

# A nonparametric tour of neutron-star matter with gravitational waves

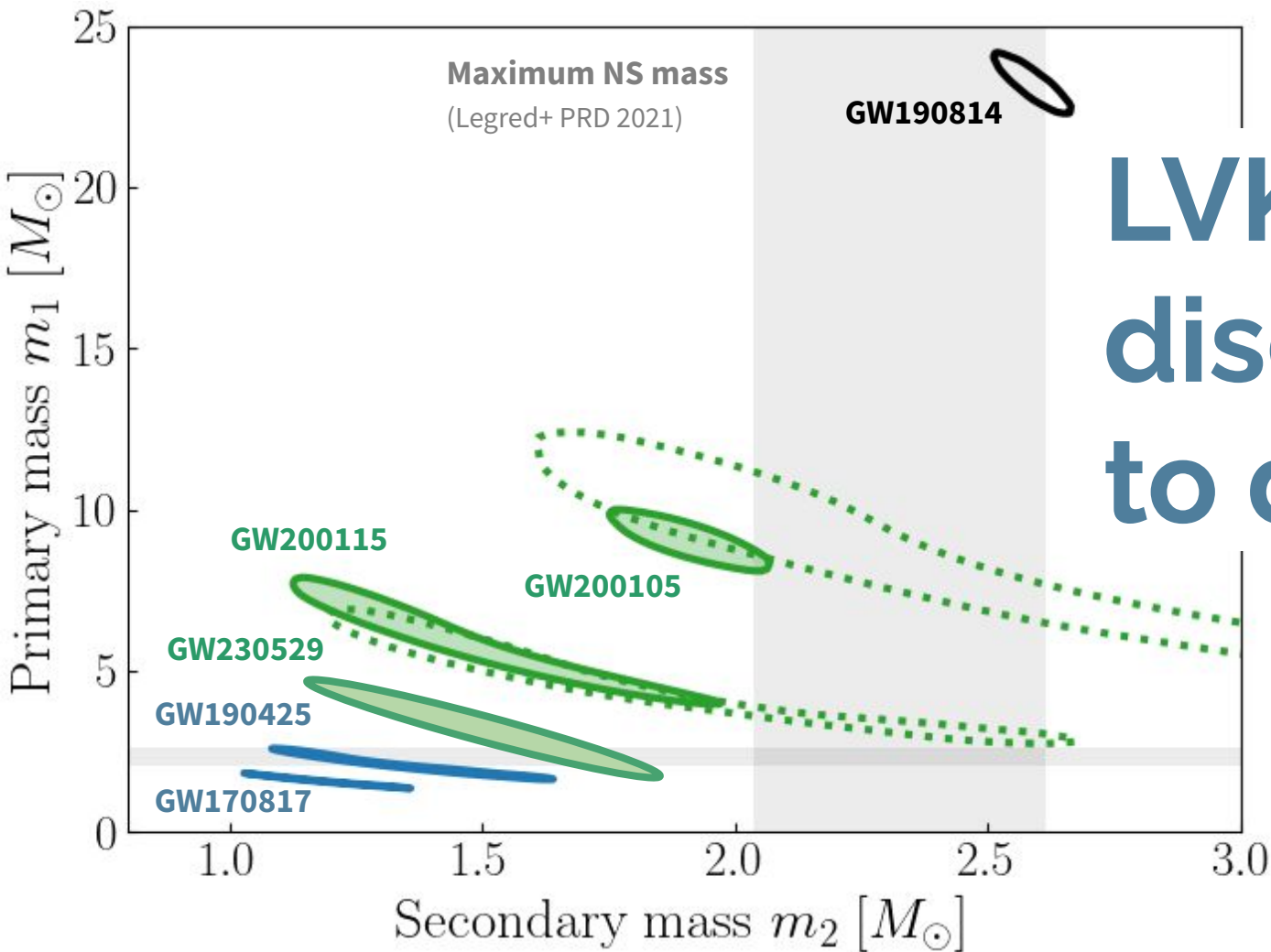
Philippe Landry ♦ Canadian Institute for Theoretical Astrophysics

based on work with Reed Essick, Katerina Chatziioannou, Isaac Legred, Sophia Han, Ingo Tews, Sanjay Reddy, and many other collaborators



INT-N3AS 24-89W – 6 Sep 2024

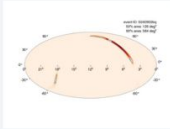
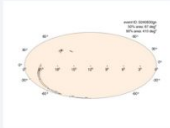
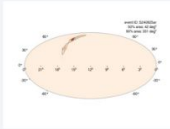




# LVK NS discoveries to date

**GWTC-3 catalog\***  
Abbott+ PRX 13 041039 (2023)

\*plus GW230529  
Abac+ ApJL 970 L34 (2024)

Event ID	Possible Source (Probability)	Significant	UTC	GCN	Location	FAR
<a href="#">S240902bq</a>	BBH (>99%)	Yes	Sept. 2, 2024 14:33:06 UTC	<a href="#">GCN Circular Query</a> <a href="#">Notices   VOE</a>		1 per 12.505 years
<a href="#">S240830gn</a>	BBH (89%), NSBH (11%)	Yes	Aug. 30, 2024 21:11:20 UTC	<a href="#">GCN Circular Query</a> <a href="#">Notices   VOE</a>		1 per 50.02 years
<a href="#">S240825ar</a>	BBH (97%), NSBH (3%)	Yes	Aug. 25, 2024 05:51:46 UTC	<a href="#">GCN Circular Query</a> <a href="#">Notices   VOE</a>		1 per 10.004 years
<a href="#">S240813d</a>	BBH (>99%)	Yes	Aug. 13, 2024 04:39:13 UTC	<a href="#">GCN Circular Query</a> <a href="#">Notices   VOE</a>		1 per 1.7544e+10 years

# real-time public alerts

[gracedb.ligo.org](https://gracedb.ligo.org)

Event ID	Possible Source (Probability)	Significant	UTC
S240902bq	BBH (>99%)	Yes	Sept. 2, 2024 14:33:06 UTC
S240830gn	BBH (89%), NSBH (11%)	Yes	Aug. 30, 2024 21:11:20 UTC
S240825ar	BBH (97%), NSBH (3%)	Yes	Aug. 25, 2024 05:51:46 UTC
S240813d	BBH (>99%)	Yes	Aug. 13, 2024 04:39:13 UTC

# open data

gwosc.org



[New Search](#) [Help](#)

## GWTC

Name	Version	Release	GPS	Mass 1 ( $M_{\odot}$ )	Mass 2 ( $M_{\odot}$ )	Network SNR	Distance (Mpc)	$\chi_{\text{eff}}$	Total Mass ( $M_{\odot}$ )
<a href="#">GW200322_091133</a>	v1	<a href="#">GWTC-3-confident</a>	1268903511.3	+130 38 -22	+24.3 11.3 -6.0	+2.7 4.5 -3.0	+12500 3500 -2200	+0.54 0.27 -0.58	+132 50 -22
<a href="#">GW200316_215756</a>	v1	<a href="#">GWTC-3-confident</a>	1268431094.1	+10.2 131 -2.9	+2.0 7.8 -2.9	+0.4 10.3 -0.7	+480 1120 -440	+0.27 0.13 -0.10	+7.2 21.2 -2.0
<a href="#">GW200311_115853</a>	v1	<a href="#">GWTC-3-confident</a>	1267963151.3	+6.4 34.2 -3.8	+4.1 27.7 -5.9	+0.2 17.8 -0.2	+280 1170 -400	+0.16 -0.02 -0.20	+5.3 61.9 -4.2
<a href="#">GW200308_173609</a>	v1	<a href="#">GWTC-3-confident</a>	1267724187.7	+166 60 -29	+36 24 -13	+2.5 4.7 -2.9	+13900 7100 -4400	+0.58 0.16 -0.49	+169.0 92.0 -48.0
<a href="#">GW200306_093714</a>	v1	<a href="#">GWTC-3-confident</a>	1267522652.1	+171 28.3 -7.7	+6.5 14.8 -6.4	+0.4 7.8 -0.6	+1700 2100 -1100	+0.28 0.32 -0.46	+11.8 43.9 -7.5
<a href="#">GW200302_015811</a>	v1	<a href="#">GWTC-3-confident</a>	1267149509.5	+8.7 37.8 -8.5	+8.1 20.0 -5.7	+0.3 10.8 -0.4	+1020 1480 -700	+0.25 0.01 -0.26	+9.6 57.8 -6.9
<a href="#">GW200225_060421</a>	v1	<a href="#">GWTC-3-confident</a>	1266645879.3	+5.0 19.3 -3.0	+2.8 14.0 -3.5	+0.3 12.5 -0.4	+510 1150 -530	+0.17 -0.12 -0.28	+3.6 33.5 -3.0

