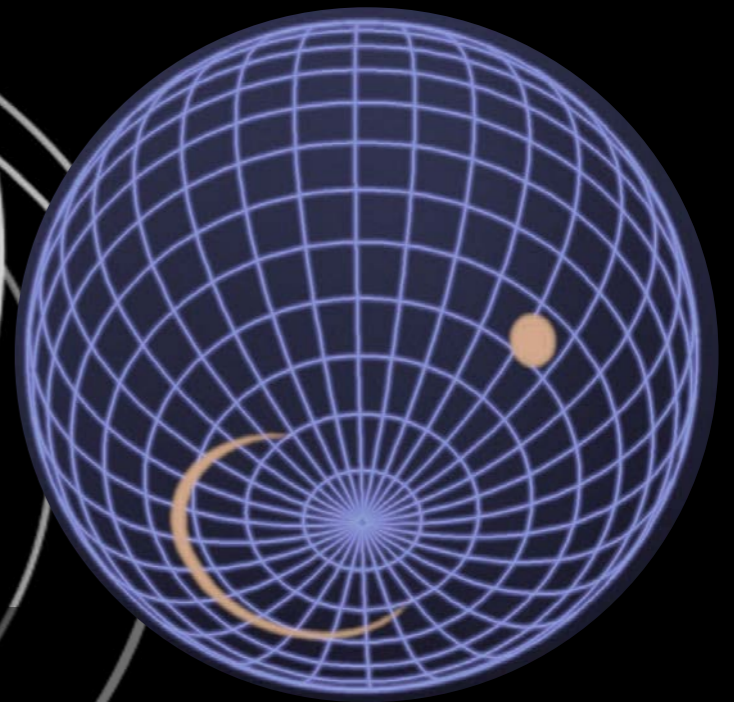
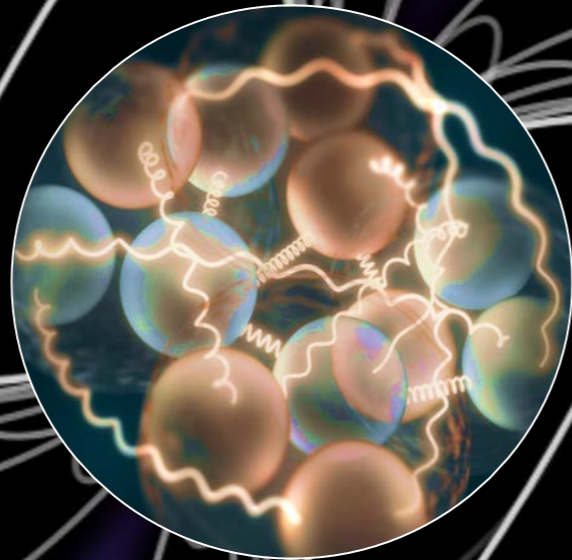


