

# Bayesian analysis of nontrivial features in the $c_s^2$ inside neutron stars in light of astrophysical and pQCD constraints

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Bayesian analysis: [2309.02345](#), [D. Mroczek](#), M. C. Miller (Maryland), J. Noronha-Hostler and N. Yunes (UIUC/ICASU)  
pQCD constraints: In preparation, [D. Mroczek](#), R. Somasundaram (Syracuse/Los Alamos), I. Tews (Los Alamos), M. C. Miller (Maryland), J. Noronha-Hostler and N. Yunes (UIUC/ICASU), C. Drischler (Ohio U.), J. Margueron (Lyon)

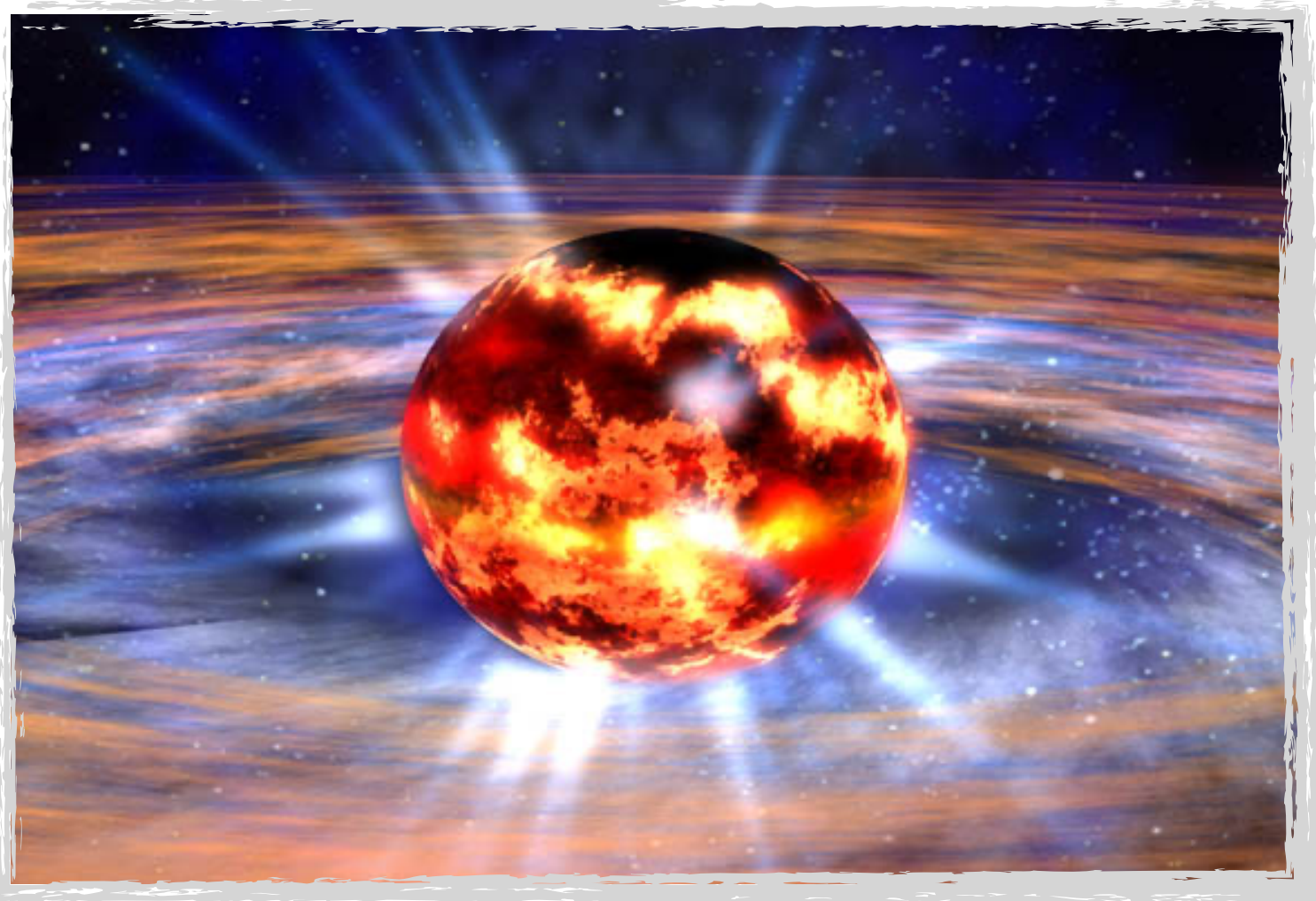
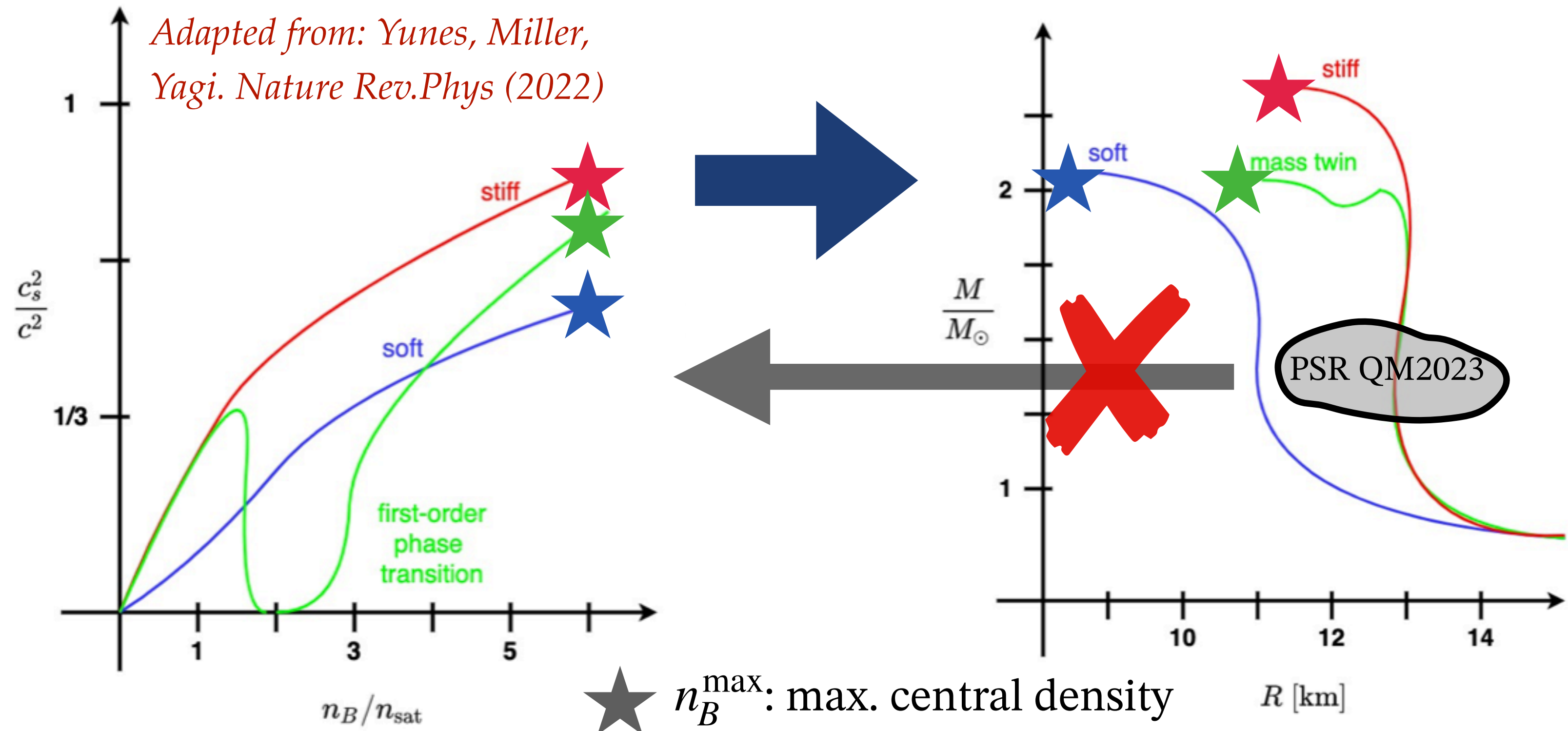


# Learning the $T=0$ , high $n_B$ EoS from neutron stars

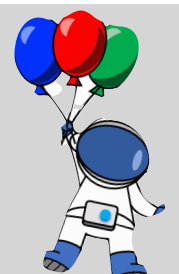
- Neutron stars have macroscopic properties that we can measure.
- For stable, slowly-rotating stars, these observables depend only on the EoS.

From any EoS  $\rightarrow$  M-R,  $\Lambda$ -M sequence

- We have reliable mass ( $M$ ), radius ( $R$ ), and tidal deformability ( $\Lambda$ ) measurements.



[NASA.gov](https://www.nasa.gov)





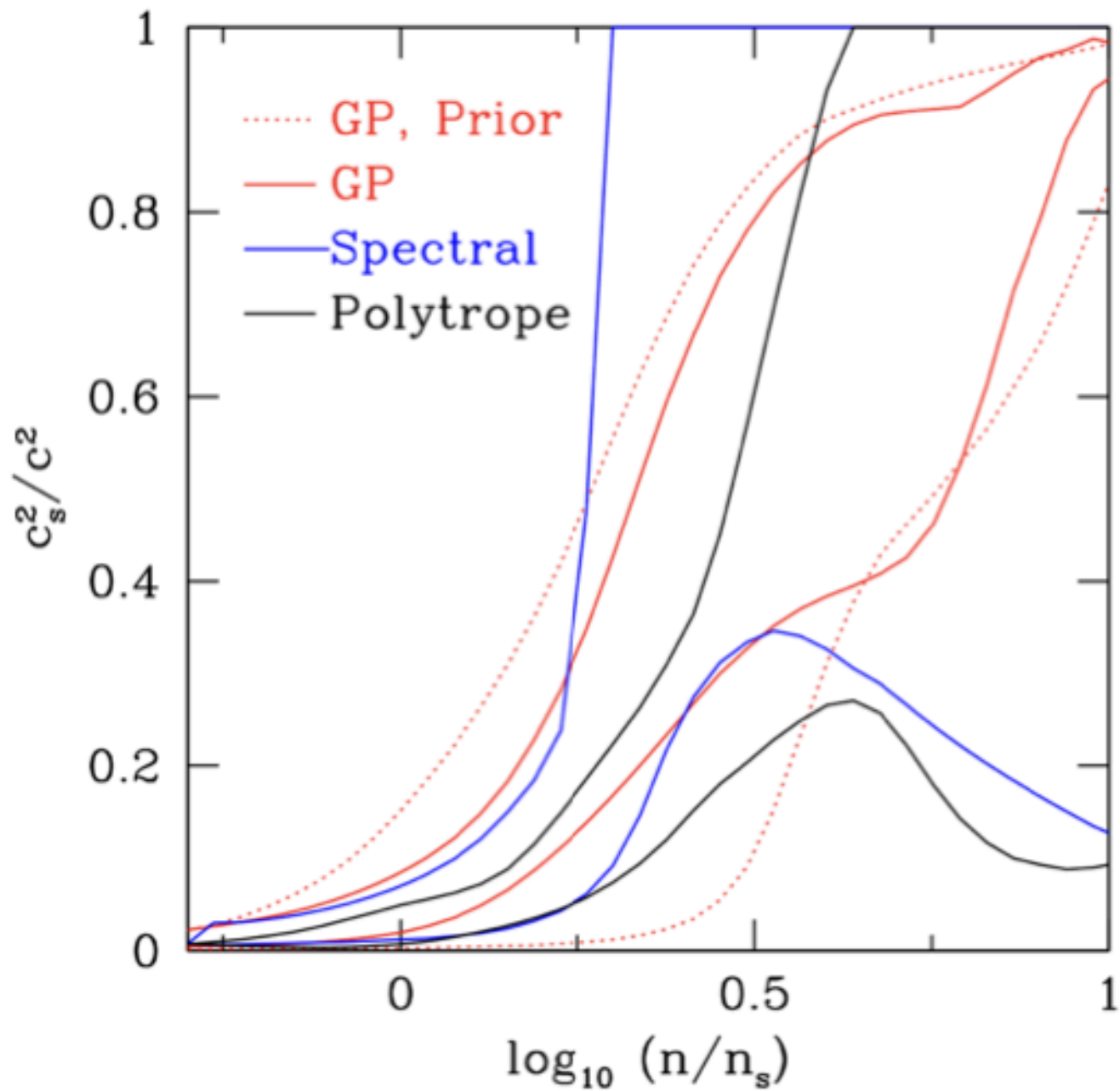
# Bayesian statistics and choosing a prior