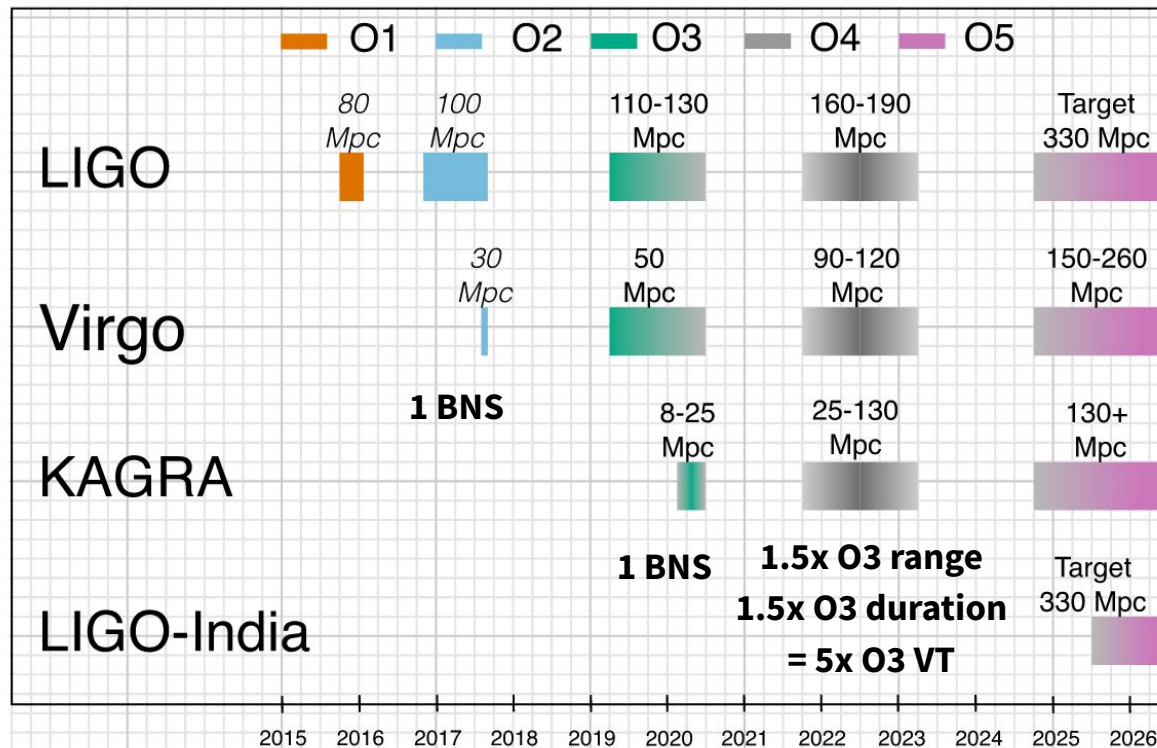
# real-time public alerts

gracedb.ligo.org

# LVK O4 & beyond

## observing prospects

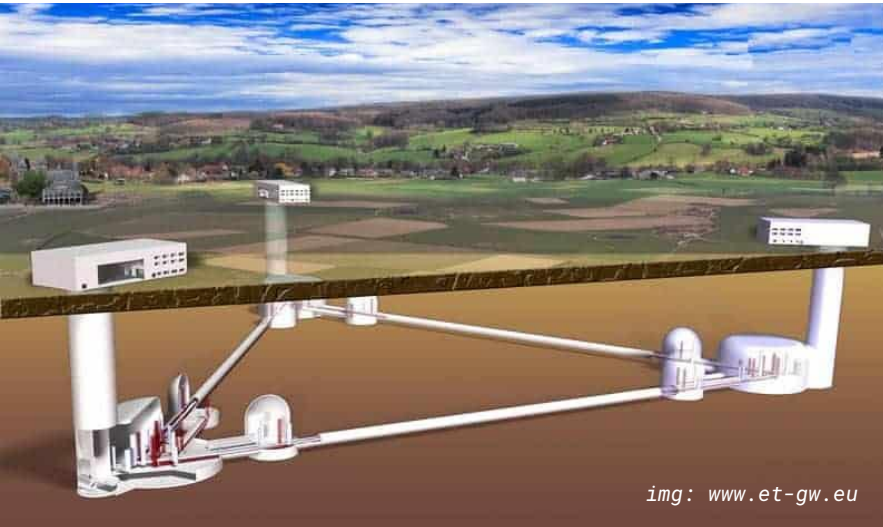
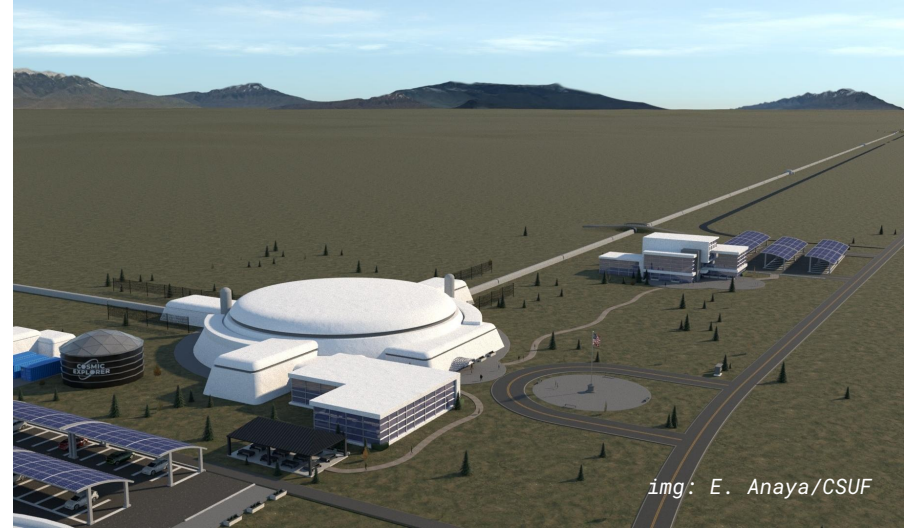
Abbott+ LRR 23 3 (2020)



Colombo+ ApJ 937 79 (2022), Patricelli+ MNRAS 513 3 (2022) predict one multimessenger BNS detection during O4

# Cosmic Explorer: a US-led next-gen GW observatory project

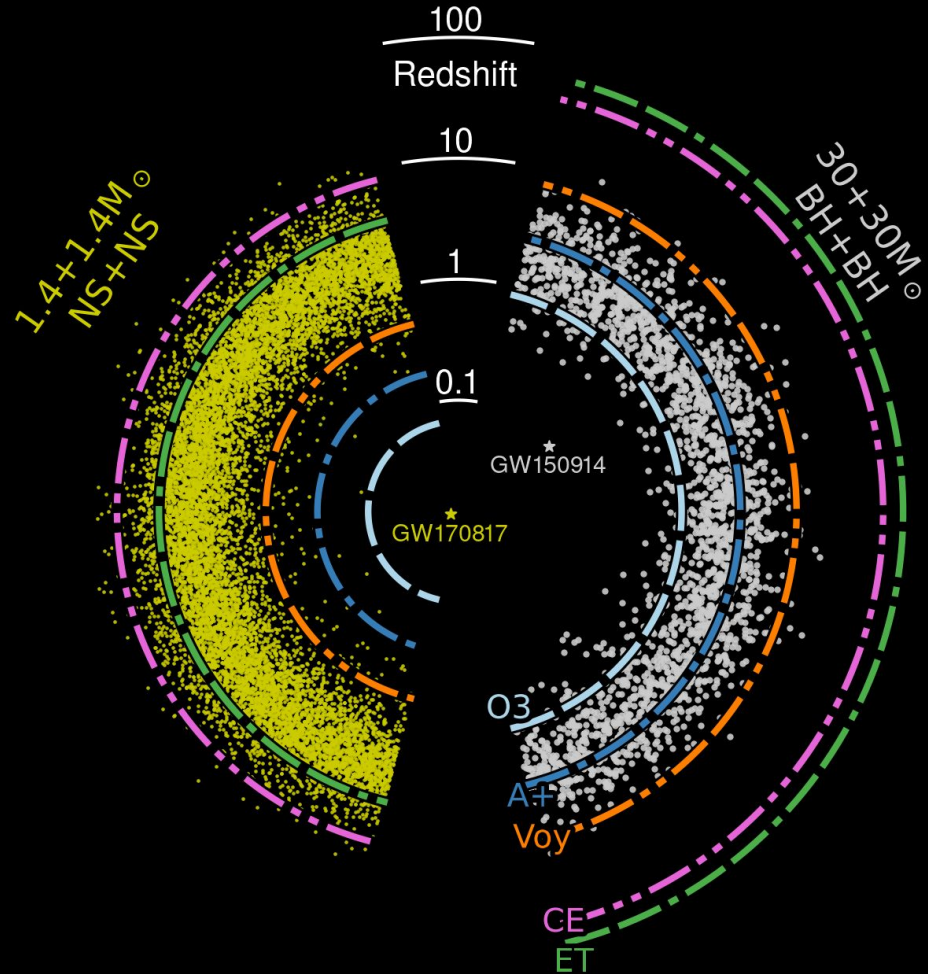
20 and 40 km L-shaped surface  
interferometers, 10x LIGO A+ sensitivity



# Einstein Telescope: Europe's next-gen GW observatory

3 co-located detectors, each with high-  
and low-frequency interferometers, in  
10 km triangular design, underground

**CE+ET BNS  
survey is  
complete to  
 $z \sim 0.5$  and  
sensitive to  
entire merging  
population**



Evans+ (incl. PL) arXiv:2109.09882

# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

GW parameter  
estimation likelihood      EOS m- $\Lambda$  relation

$$P(\text{eos} | d) \propto P(\text{eos}) \prod_i \int P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}) dm_{1,2}^i d\Lambda_{1,2}^i$$

EOS posterior

EOS prior

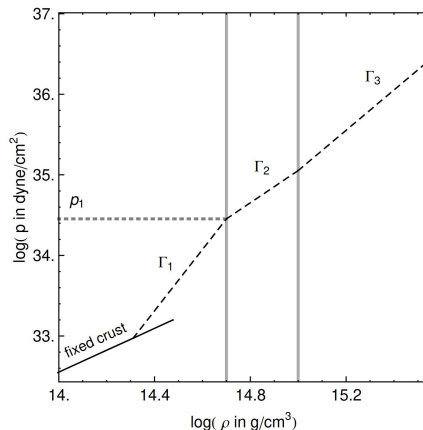
EOS likelihood



# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

Read+ PRD 79 124032 (2009)



## EOS prior

- EOS model
- prior support
- shape of prior

GW parameter

estimation likelihood

EOS  $m$ - $\Lambda$  relation

$$P(\text{eos} | d) \propto P(\text{eos}) \prod_i \int P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}) dm_{1,2}^i d\Lambda_{1,2}^i$$

EOS posterior

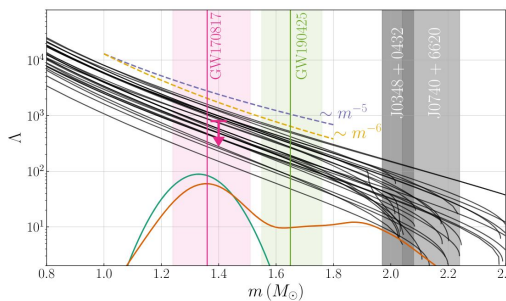
EOS prior

EOS likelihood

# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

Chatziioannou GRG 52 109 (2020)



## m- $\Lambda$ relation

- EOS model
- TOV solver
- interpolation

GW parameter  
estimation likelihood

EOS m- $\Lambda$  relation

$$P(\text{eos} | d) \propto P(\text{eos}) \prod_i \int P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}) dm_{1,2}^i d\Lambda_{1,2}^i$$

EOS posterior

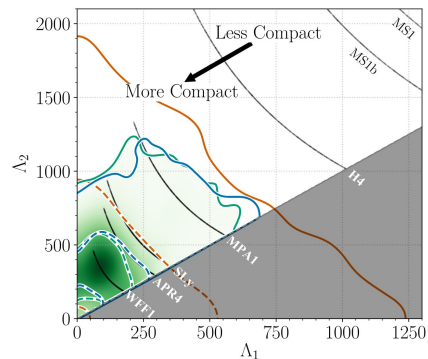
EOS prior

EOS likelihood

# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

LVC (incl. PL) PRL 2018



## GW likelihood

- waveform model
- sampling
- interpolation

GW parameter  
estimation likelihood

EOS  $m$ - $\Lambda$  relation

$$P(\text{eos} | d) \propto P(\text{eos}) \prod_i \int P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}) dm_{1,2}^i d\Lambda_{1,2}^i$$

