresponding to $M - M_B$ Constraint for $\pi_i$

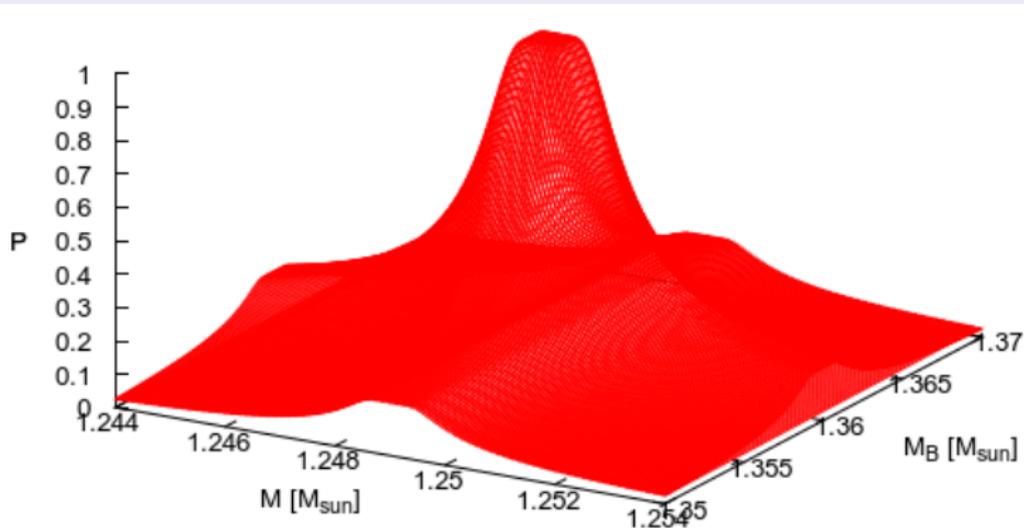
We need to estimate the probability for the closeness of a theoretical point  $M_i = (M_i, M_{B_i})$  to the observed point  $\mu_K = (\mu_G, \mu_B)$ . The required probability can be calculated using the following formula

$$P(E_K | \pi_i) = [\Phi(\xi_G) - \Phi(-\xi_G)] \cdot [\Phi(\xi_B) - \Phi(-\xi_B)],$$

where  $\Phi(x) = \Phi(x, 0, 1)$ ,  $\xi_G = \sigma_{M_G}/d_{M_G}$  and  $\xi_B = \sigma_{M_B}/d_{M_B}$ , with  $d_{M_G}$  and  $d_{M_B}$  being the absolute values of components of the vector  $\mathbf{d}_i = \mu - \mathbf{M}_i$ , where  $\mu_B = (\mu_G, \mu_B)^T$  is given in

# Calculation of Probabilities

## Probability of $M - M_B$ for $\pi_i$



## Calculation of Probabilities

### Probability of All Constraints for $\pi_j$

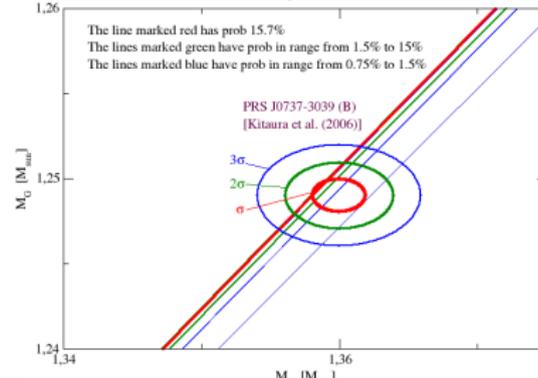
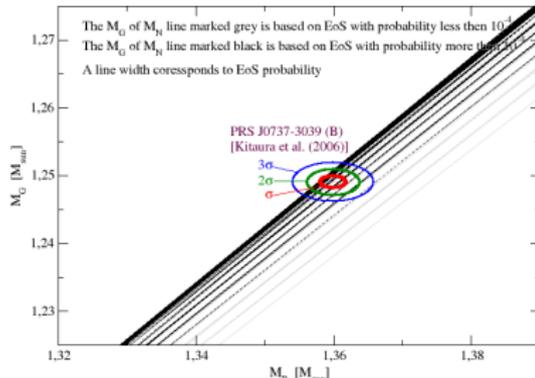
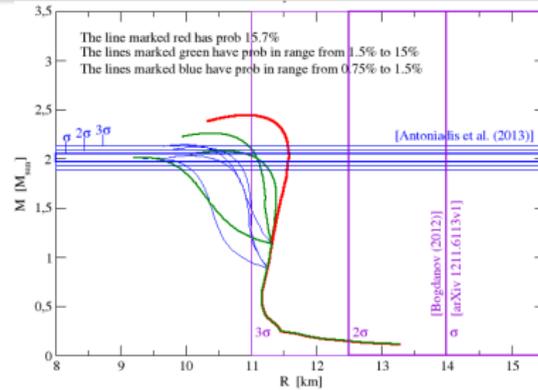
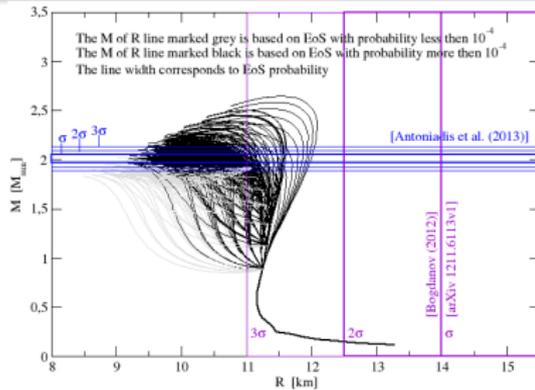
Taking to the account assumption that these measurements are independent on each other we can calculate complete conditional probability:

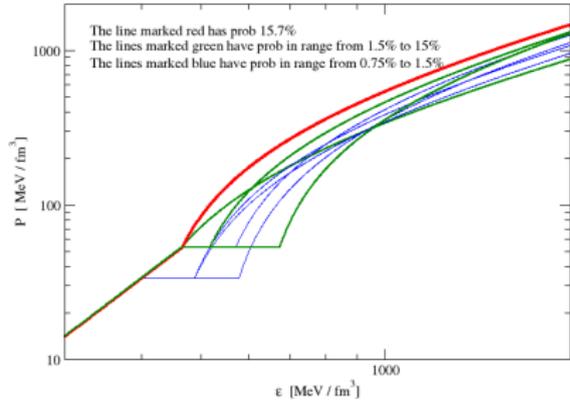
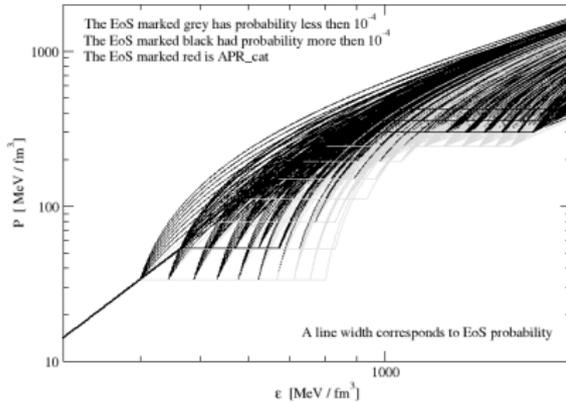
$$P(E|\pi_j) = P(E_A|\pi_j) \times P(E_B|\pi_j) \times P(E_K|\pi_j)$$

### Calculation of *a posteriori* Probabilities of $\pi_j$

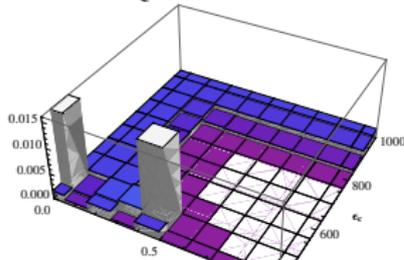
Now, we can calculate probability of  $\pi_j$  using Bayes' theorem:

$$P(\pi_j|E) = \frac{P(E|\pi_j) P(\pi_j)}{\sum_{j=0}^{N-1} P(E|\pi_j) P(\pi_j)}$$

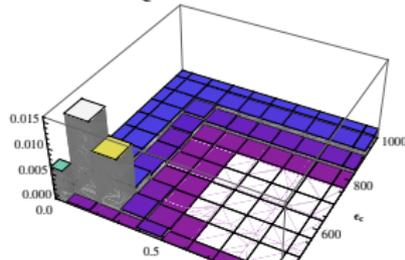




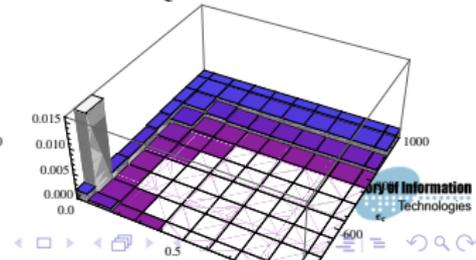
$c^2_{QM}=0.922222$



$c^2_{QM}=0.844444$



$c^2_{QM}=0.533333$

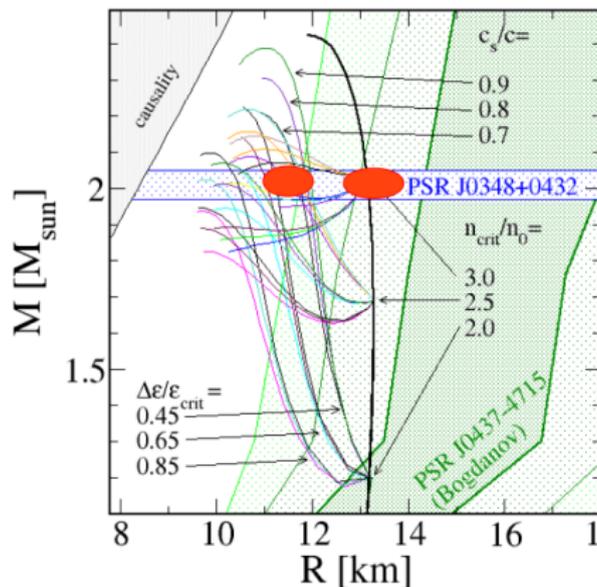


## Conclusions

- The most probable set of parameters resulting from the Bayesian Analysis point out to a quite stiff EoS with a smooth phase transition.
- Less probable configurations have jump in phase transition. Most of these EoS are pretty much stiff as well.
- The 7 most probable EoS do not allow a "third family".



## Fake measurements



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# References I

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# References II



**D. Blaschke, H. Grigorian, D. Alvarez-Castillo and A. Ayriyan. Journal of Physics: Conference Series 496 (2014) 012002 (arXiv:1402.0478)**

**In the end, there can be only one.**  
– *Duncan MacLeod*

Thanks for your attention!