$$p_k = \frac{q_k \mathcal{L}_k}{\int q_l \mathcal{L}_l dl} \quad p_k: \text{posterior, } q_k: \text{prior, } \mathcal{L}_k: \text{likelihood}$$

→ model evidence

Infinitely many possible EoS:  
**How do we account for all possibilities?**

Prior dependence: test different priors



Miller et al. AJL (2021)

- Model-agnostic approaches are common  
 → Gaussian processes (GPs):

EoS modeled via:  $\phi(x) = \log(1/c_s^2 - 1)$ , **stable and causal**

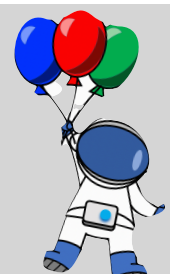
$$\phi \sim \mathcal{N}(\mu_i, \Sigma_{ij})$$

Collection of functions, behavior specified by **a mean** and **covariance kernel**

**Squared-exponential is a common choice:**

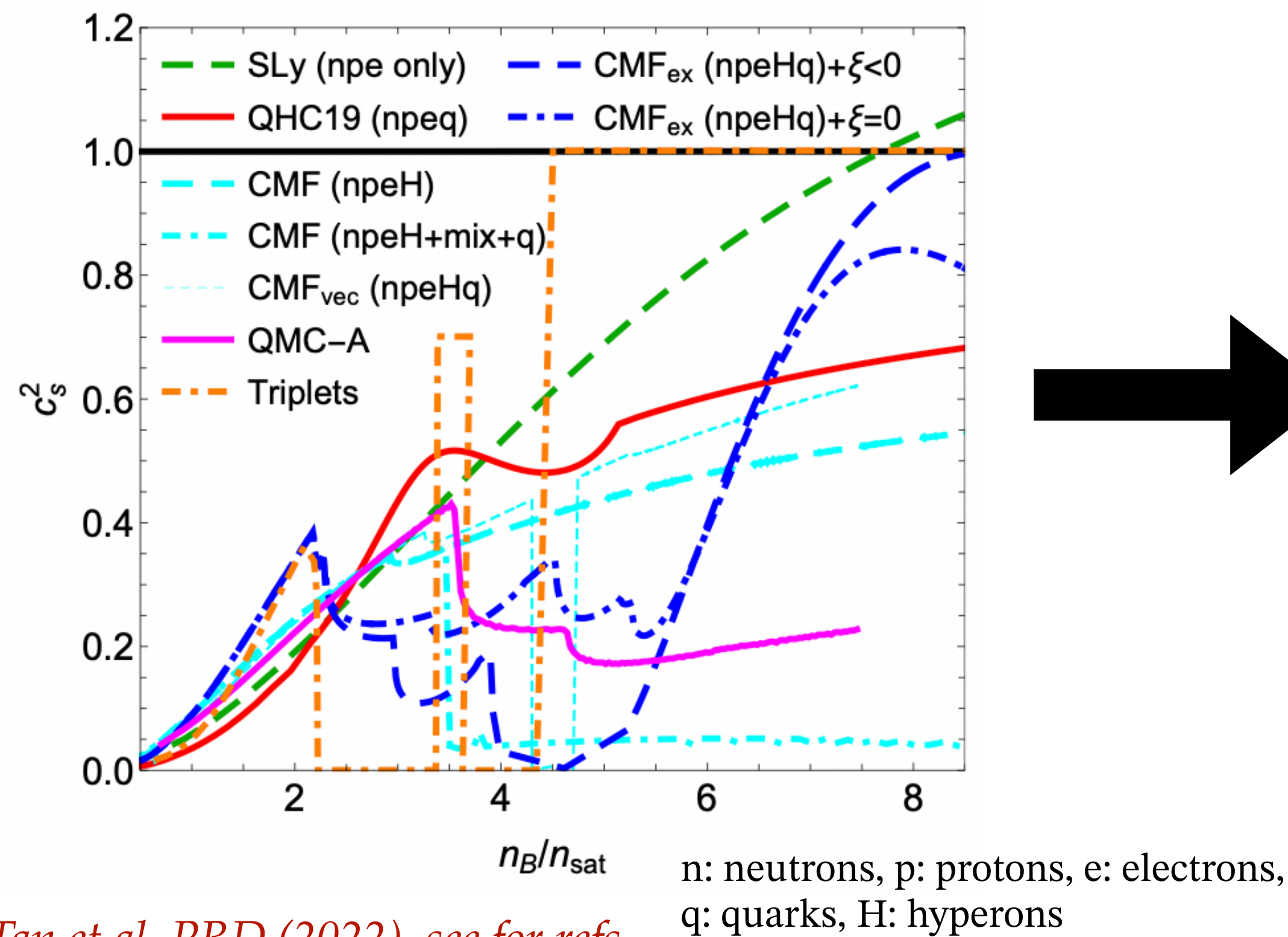
$$K_{\text{se}}(x_i, x_j) = \sigma^2 \exp \left[ - \left( x_i - x_j \right)^2 / 2 \ell^2 \right]$$

$\ell$ : correlation length  
 $\sigma$ : correlation strength

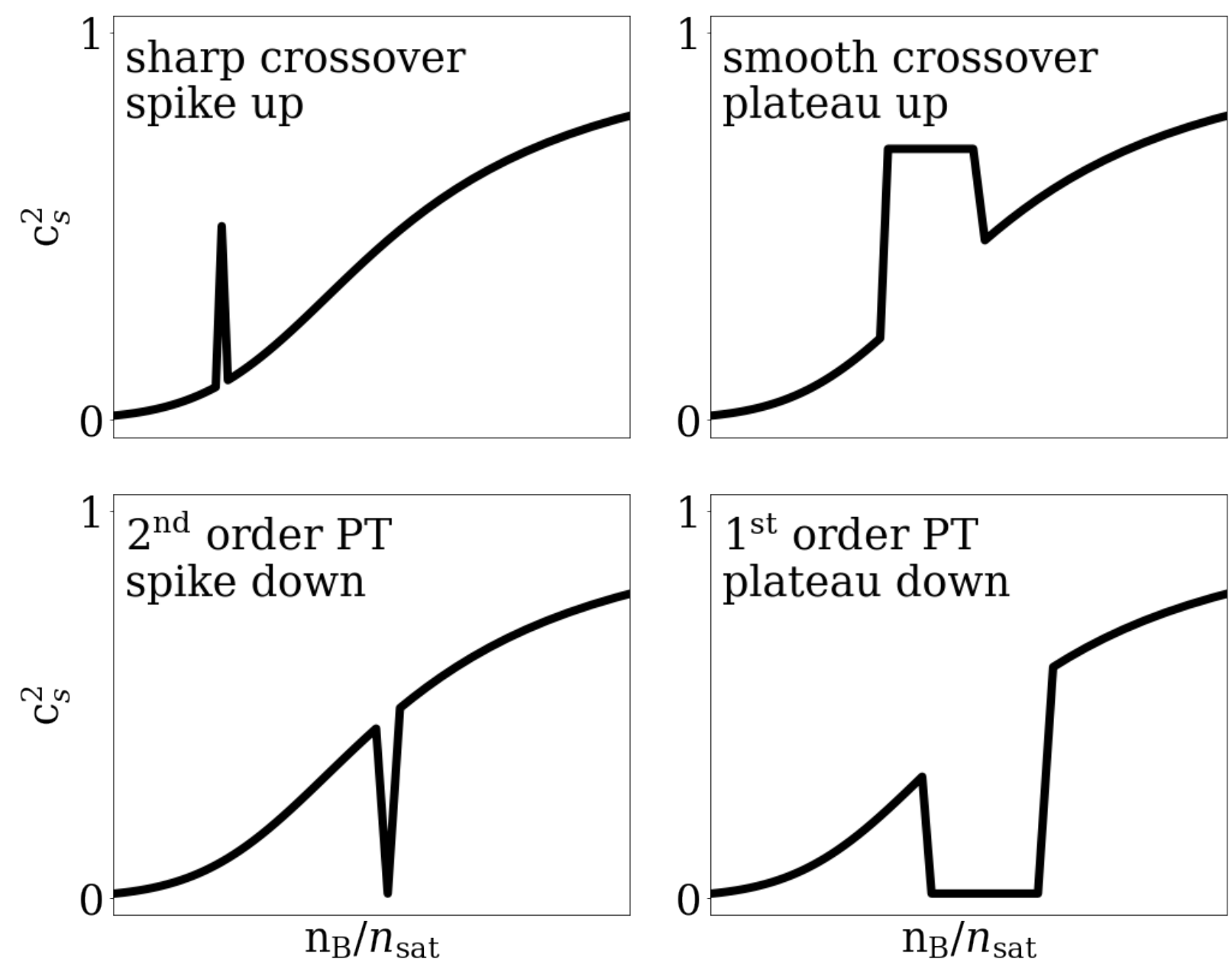


# Influence of exotic degrees of freedom on the EoS from nuclear physics models

Multi-scale correlations characterize the onset of exotic phases



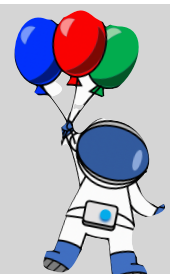
Modeling non-trivial structure in  $c_s^2$  from a phenomenological perspective