EOS posterior

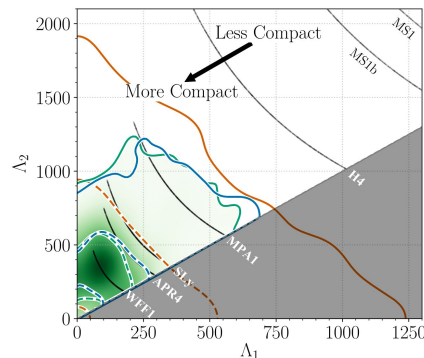
EOS prior

EOS likelihood

# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

LVC (incl. PL) PRL 2018



## EOS likelihood

- EOS model
- non-GW data
- sampling

GW parameter

estimation likelihood

EOS  $m$ - $\Lambda$  relation

$$P(\text{eos} | d) \propto P(\text{eos}) \underbrace{\prod_i \int P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}) dm_{1,2}^i d\Lambda_{1,2}^i}_{\text{EOS likelihood}}$$

EOS posterior

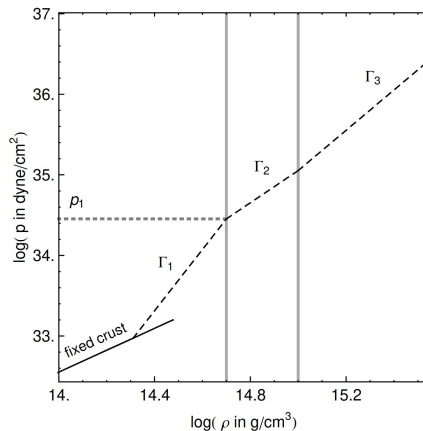
EOS prior

EOS likelihood

# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

Read+ PRD 79 124032 (2009)



## EOS prior

- EOS model
- prior support
- shape of prior

GW parameter

estimation likelihood

EOS  $m$ - $\Lambda$  relation

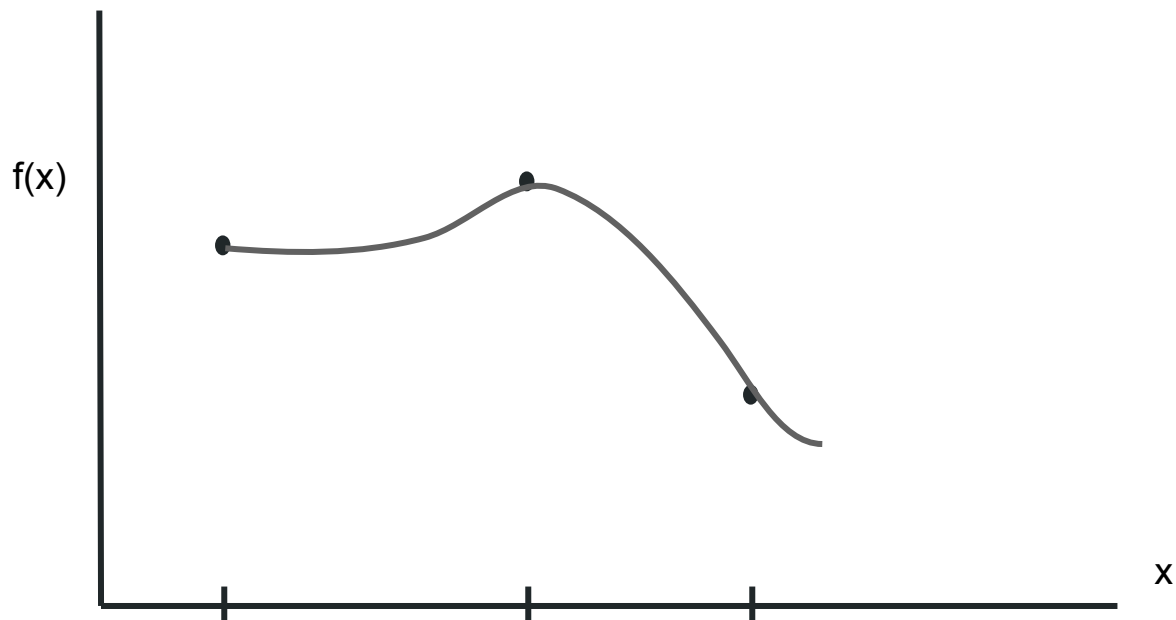
$$P(\text{eos} | d) \propto P(\text{eos}) \prod_i \int P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}) dm_{1,2}^i d\Lambda_{1,2}^i$$

EOS posterior

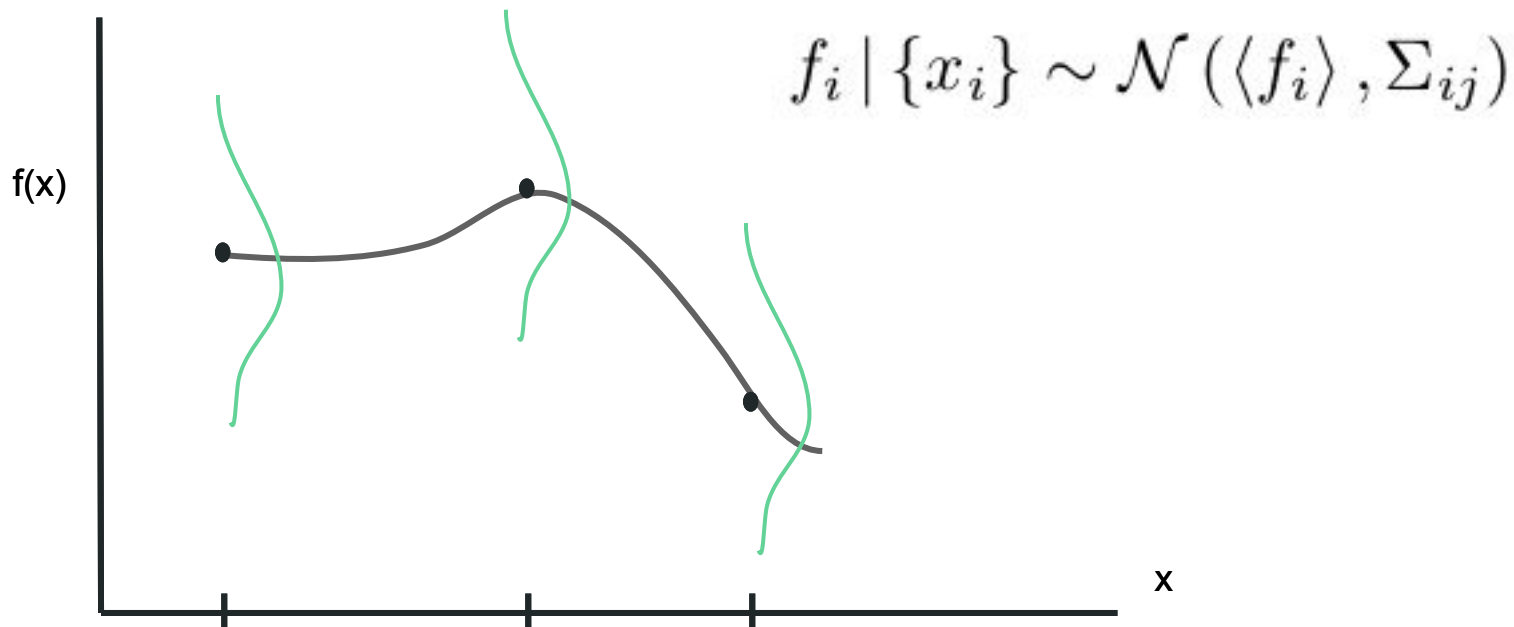
EOS prior

EOS likelihood

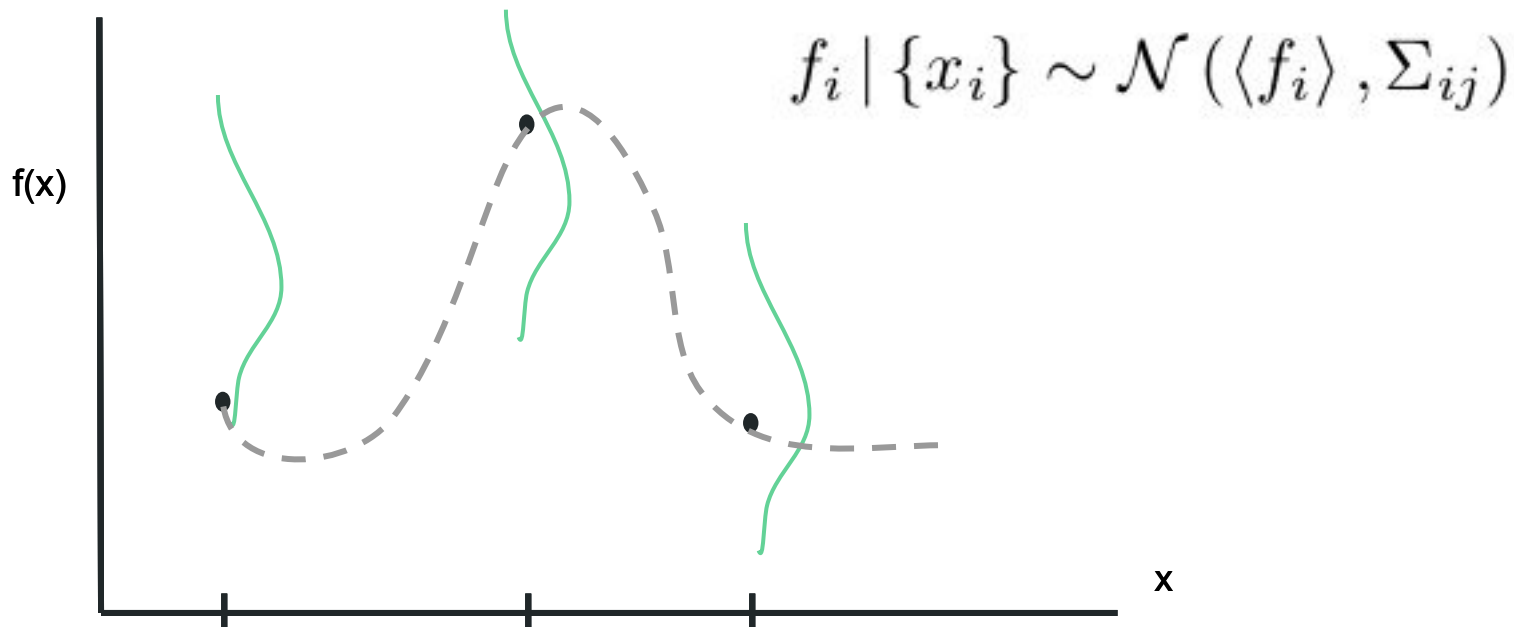
# Gaussian processes



# Gaussian processes

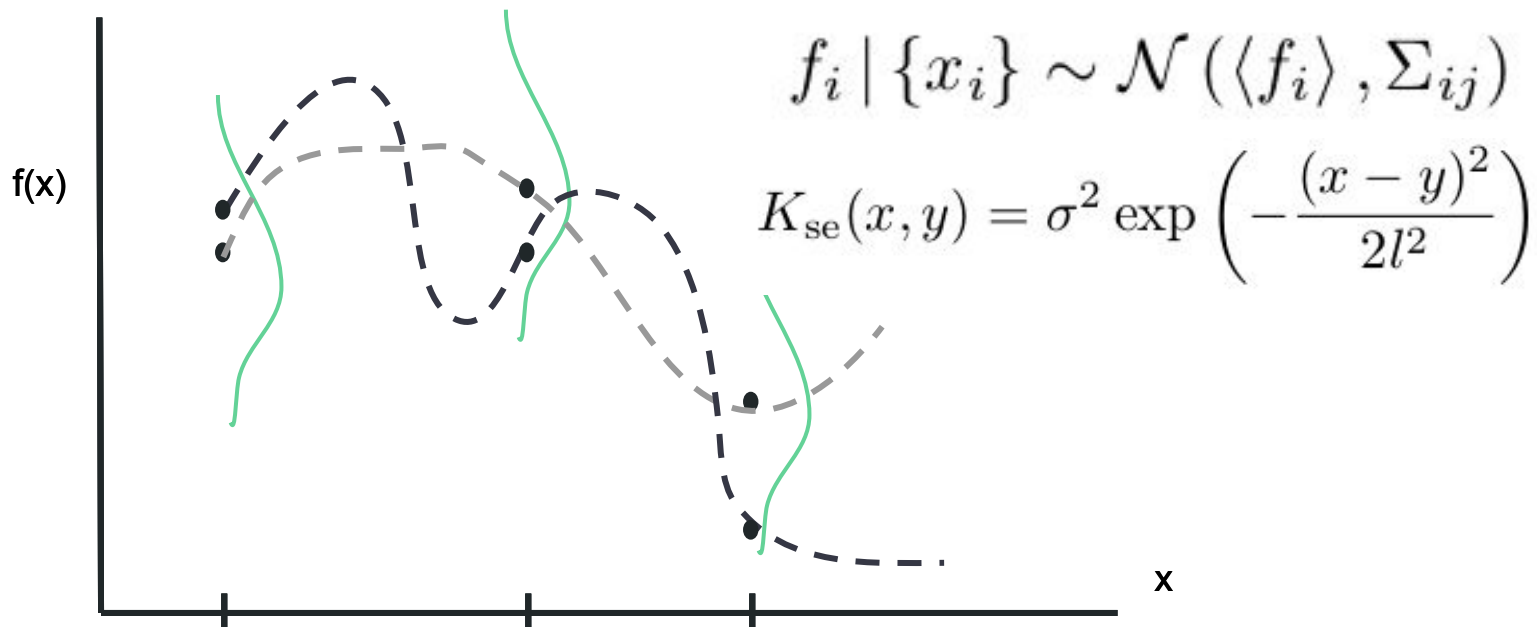


# Gaussian processes

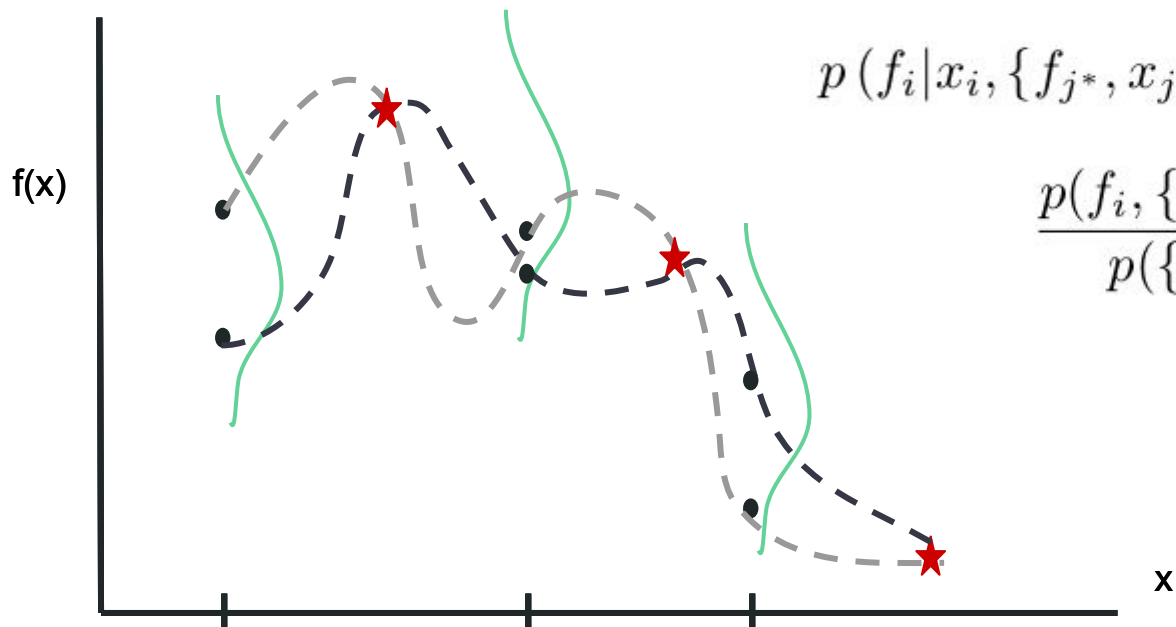




# Gaussian processes



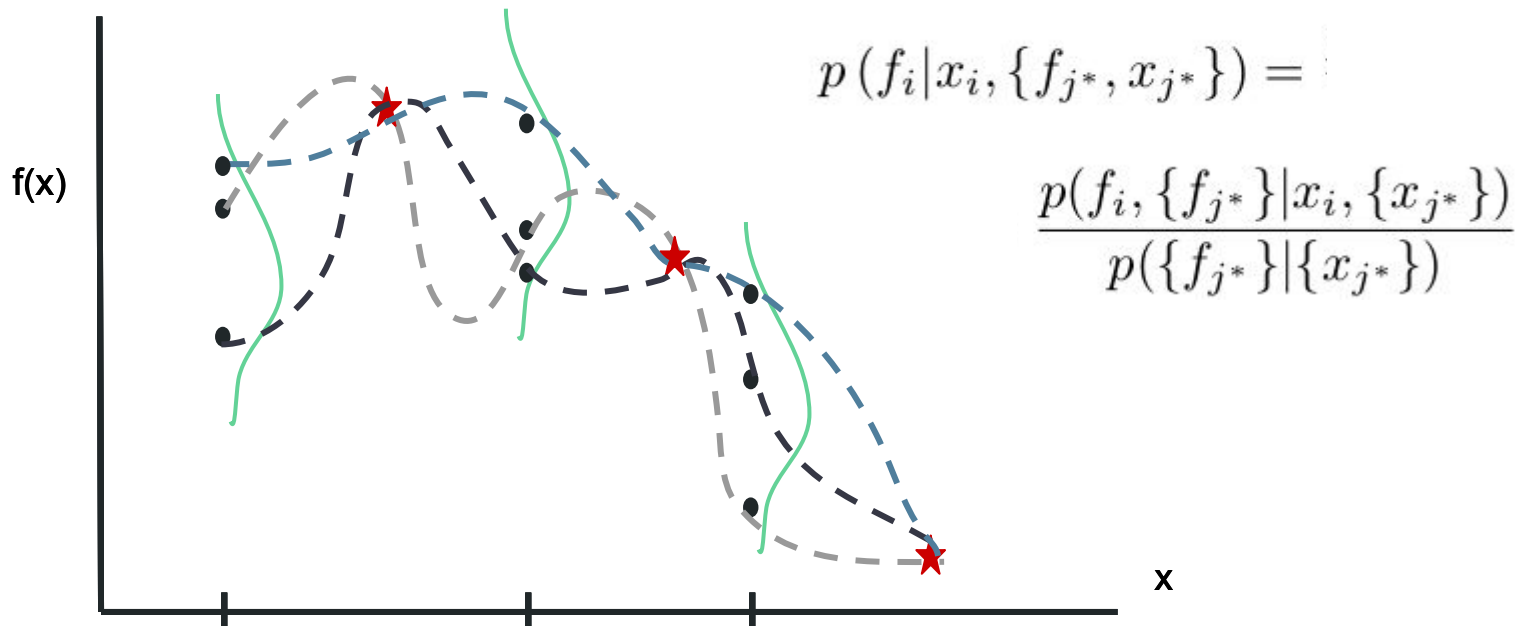
# Gaussian processes



$$p(f_i | x_i, \{f_{j^*}, x_{j^*}\}) =$$

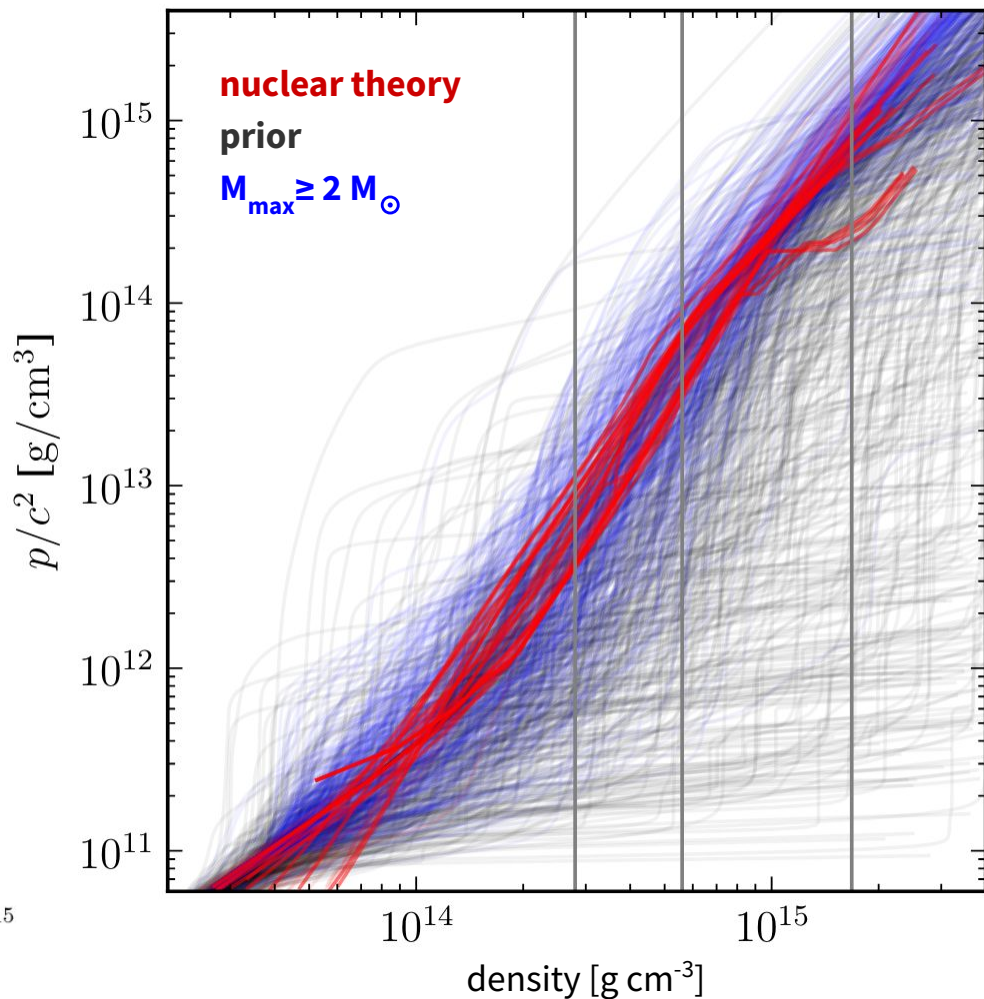
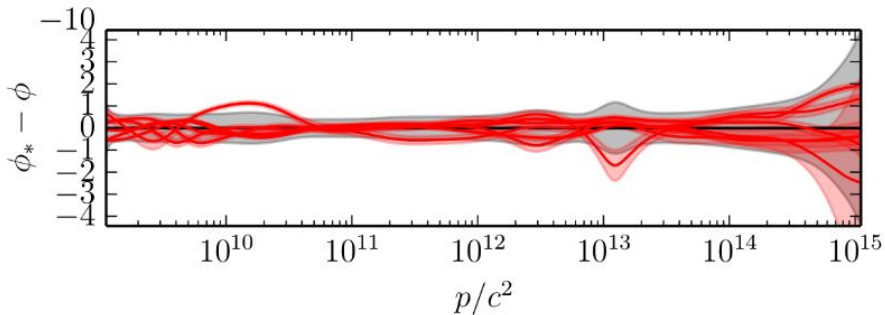
$$\frac{p(f_i, \{f_{j^*}\} | x_i, \{x_{j^*}\})}{p(\{f_{j^*}\} | \{x_{j^*}\})}$$