Bayesian friendly!  
→ systematic study + model comparison

Physically-motivated long + short/medium length correlations in  $n_B$

D. Mroczek et al.  
2309.02345





# Are there nontrivial features in the $c_s^2$ inside neutron stars?

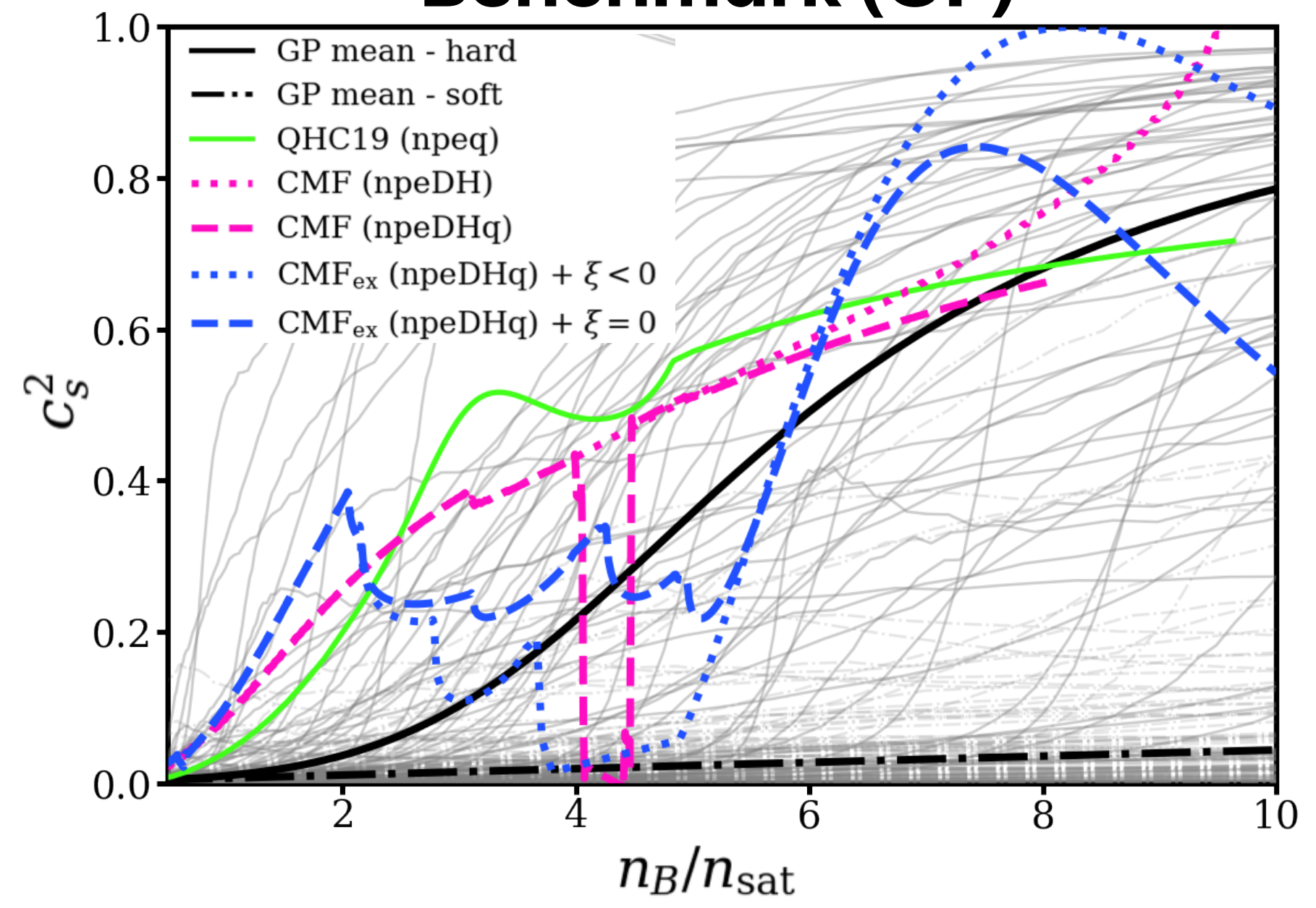
$$p_k = \frac{q_k \mathcal{L}_k}{\int q_l \mathcal{L}_l dl} \rightarrow \text{model evidence } (\mathcal{E}): \text{quantifies level of support of the data for a given model}$$

**Bayesian model comparison:**

$$\text{Bayes factor } K = \frac{\mathcal{E}_{\text{benchmark}}}{\mathcal{E}_{\text{structure}}}$$

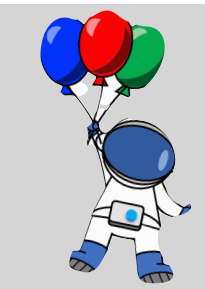
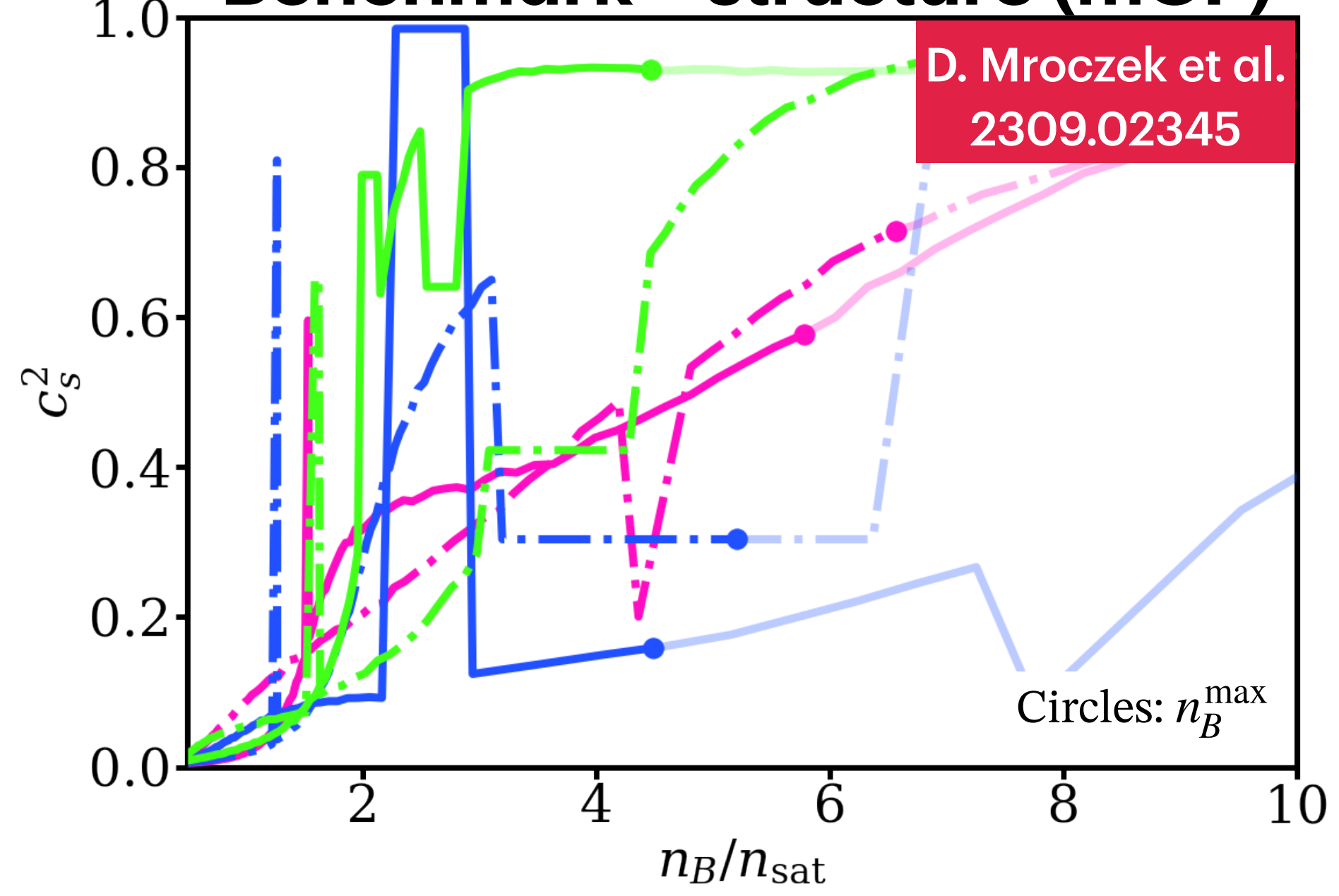
- Benchmark model in gray: GP with long-range correlations fixed across all densities
- Modified GP (mGP): multi-scale correlations → emergence of exotic degrees of freedom

**Benchmark (GP)**



n: neutrons, p: protons,  
e: electrons, q: quarks,  
H: hyperons

**Benchmark + structure (mGP)**





# Astrophysical and theoretical constraints

## Astrophysics

- $M_{\text{max}}$ : 3 highest measured NS masses from Shapiro-delay measurements ( $\sim 2.0 M_{\odot}$ )
- $\Lambda$ : GW170817 and GW190425 ( $\tilde{\Lambda}, M_{\text{ch}}, M_1, M_2$ )
- **M-R**: NICER (IL/MD) PSR J0740 + 6620, PSR J0030 + 0451

See Mroczek et al. 2309.02345 for refs.

## Low-energy

Symmetry energy:  
 $E_{\text{sym}} = 32 \pm 2 \text{ MeV}$

*Tsang et al. PRC (2012)*

## pQCD\*

- partial N3LO results, propagated using causality, stability, and integral constraints down to  $\mathbf{n}_B^{\text{max}}$  for each EoS.
- Truncated expansion uncertainty accounted for with scale-averaging.