# Gaussian processes



# Gaussian process EOS model

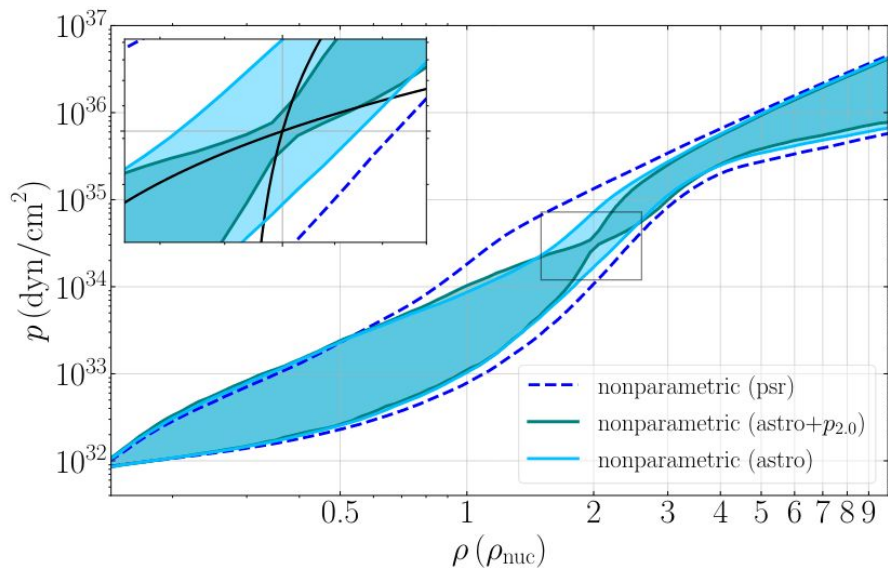
$$\phi = \log \left( c^2 \frac{d\mu}{dp} - 1 \right)$$



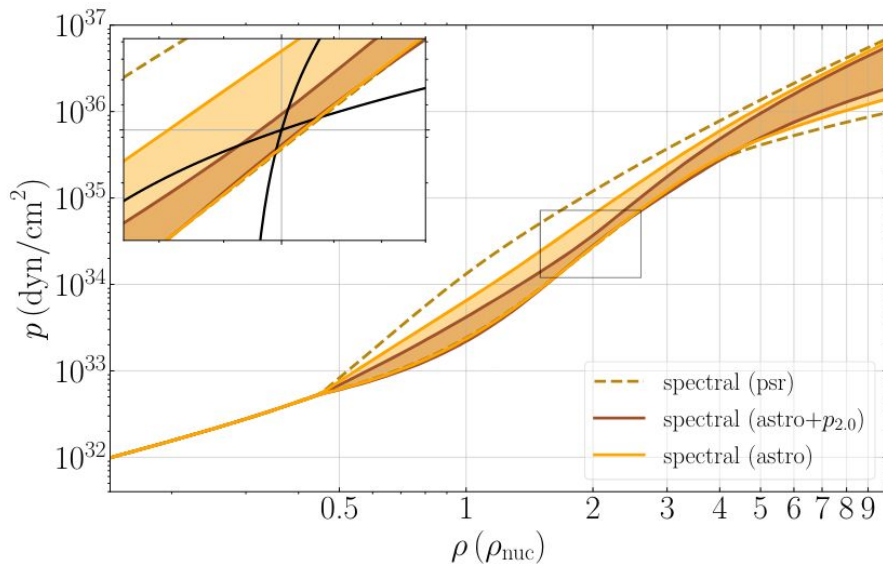
# implicit correlations in parametric EOS models

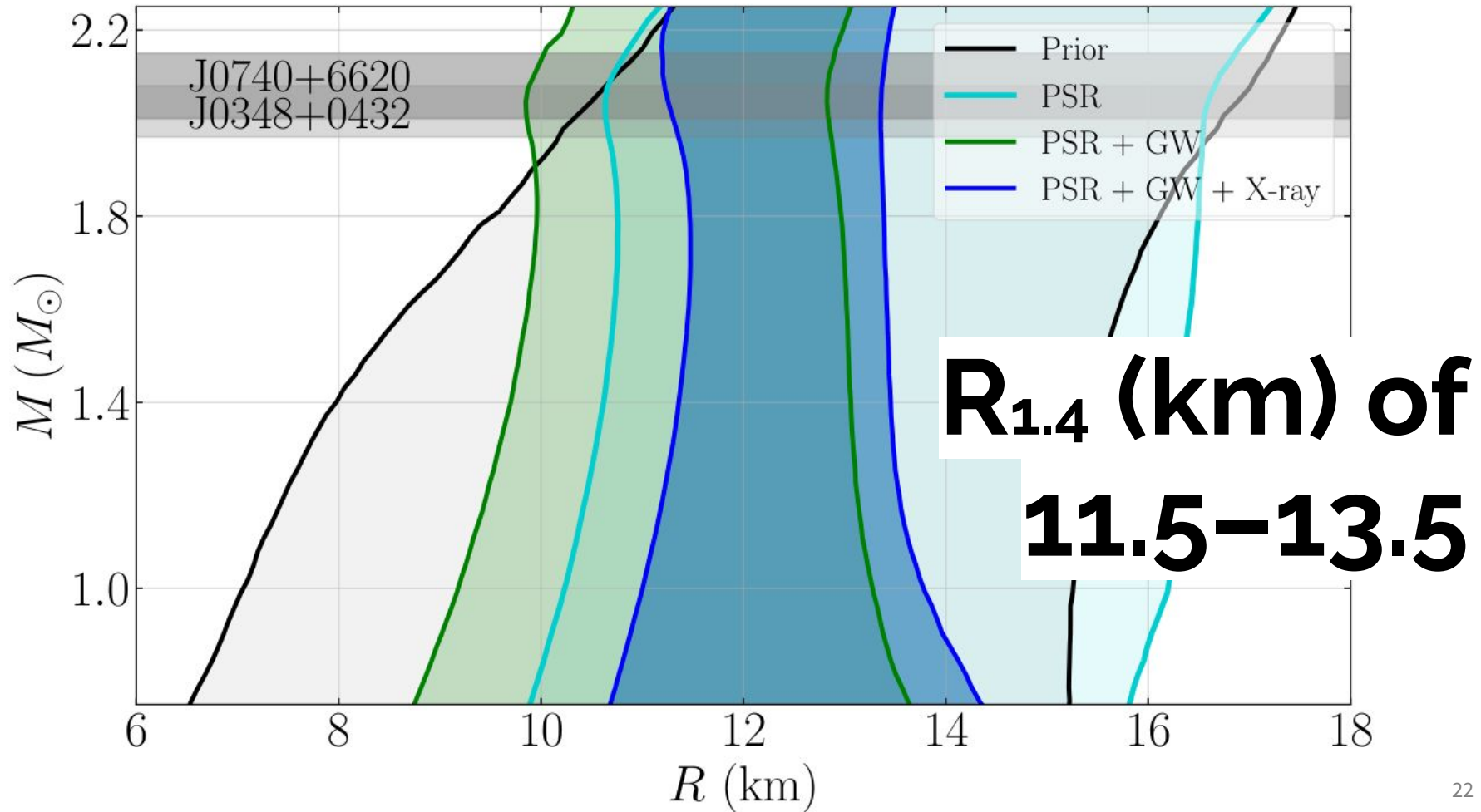
Legred+ (incl. PL)  
PRD 105 043016 (2022)

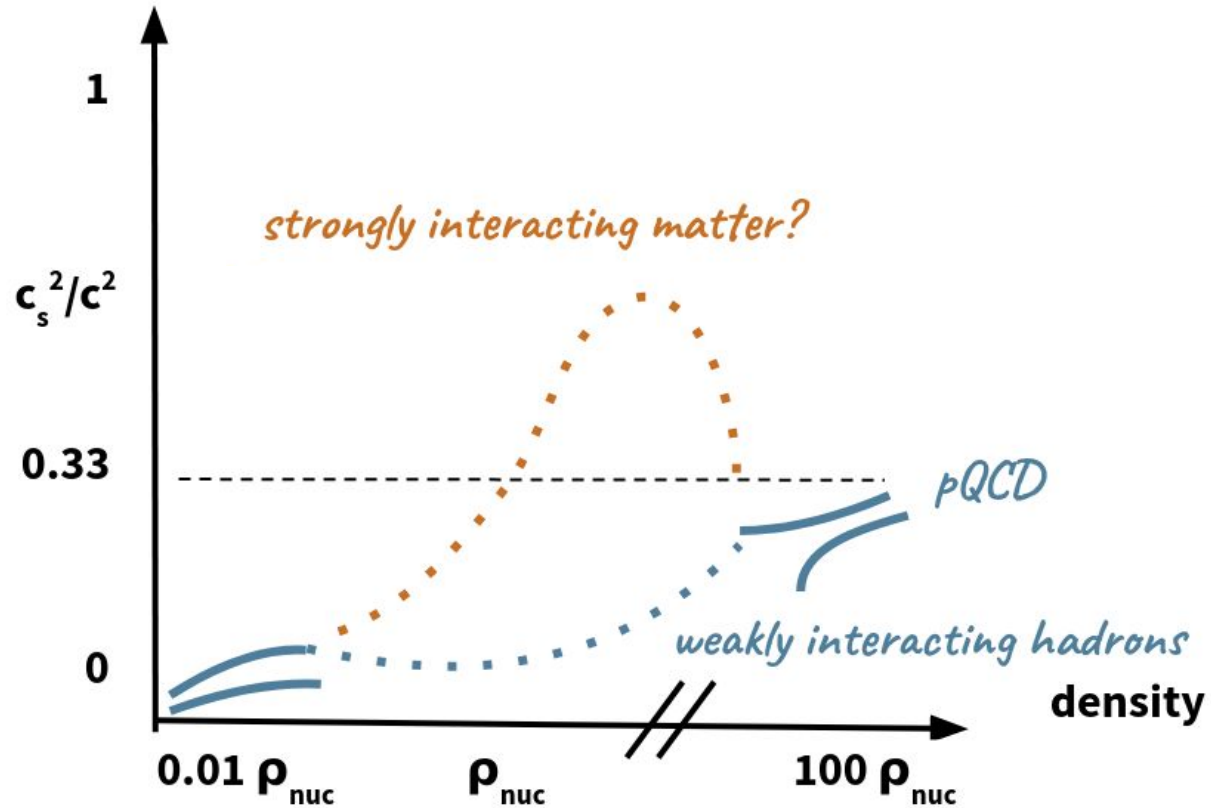
nonparametric

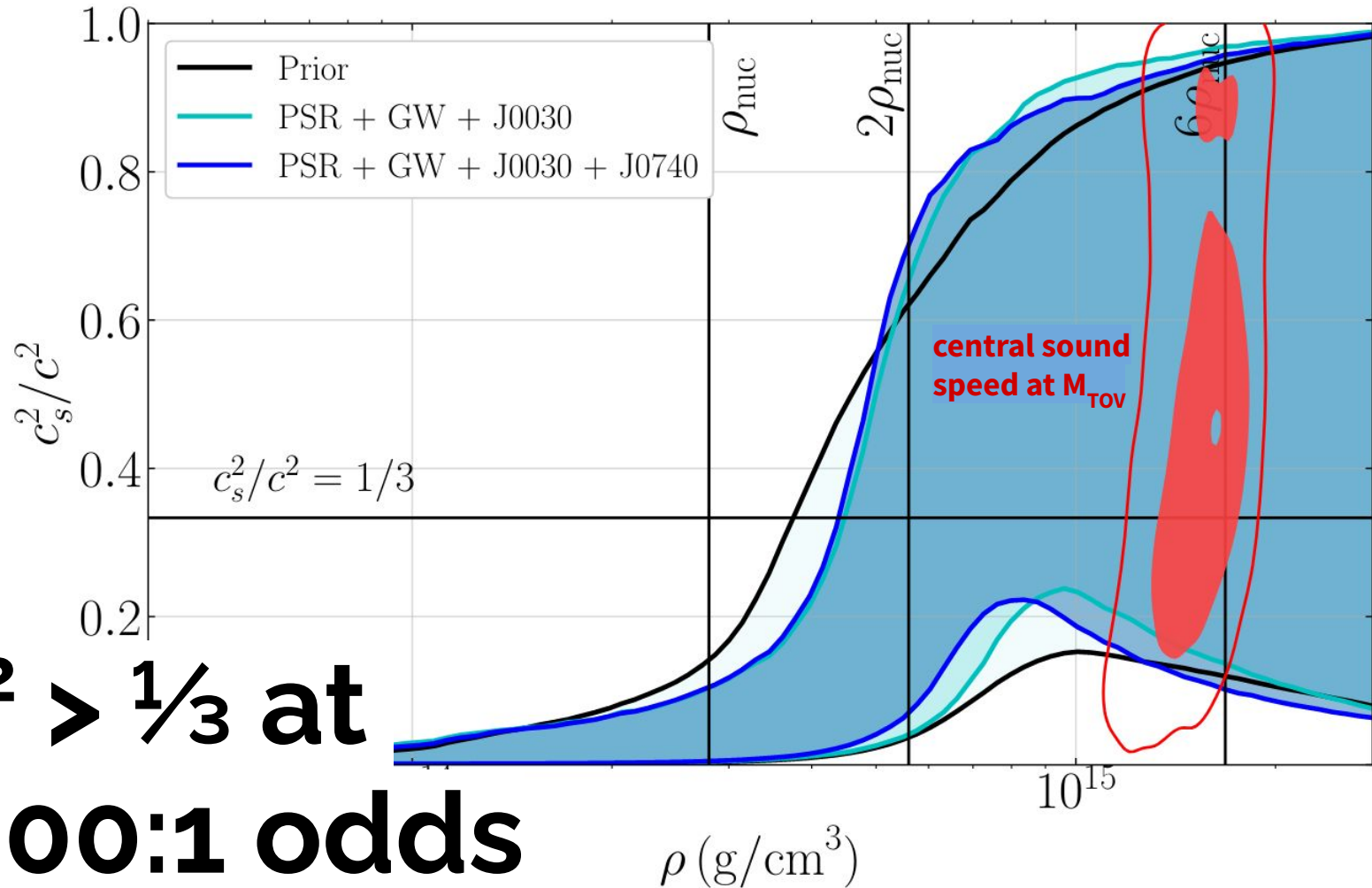


parametric



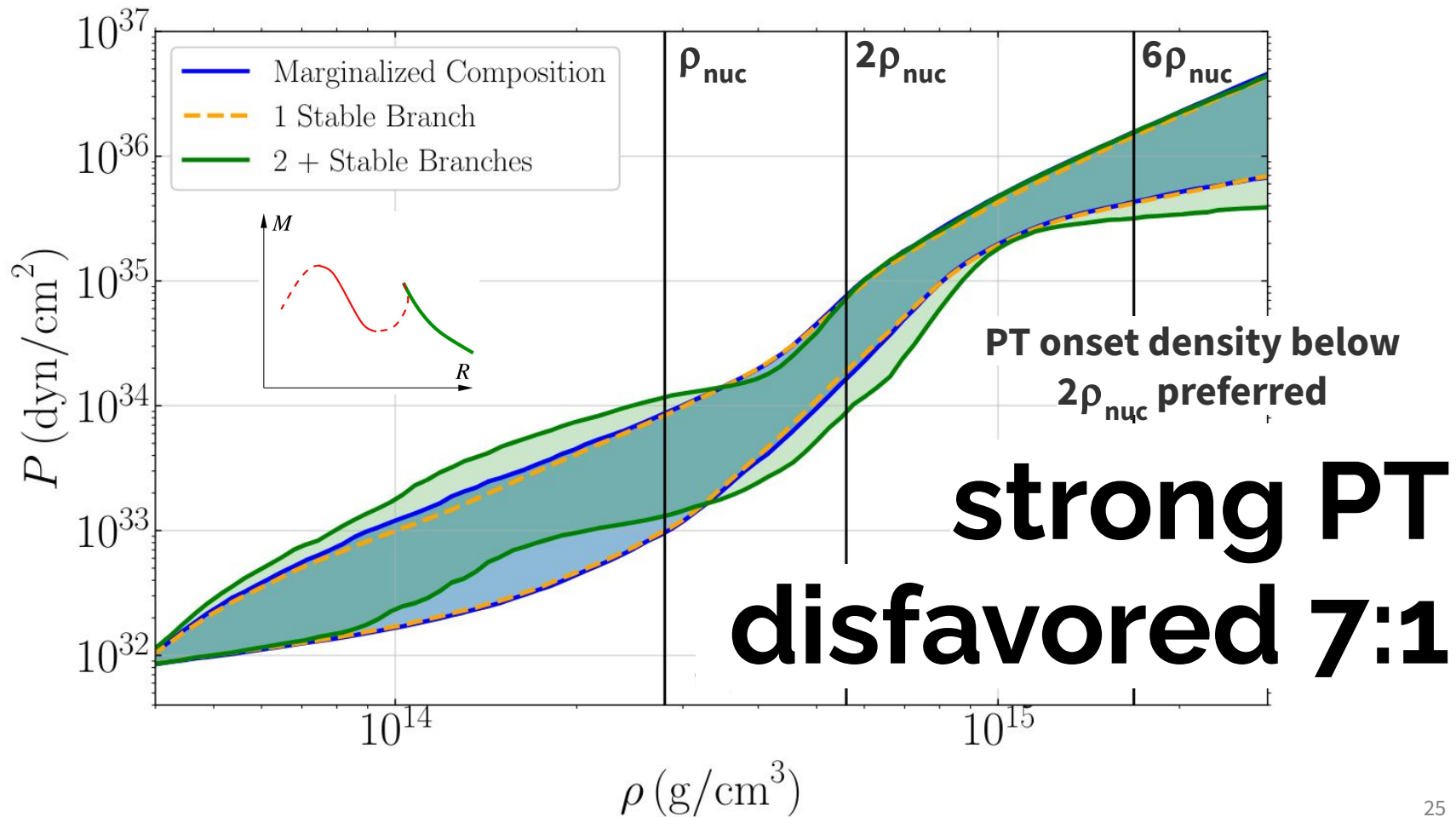






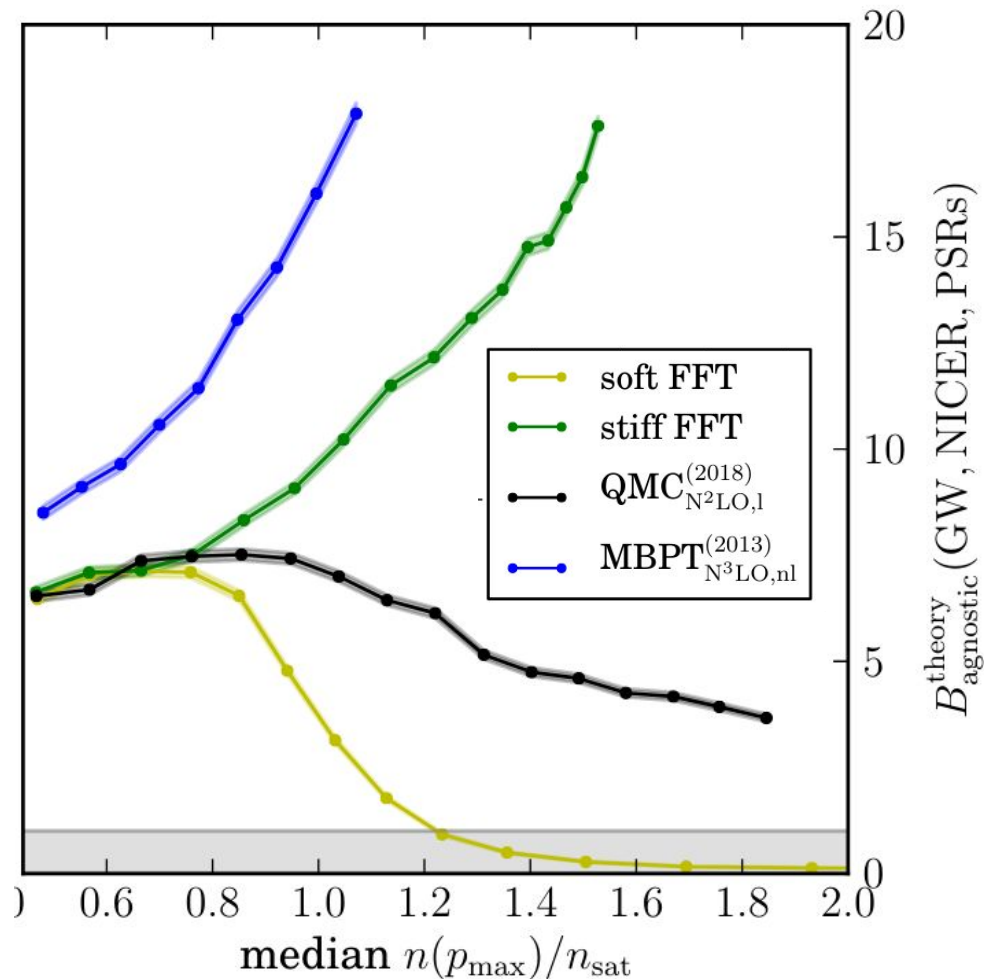
$c_s^2 > 1/3$  at  
 1000:1 odds



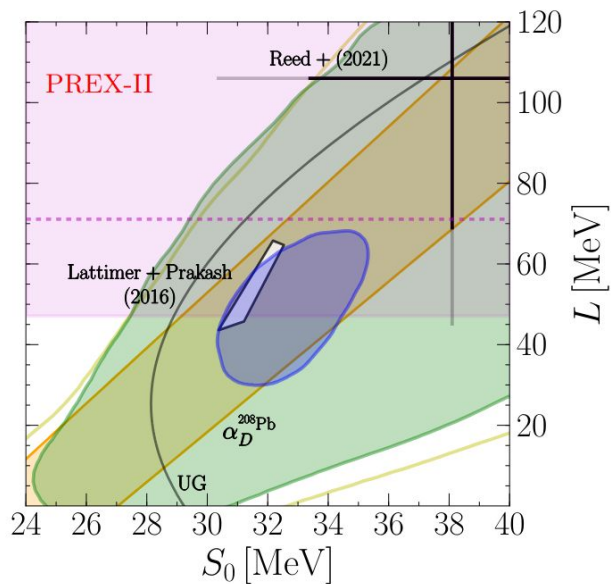


# where does XEFT break down?

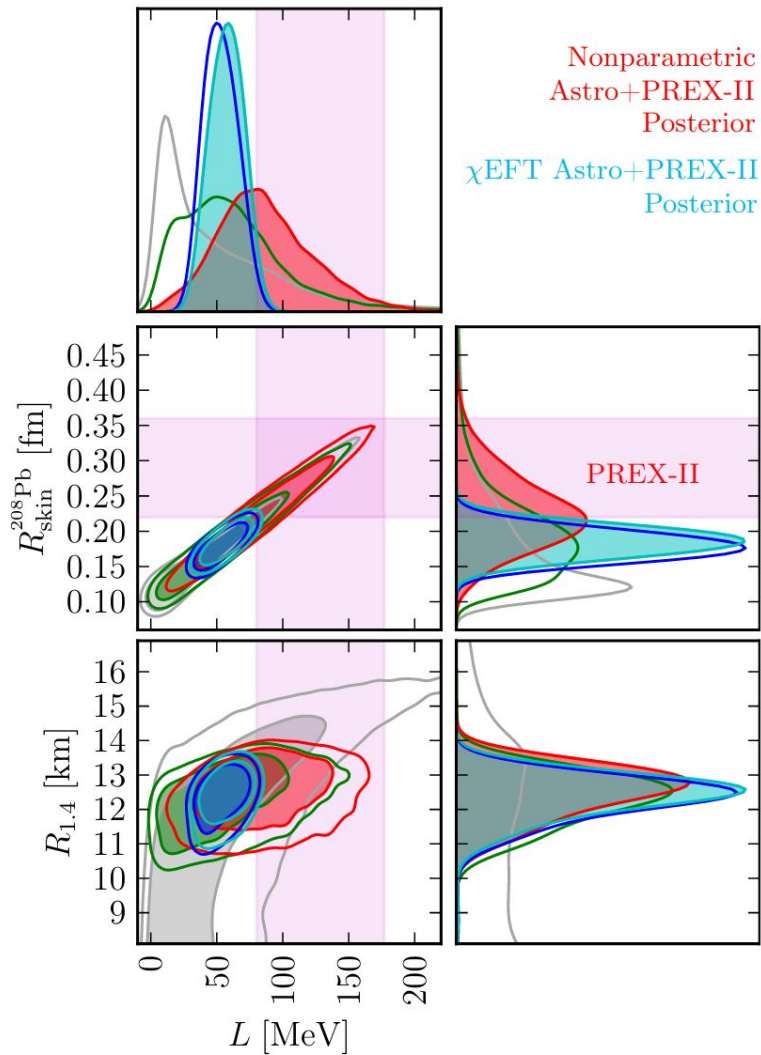