*pQCD results: Gorda et al. PRL 127 (2021) and PRD 104 (2021)*

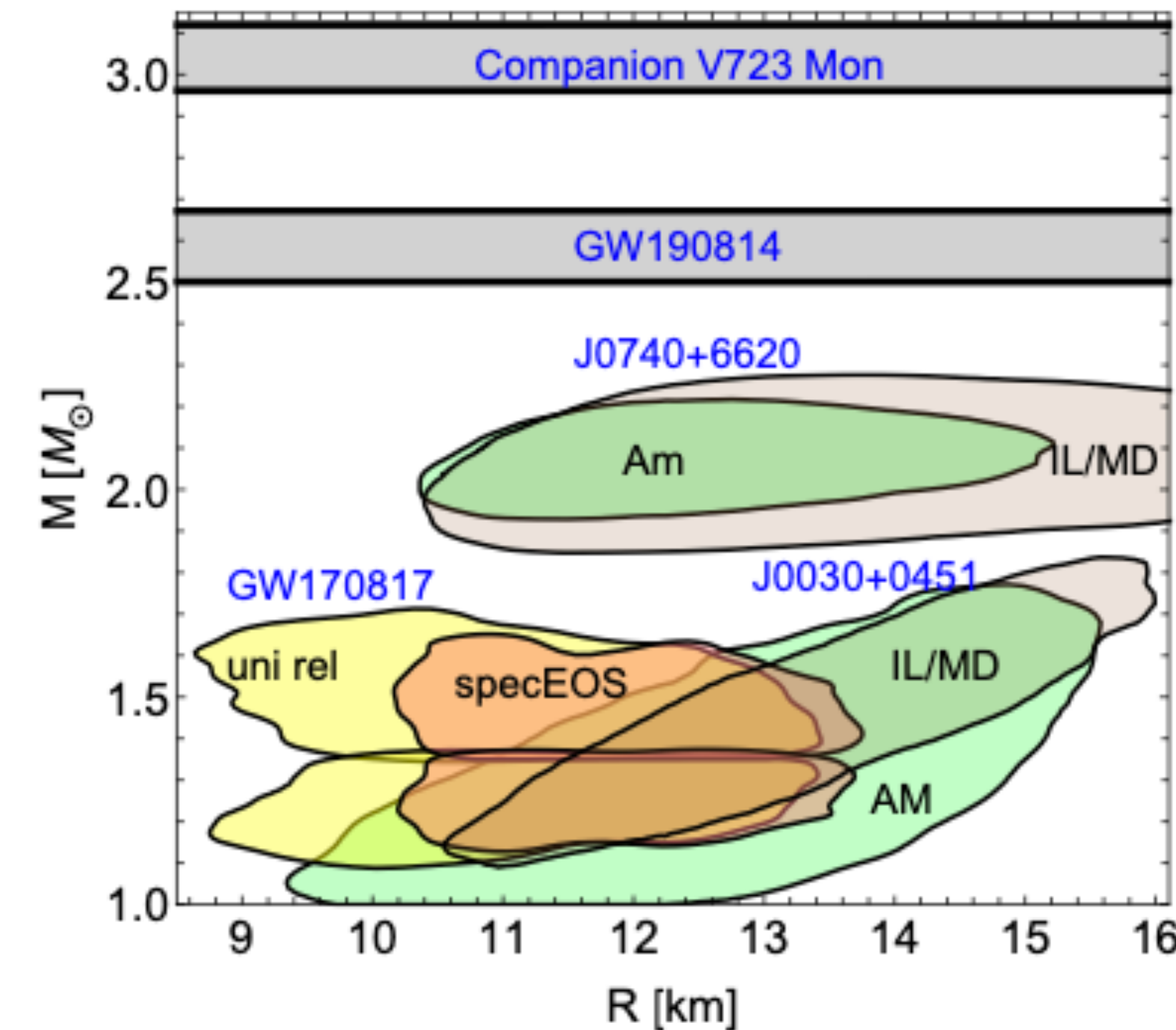
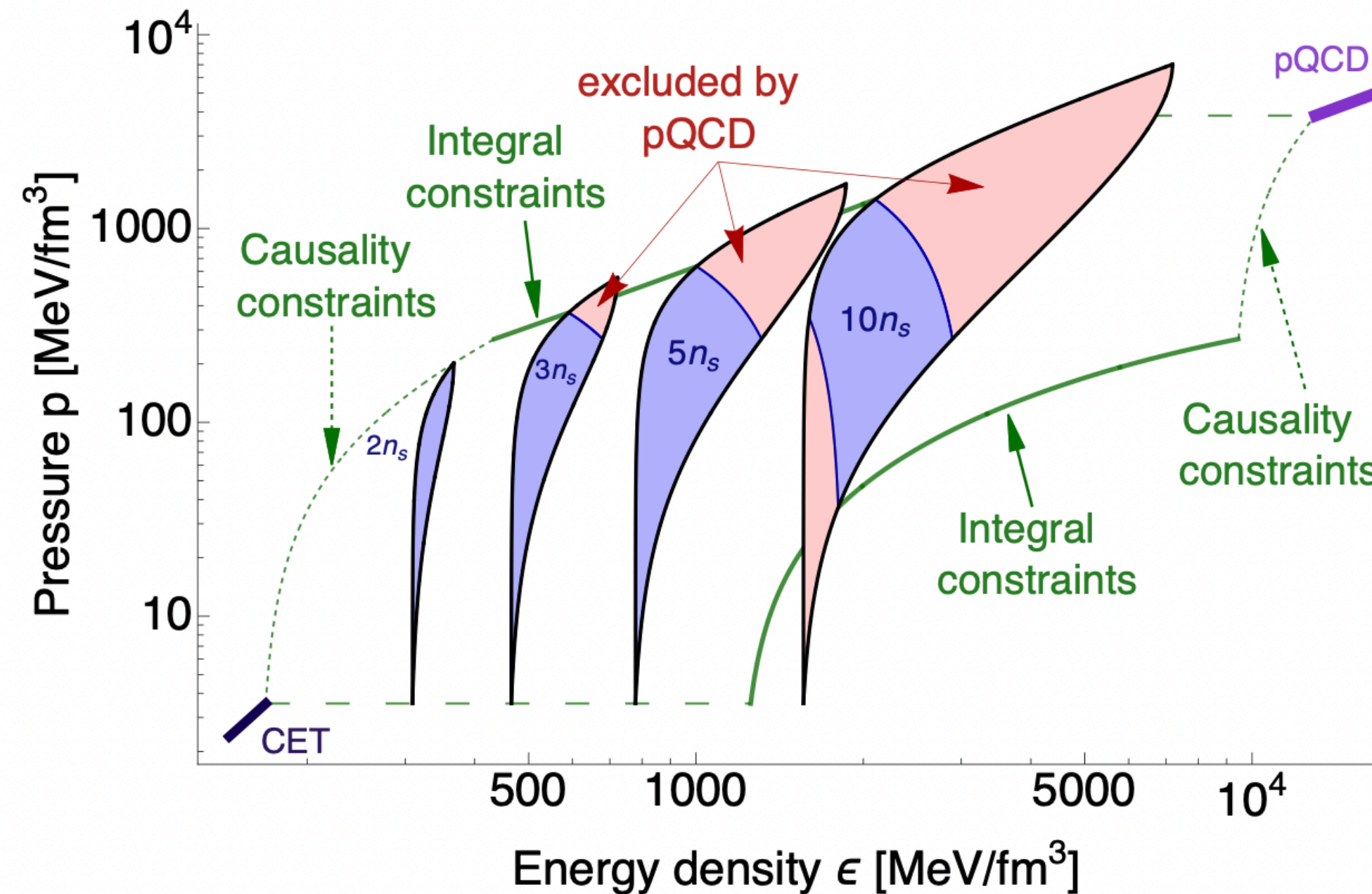


Fig. from: Tan et al. PRD (2022), see for refs.



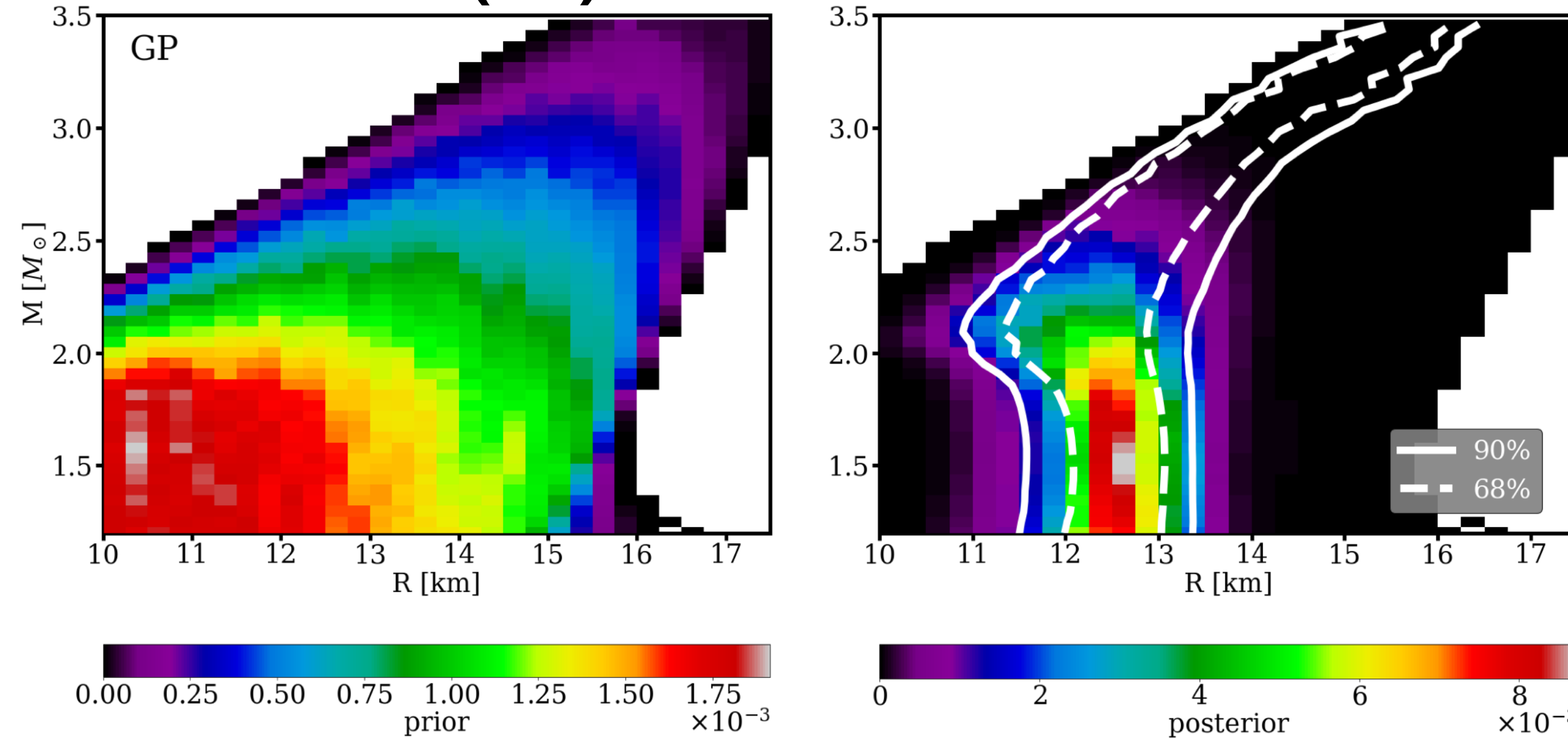
*pQCD constraints: Komoltsev, Kurkela PRL (2022), Gorda et al. Astrophys. J. (2023)*