Essick+ (incl. PL) PRC 102 055803 (2020)

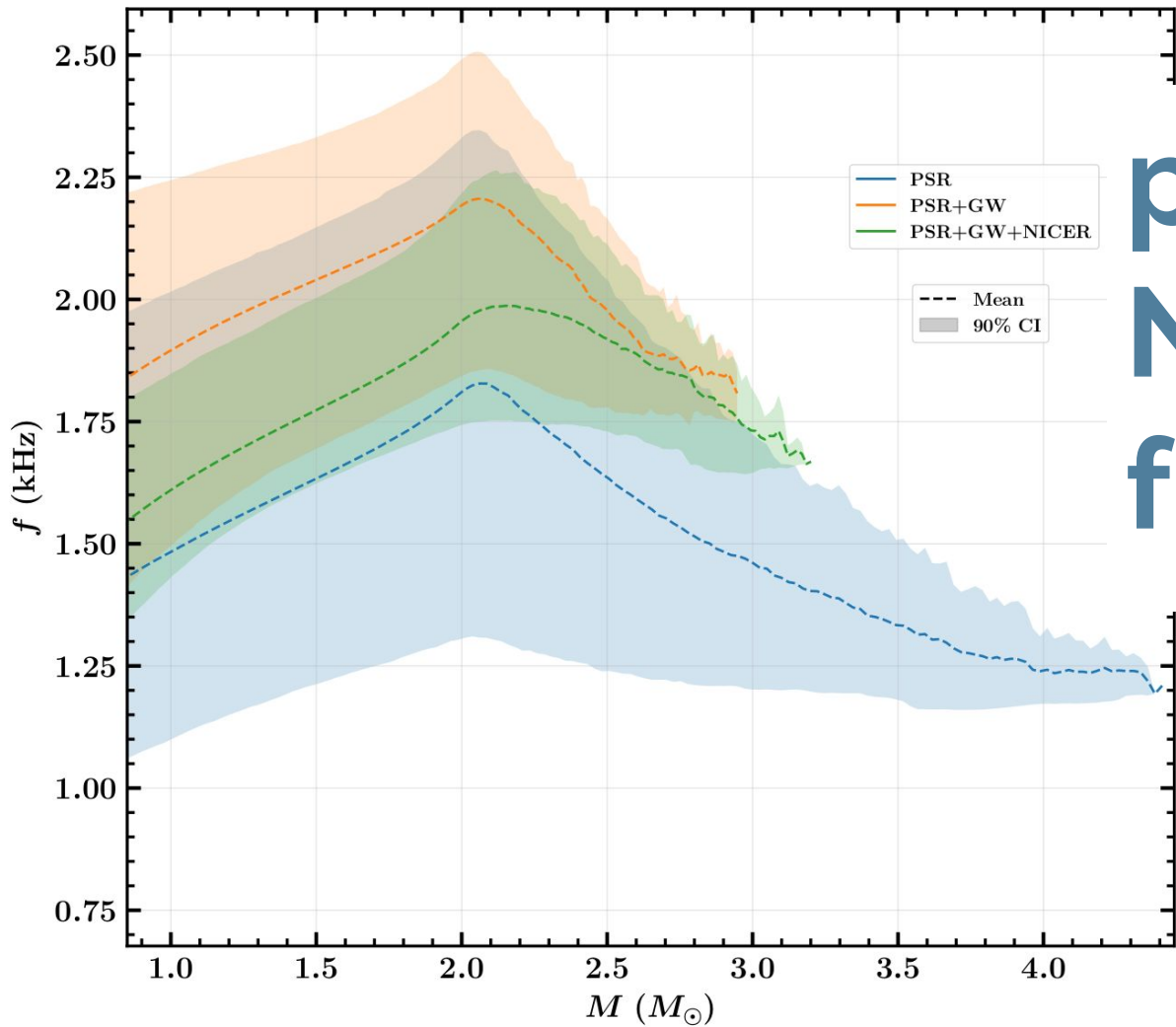


# joint nuclear & astro inference



**Essick+ (incl. PL)**  
**PRL 127 192701 (2021)**  
**PRC 104 065804 (2021)**



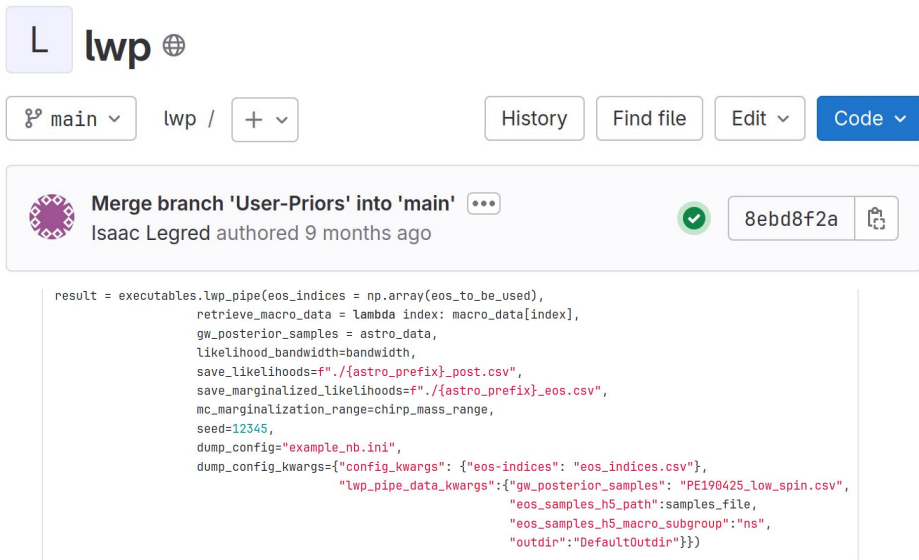


# predicting NS f-mode frequencies

Mohanty+ (incl. PL) in prep.