# Are M-R posteriors sensitive to structure in $c_s^2(n_B)$ ?

## Benchmark (GP)

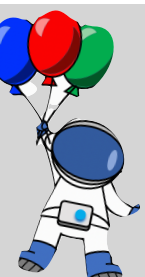
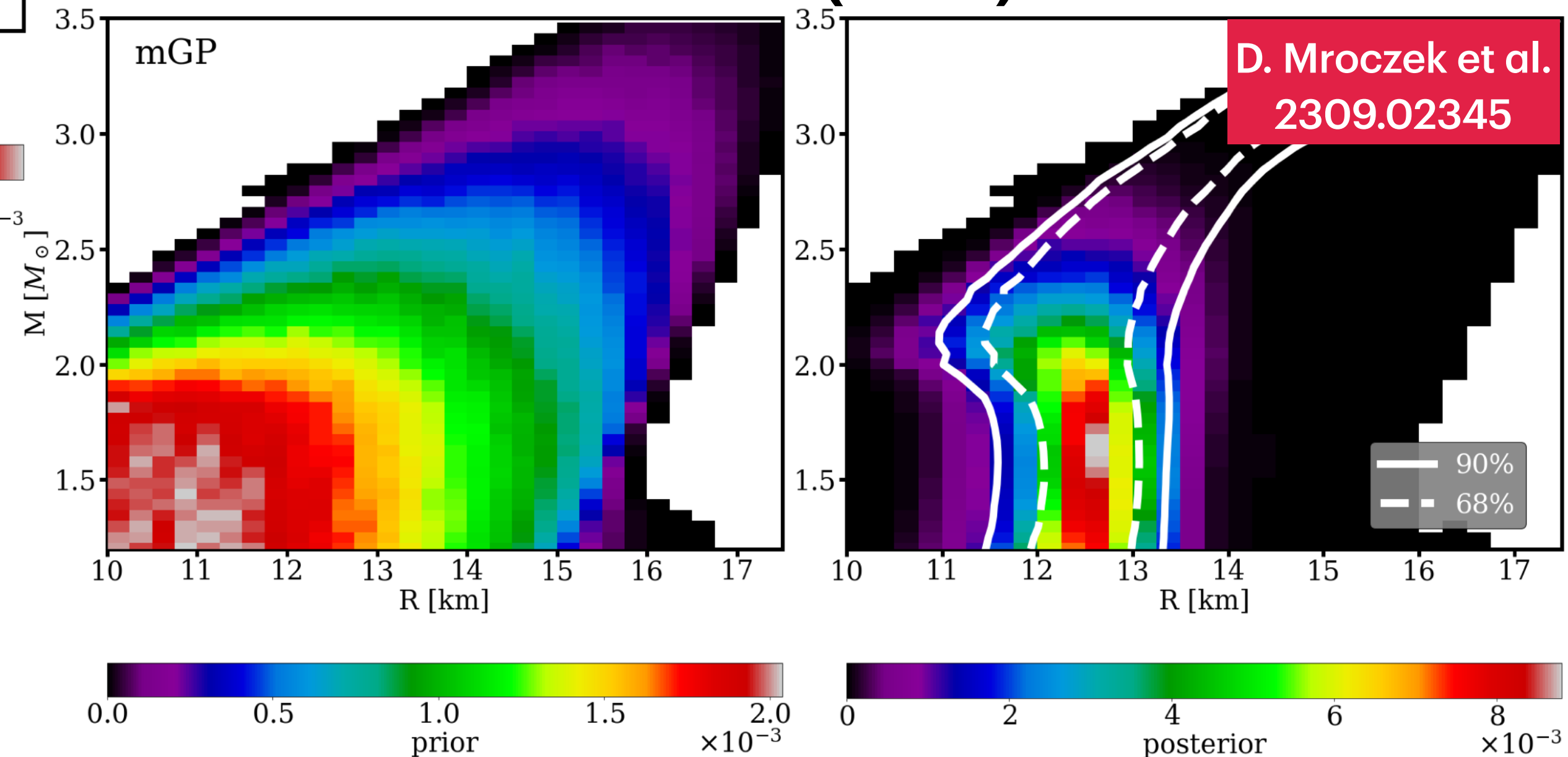


We find **no differences** in the prior or posterior probability distributions between benchmark (GP) and benchmark + structure (mGP)

## Why check M-R priors and posteriors?

- Diverse neutron star EoS prior = broad prior in M-R
- Sanity check: can we reproduce measurements when we assume nontrivial features in  $c_s^2(n_B)$ ?

## Benchmark + structure (mGP)

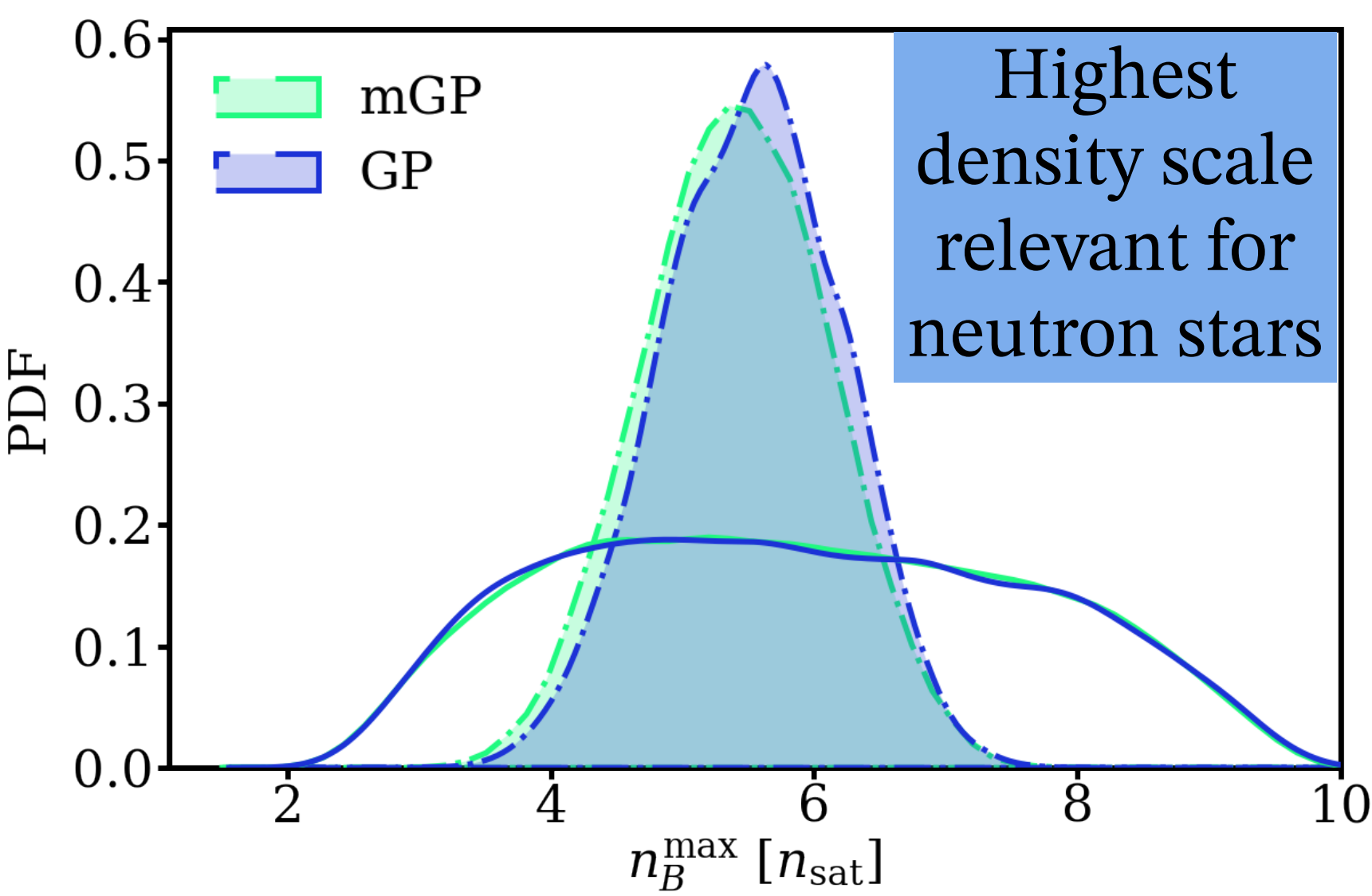
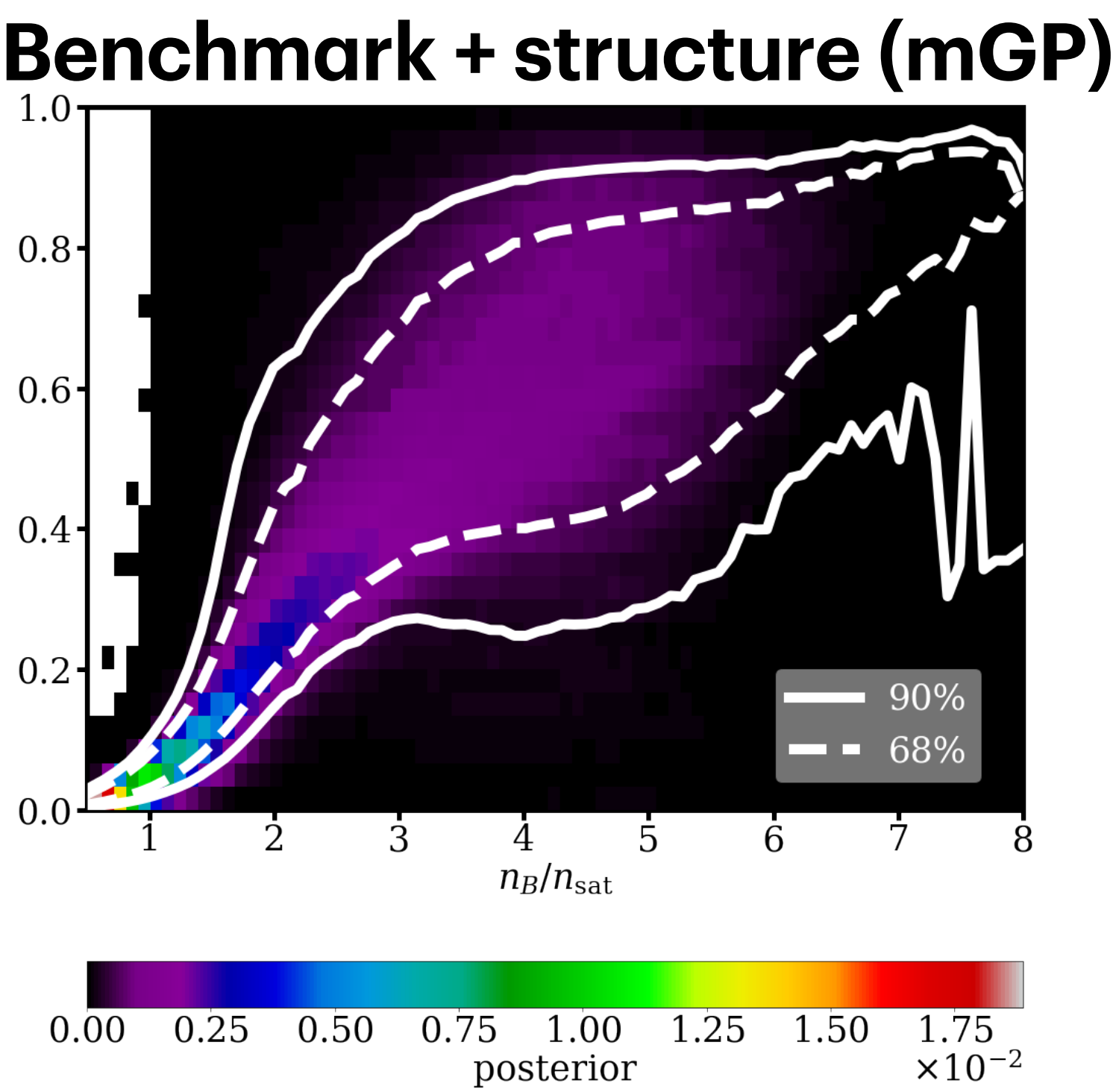
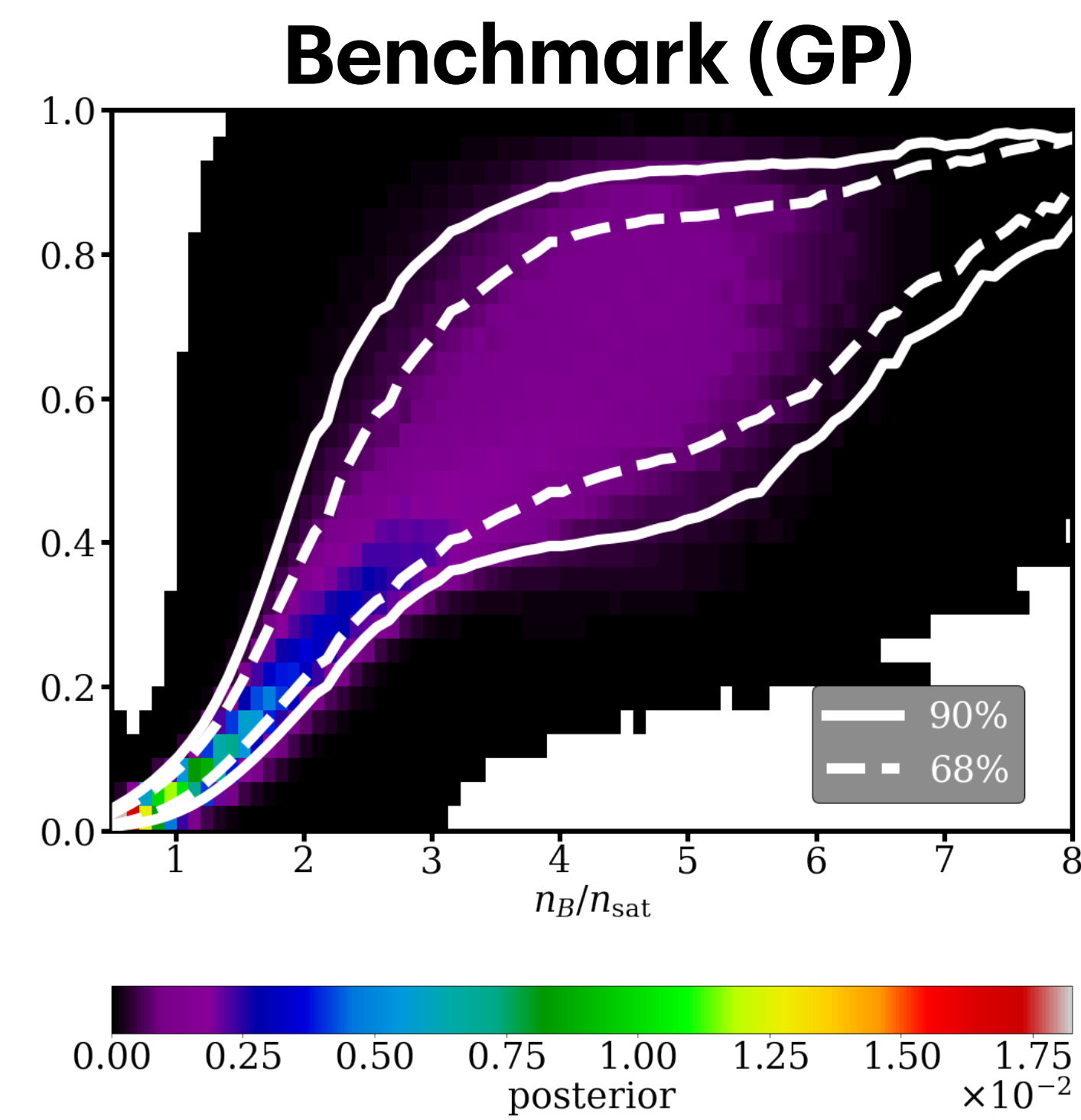


# Are $c_s^2(n_B)$ posteriors sensitive to structure in $c_s^2(n_B)$ ?

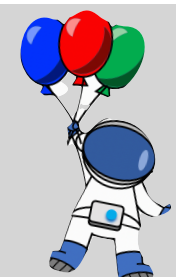
Constraints affect priors differently:

Long-range correlations → **tighter**  $c_s^2$  posterior  
Structure → **broadener**  $c_s^2$  posterior

- EoS are shown up to  $n_B^{\max}$   
→ credibility bands are correlated with posterior for  $n_B^{\max}$



- Constraints favor  $n_B^{\max} \sim 5 - 7 n_{\text{sat}}$





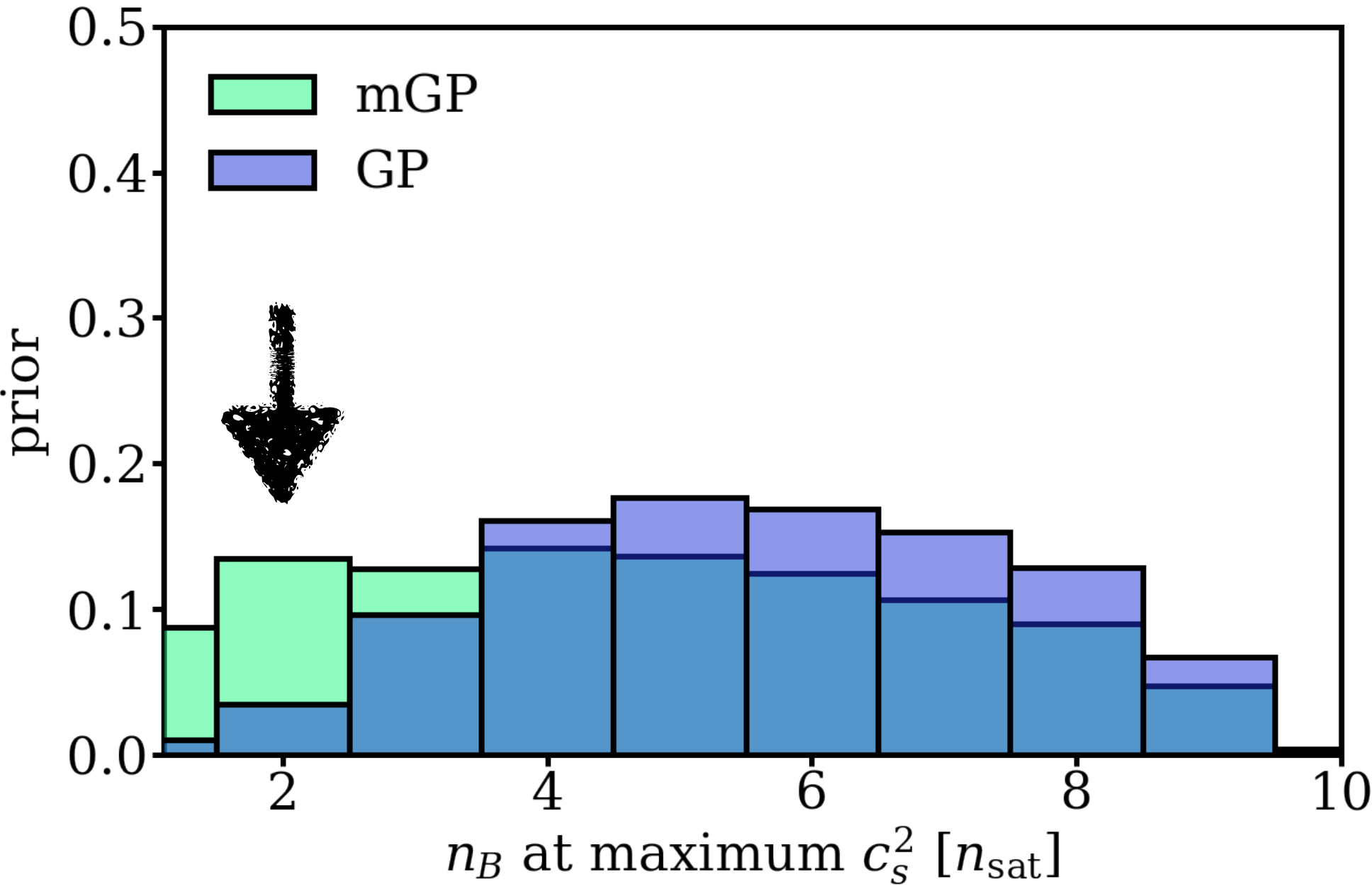
# Does $c_s^2(n_B)$ display a peak within neutron star densities?

**Bump** in  $c_s^2$ : softening of the EoS signaling crossover to new degrees of freedom.

→ **global maximum in  $c_s^2$  that occurs within neutron star densities**

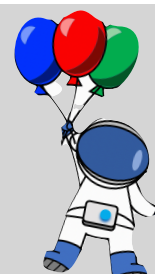
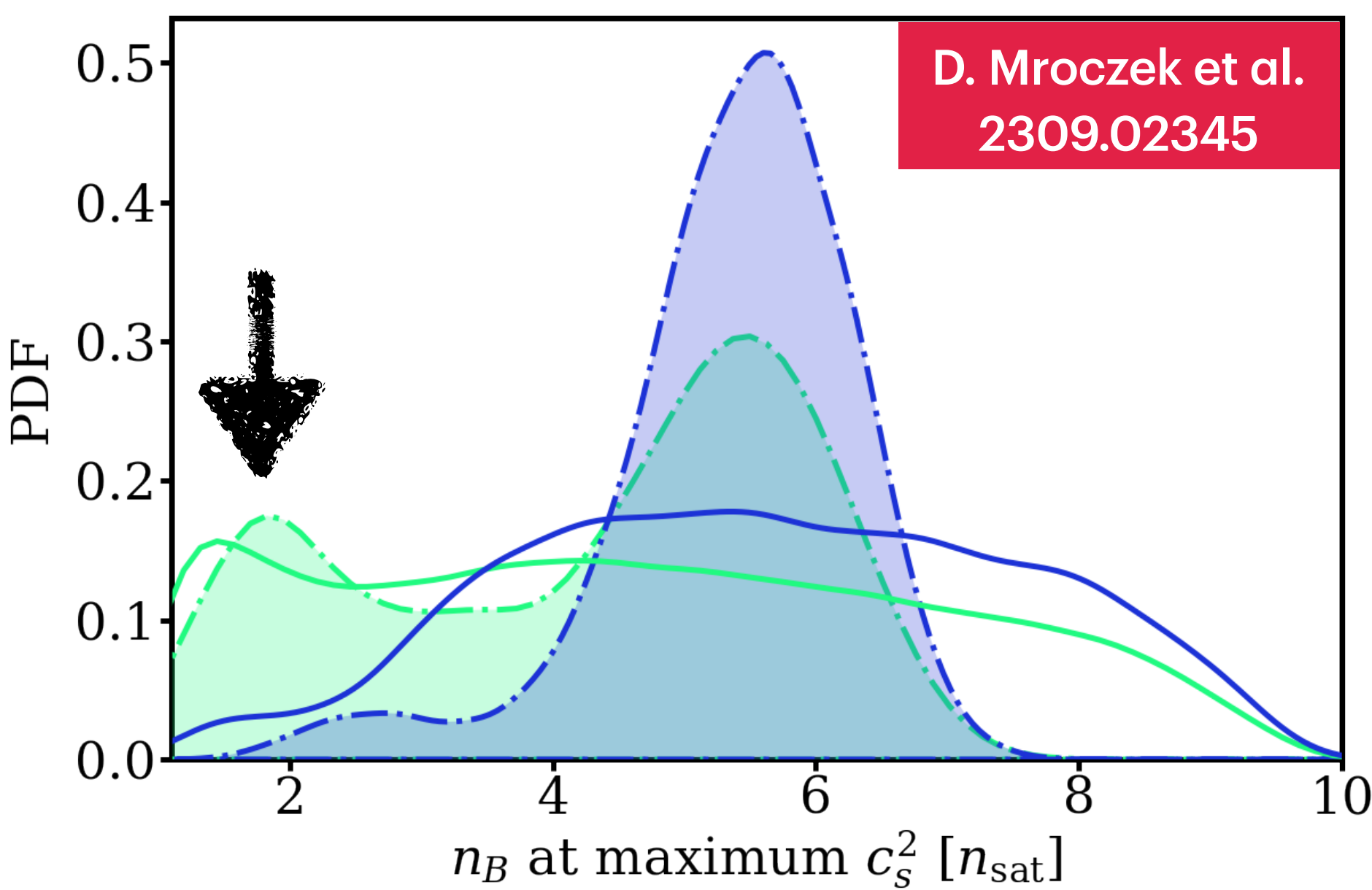
Prior