# public EOS inference code

[git.ligo.org/reed.essick/lwp](https://git.ligo.org/reed.essick/lwp)



```
result = executables.lwp_pipe(eos_indices = np.array(eos_to_be_used),
                             retrieve_macro_data = lambda index: macro_data[index],
                             gw_posterior_samples = astro_data,
                             likelihood_bandwidth=bandwidth,
                             save_likelihoods=f"./{astro_prefix}_post.csv",
                             save_marginalized_likelihoods=f"./{astro_prefix}_eos.csv",
                             mc_marginalization_range=chirp_mass_range,
                             seed=12345,
                             dump_config="example_nb.ini",
                             dump_config_kwargs={"config_kwargs": {"eos_indices": "eos_indices.csv"},
                                                  "lwp_pipe_data_kwargs":{"gw_posterior_samples": "PE190425_low_spin.csv",
                                                                           "eos_samples_h5_path": samples_file,
                                                                           "eos_samples_h5_macro_subgroup": "ns",
                                                                           "outdir": "DefaultOutdir"}}})
```

zenodo

Published April 28, 2022 | Version v1

Dataset Open

## Impact of the PSR J0740+6620 radius constraint on the properties of high-density matter: Neutron star equation of state posterior samples

Legred, Isaac<sup>1</sup>; Chatziioannou, Katerina<sup>1</sup>; Essick, Reed<sup>2</sup>; Han, Sophia<sup>3</sup>; Landry, Philippe<sup>4</sup>

Show affiliations

Equation of state posterior samples associated with Legred et al., "Impact of the PSR J0740+6620 radius constraint on the properties of high-density matter," Phys. Rev. D 104, 063003 (2021); doi:10.1103/PhysRevD.104.063003

# EOS posterior samples

[zenodo.org/records/6502467](https://zenodo.org/records/6502467)

# Bayesian EOS inference

Landry, Essick+Chatziioannou PRD 101 123007 (2020)

## population-scale data

- population model
- selection function
- hierarchical inference

GW parameter  
estimation likelihood

EOS  $m$ - $\Lambda$  relation +  
pop-informed mass prior

population  
prior

$$P(\text{eos} | d) \propto P(\text{eos}) \prod_i \int \frac{P(d_i | m_{1,2}^i, \Lambda_{1,2}^i) P(m_{1,2}^i, \Lambda_{1,2}^i | \text{eos}, \text{pop}) P(\text{pop}) d\text{pop}}{\zeta(\text{pop})} dm_{1,2}^i d\Lambda_{1,2}^i$$

$\zeta(\text{pop})$ 
selection effects



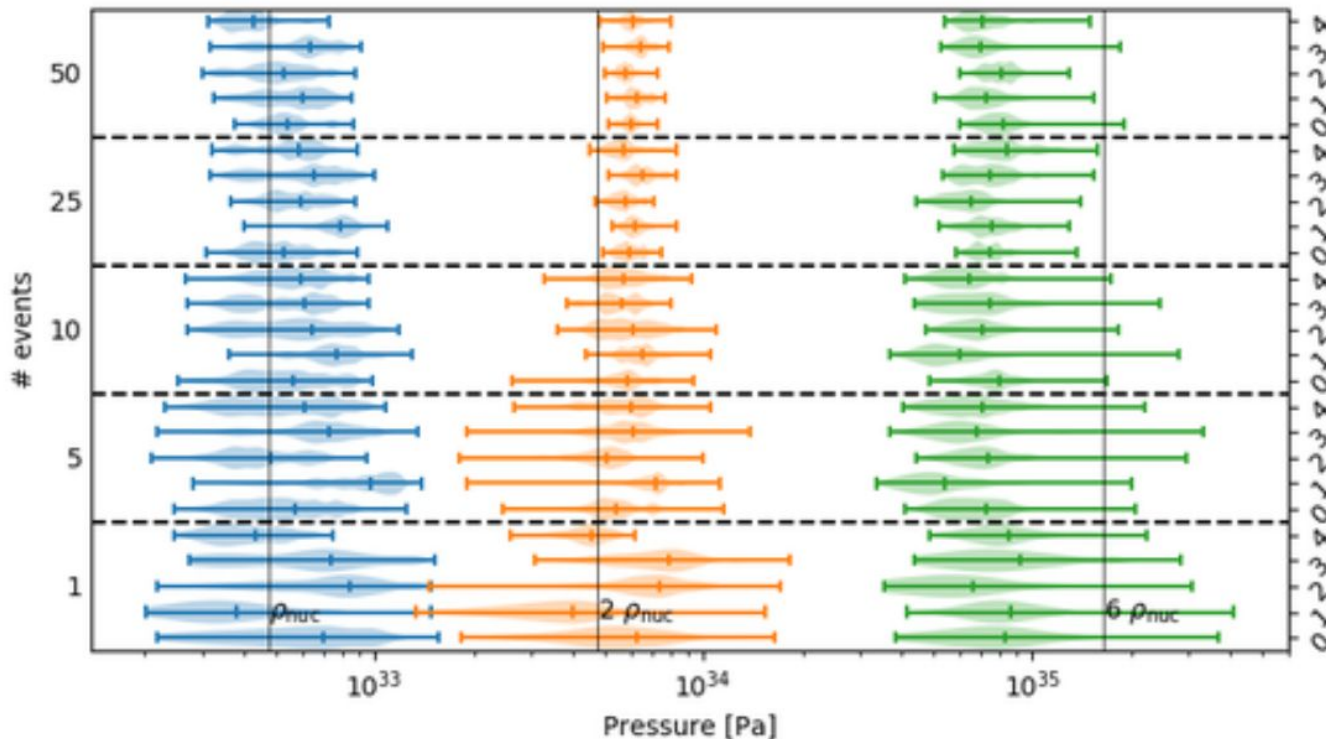
EOS posterior   EOS prior

EOS likelihood

# Simultaneous population & EOS inference

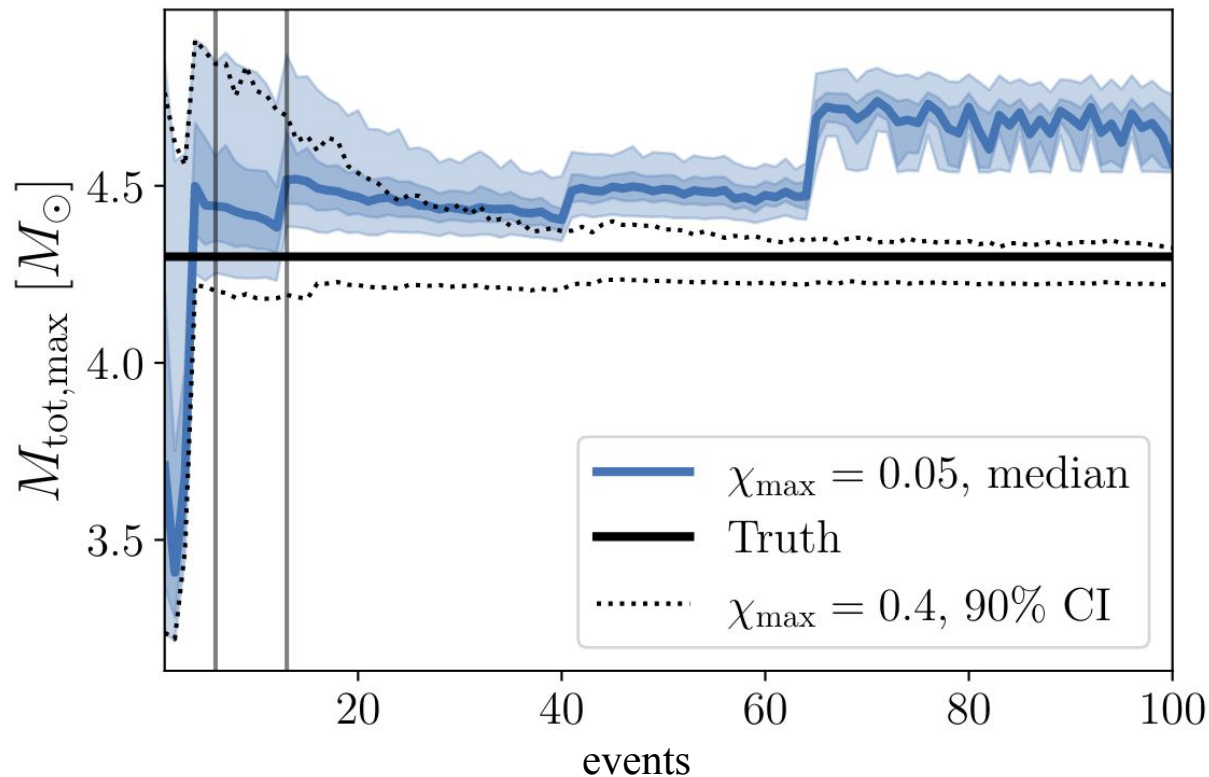
Wysocki+ arXiv:2001.01747

imposing the  
wrong population  
-level mass prior  
can bias the  
inferred EOS after  
 $O(10)$  BNS  
observations



# Simultaneous population & EOS inference

Biscoveanu+Talbot+Vitale MNRAS 2022



**incorrectly assuming  
NSs spin slowly can bias  
the inferred maximum  
mass in the population  
after O(10) BNS  
observations**



# summary and outlook

## Existing observations of neutron stars suggest that...

- NSs are small-ish ( $R \approx 12$  km): nuclear interactions not so repulsive
- despite near-constant  $R(M)$ , cores may harbour exotic matter: hints from  $c_s$ ?

## With next-gen observatories like Cosmic Explorer, we can expect...

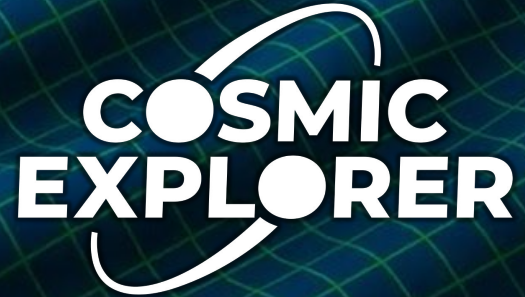
- $O(100)$  BNSs per yr with  $SNR > 100$  for precise tidal measurements

## R&D for next-gen dense matter science is underway

- nonparametric EOS inference is well suited for the opportunities and challenges of population-scale, high-precision BNS observations

# join the Cosmic Explorer Consortium!

[cosmicexplorer.org](https://cosmicexplorer.org)



# Thanks!

*P.L. is supported by the Natural Sciences & Engineering Research Council of Canada (NSERC).*

*Many collaborators inside and outside the LIGO-Virgo-KAGRA collaboration and the Cosmic Explorer project are acknowledged, especially Reed Essick (CITA), Katerina Chatziioannou and Isaac Legred (Caltech).*



# twin stars in CE+ET

strong phase transitions can give rise to hadronic and hybrid twins with the same mass but different  $R$  and  $\Lambda$