**Multi-scale** correlations allow  
for a bump **before**  $3 n_{\text{sat}}$

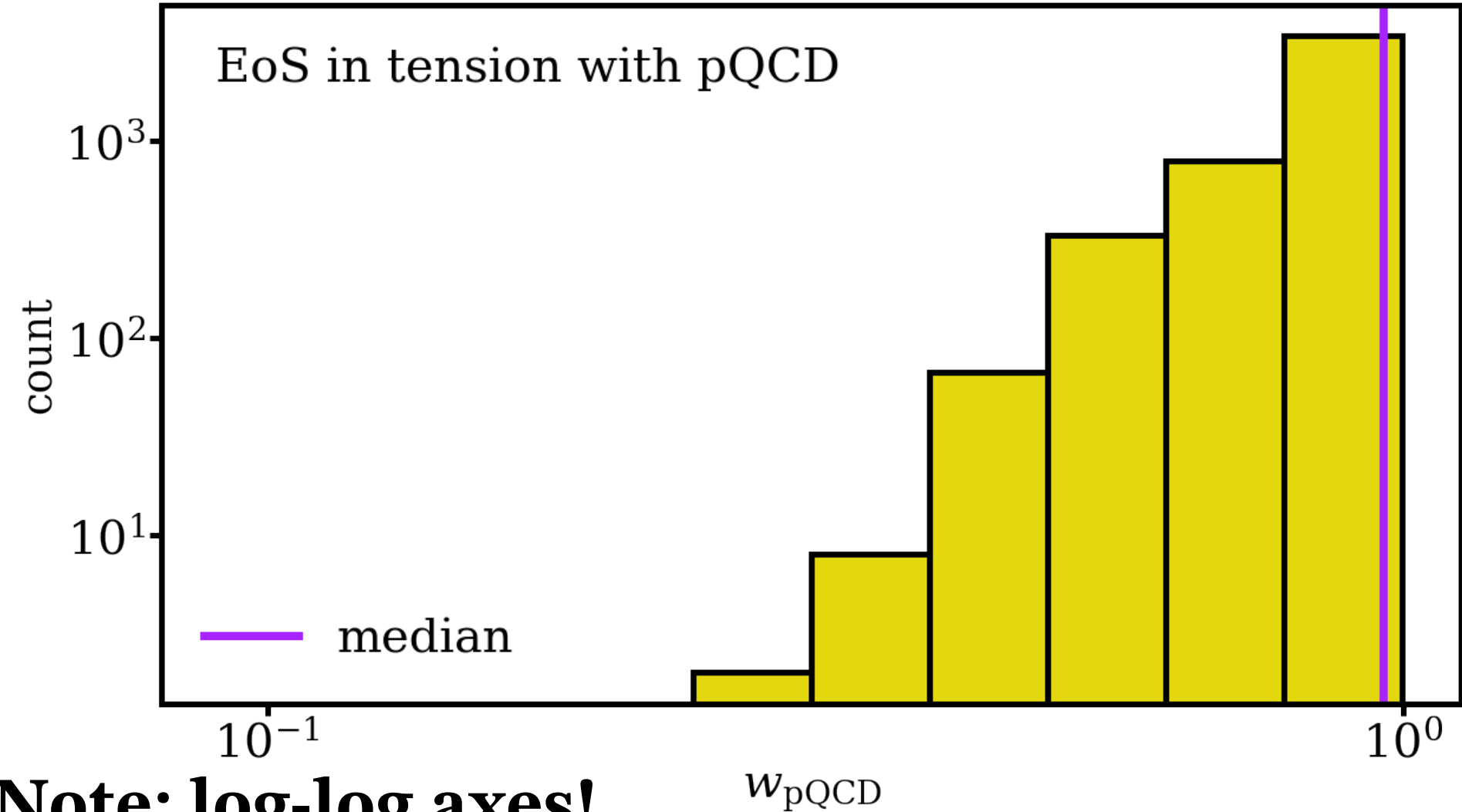
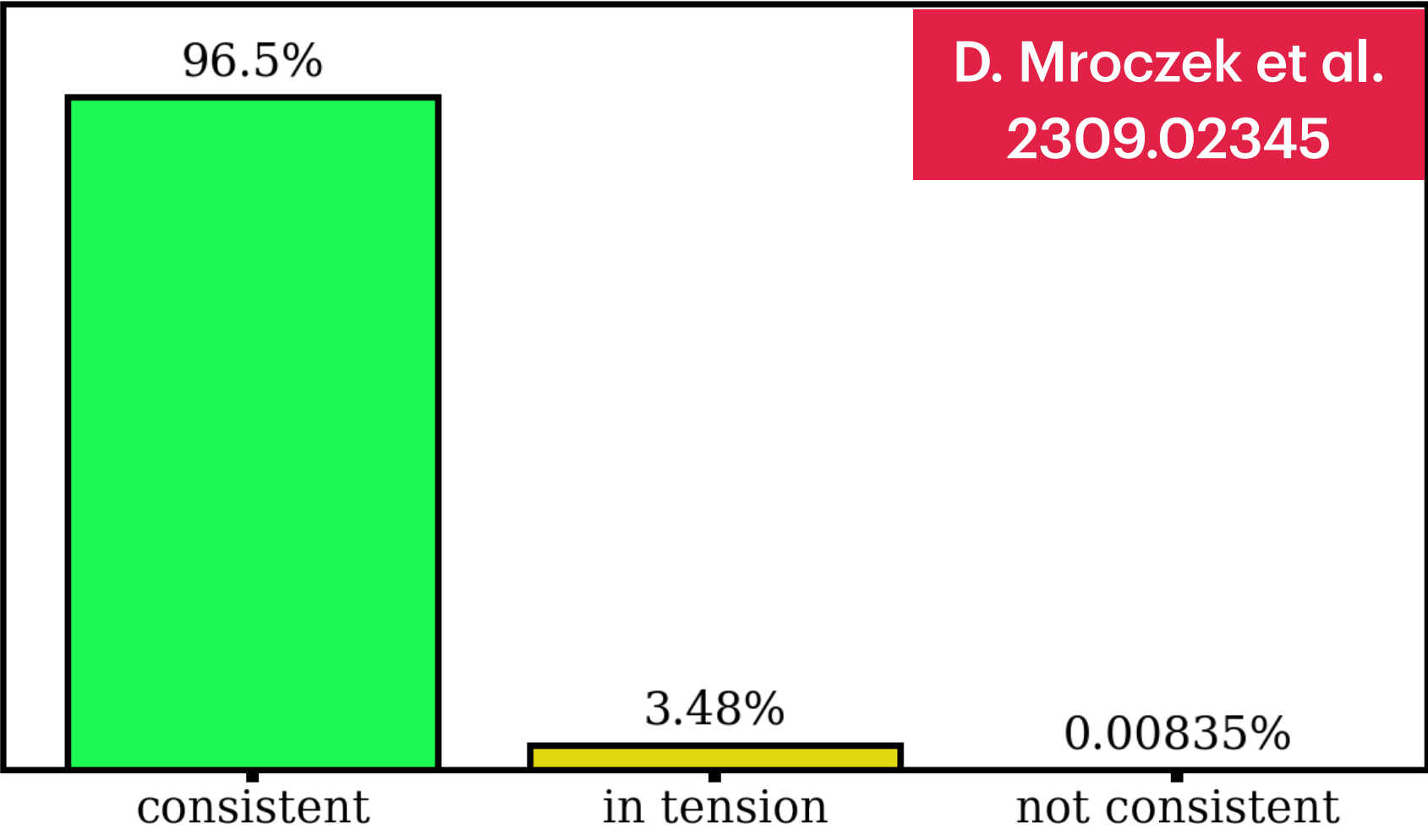


Posterior

Benchmark (GP):  $c_s^2$  peak near  $n_B^{\text{max}}$  → **monotonic**  $c_s^2(n_B)$   
Benchmark + structure (mGP): **bump allowed**  $\sim 2 - 3 n_{\text{sat}}$



# What is the impact of pQCD constraints applied at $n_B^{\text{max}}$ ?



Note: log-log axes!

pQCD results must be averaged over an unphysical scale due to uncertainty around missing higher-order terms.

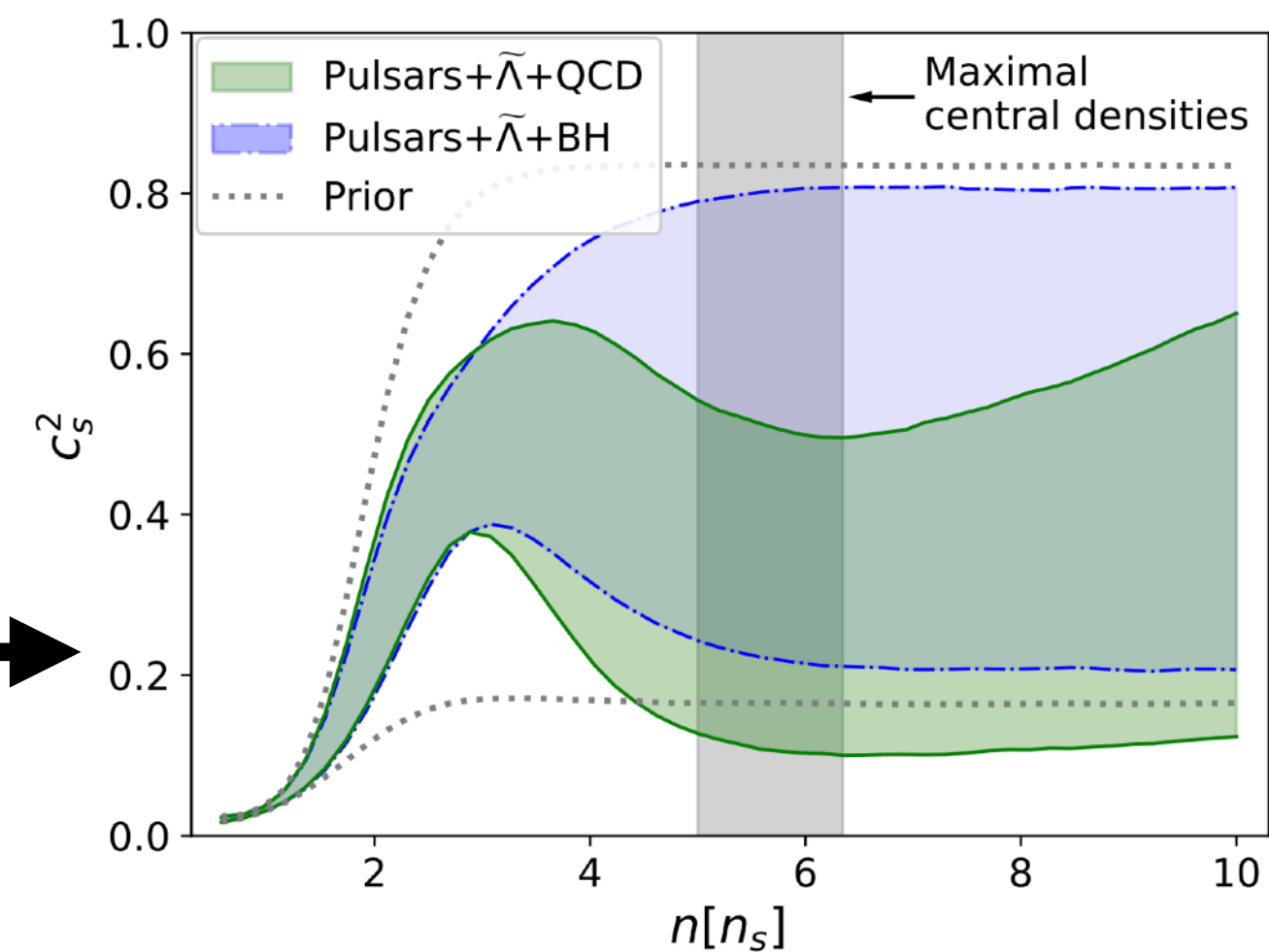
- Adopt the scale-averaging approach in Gorda et al. (Astrophys. J., 2023)
- $w_{\text{pQCD}} = 0$  : not consistent with any results considered
- $0 < w_{\text{pQCD}} < 1$  : in tension with at least one result considered
- $w_{\text{pQCD}} = 1$  : consistent with all results considered

pQCD constraints applied at  $n_B^{\text{max}}$  do not affect EoS posteriors

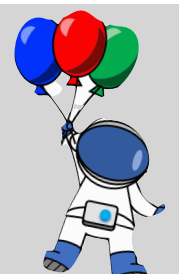
BUT

they seem to have a significant impact when applied 10  $n_{\text{sat}}$

Why?



Gorda et al. Astrophys. J. (2023)



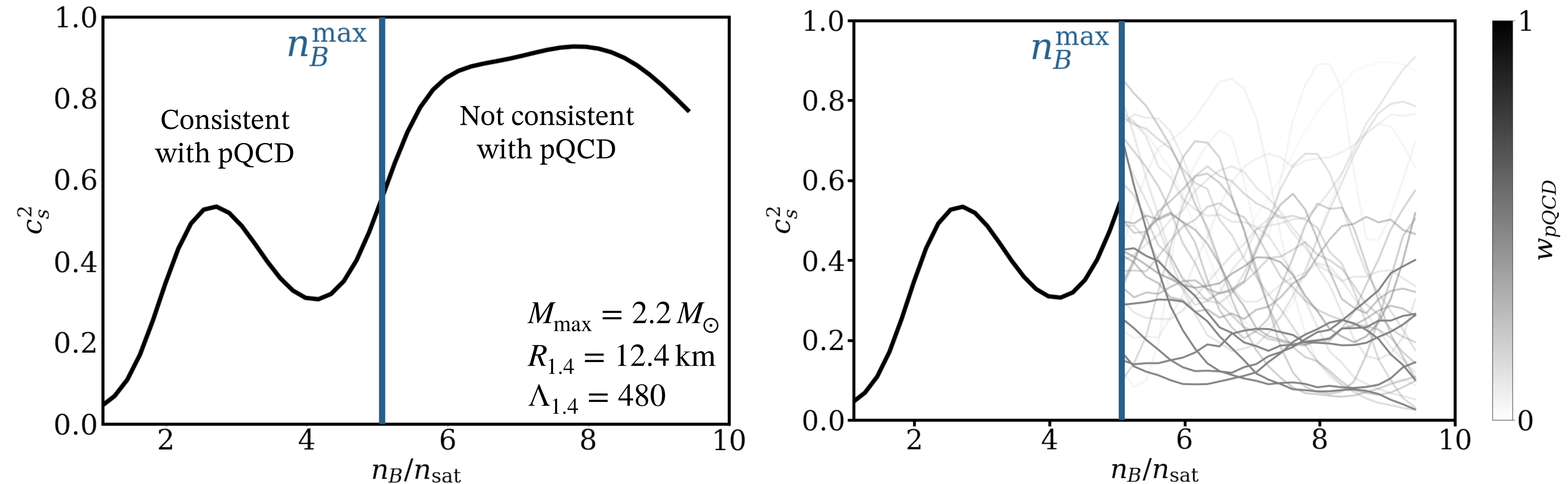


# The role of pQCD beyond NS densities

In prep: D. Mroczek, R. Somasundaram, I. Tews, M.C. Miller,  
J. Noronha-Hostler, N. Yunes, J. Margueron

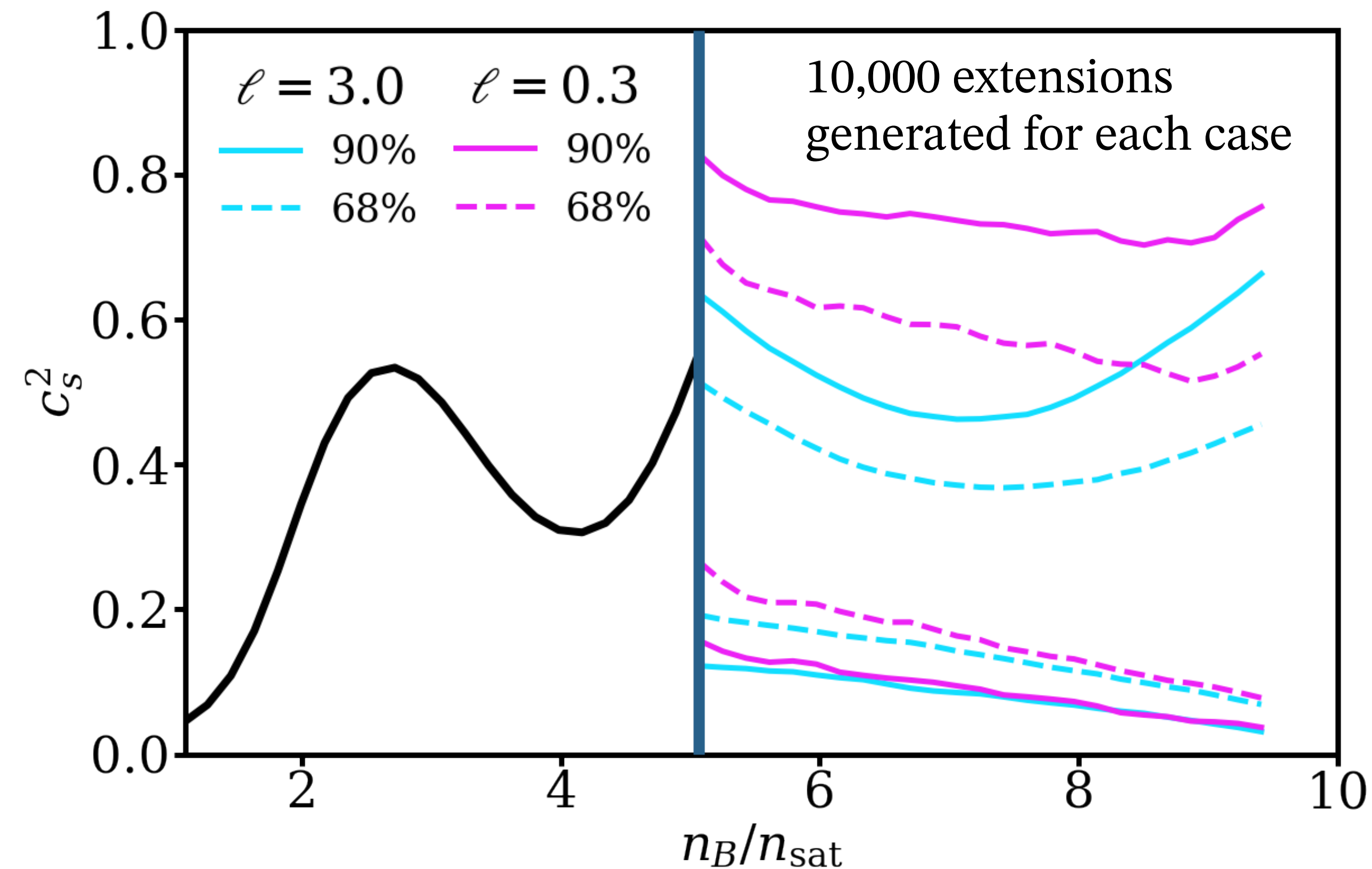
**Method:** build extensions of a strong candidate EoS beyond  $n_B^{\max}$ , use pQCD input at  $10 n_{\text{sat}}$

**Goal:** Learn about prior dependence of pQCD constraints between  $n_B^{\max}$  and  $10 n_{\text{sat}}$



# Short-range correlations reduce sensitivity to pQCD constraints

We tested **long- and short-range** correlations across densities (units of  $n_{\text{sat}}$ )

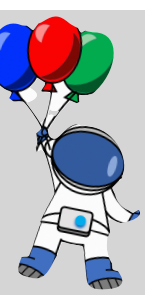


In prep: D. Mroczek, R. Somasundaram, I. Tews, M.C. Miller,  
J. Noronha-Hostler, N. Yunes, J. Margueron

- EoS **must soften** (68% credibility) when **long-range** correlations are present.
- **NOT** the case when **short-range** correlations are assumed.

EoS posteriors from pQCD constraints applied beyond  $n_B^{\text{max}}$  are **model dependent**

How EoS posteriors are affected by pQCD constraints applied beyond  $n_B^{\text{max}}$  can be studied systematically with multi-scale correlations.





# Are there nontrivial features in the $c_s^2$ inside neutron stars?

We find a **Bayes factor of  $K = 1.5$**  between GP and mGP  $\rightarrow$  current constraints do not favor either model.

**Physical interpretation:** multi-scale correlations and nontrivial features in  $c_s^2(n_B)$  inside neutron stars are **not ruled out** by current constraints, but **neither are they required**.

## Summary and outlook

- Nuclear physics models predict **nontrivial features** in  $c_s^2$  and **multi-scale correlations** across densities when **exotic degrees of freedom** are present.
- Introduced **modified Gaussian processes** as novel approach for **modeling nontrivial features** in  $c_s^2$ .
- Performed a fully Bayesian analysis including astrophysical, low-energy, and pQCD constraints.
- **Multi-scale correlations** important for **searches for a crossover** within NS densities.
- **pQCD** applied **beyond central densities** realized in neutron stars leads to **model-dependent constraints** — pQCD applied at  $n_B^{\max}$  currently does not affect EoS posteriors.