NICER AND ITS VIEW OF NEUTRON STARS



PROF. ANNA WATTS
UNIVERSITY OF AMSTERDAM

FROM NUCLEAR PHYSICS TO TELESCOPE

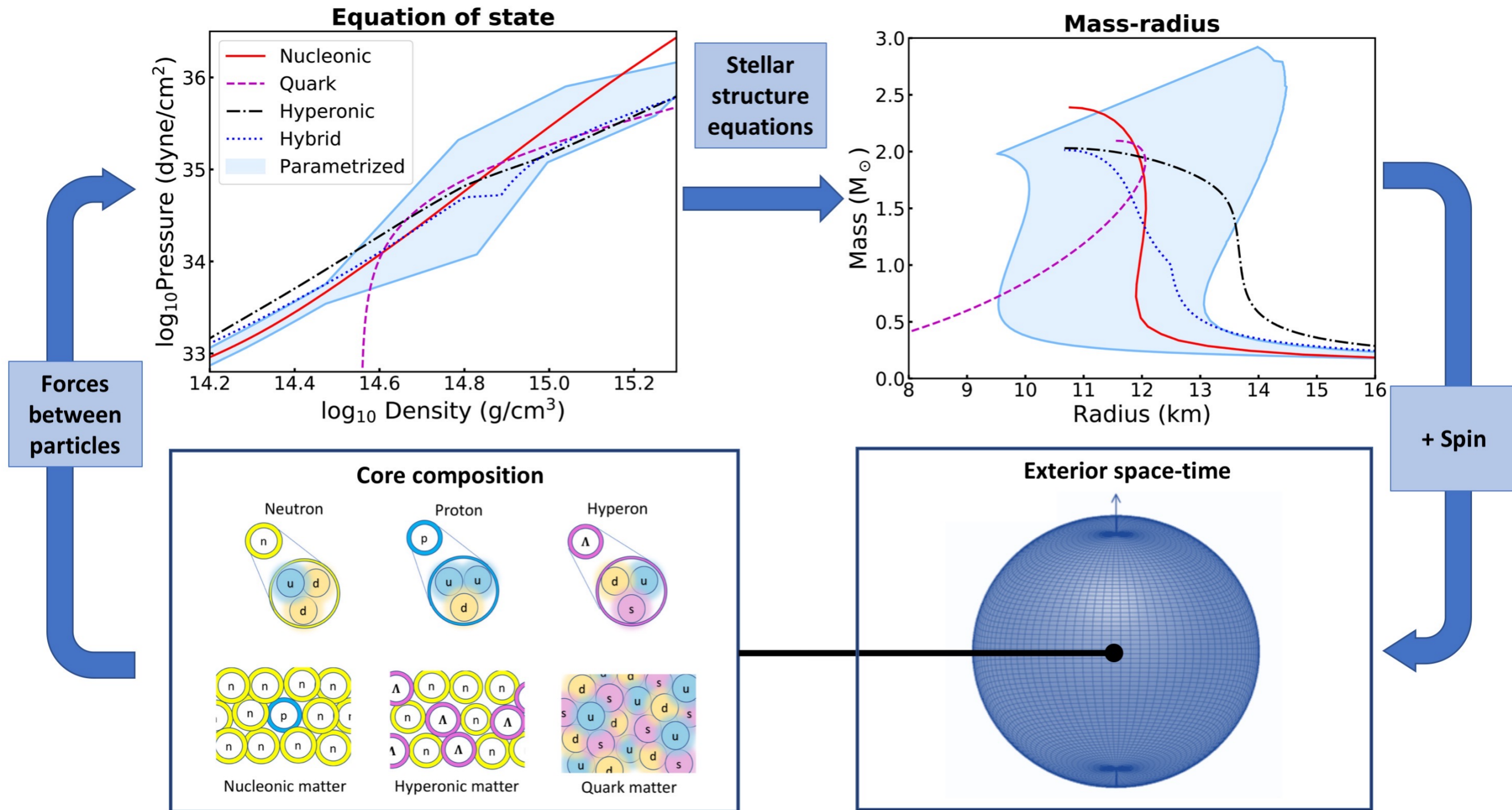
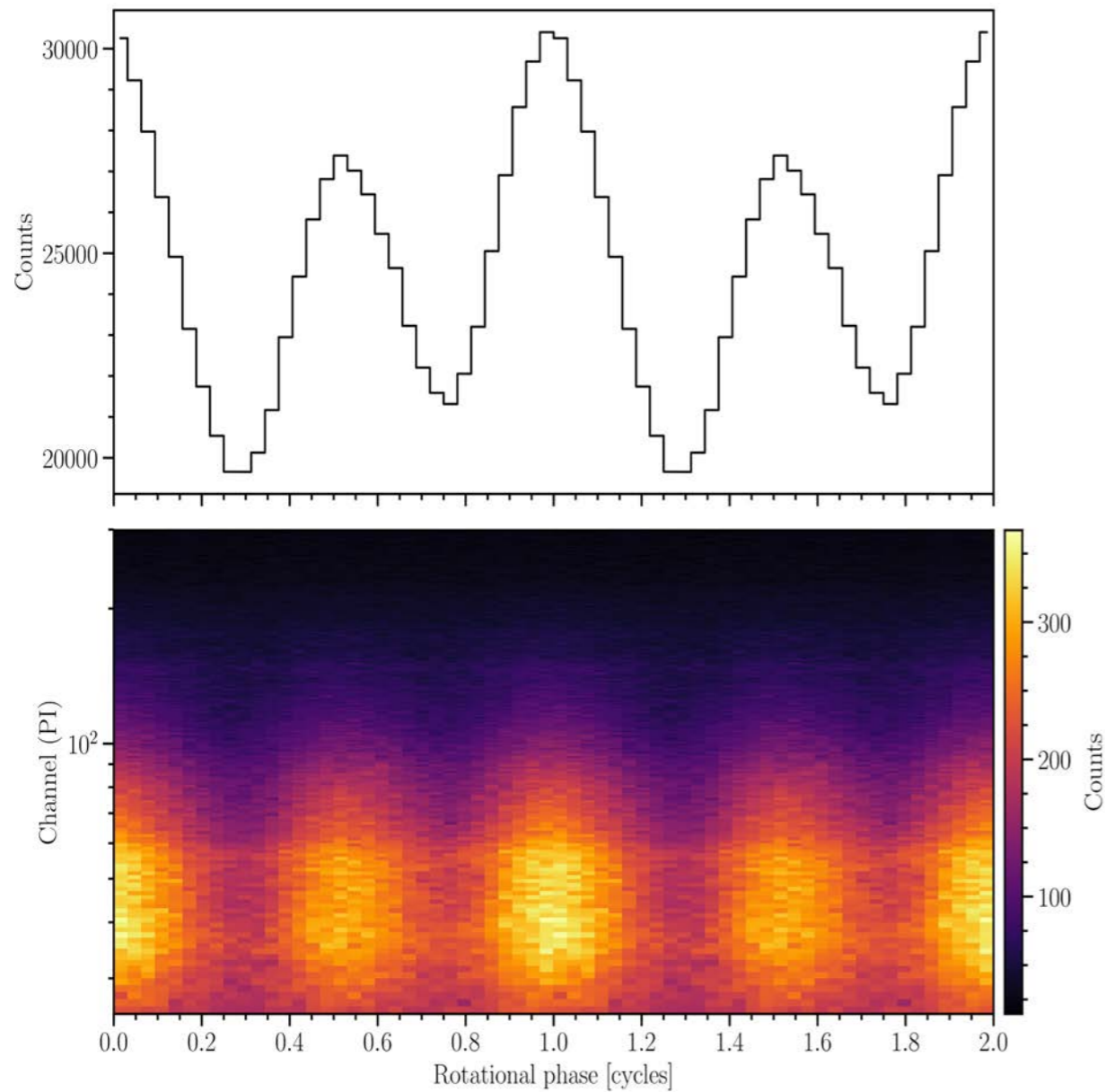


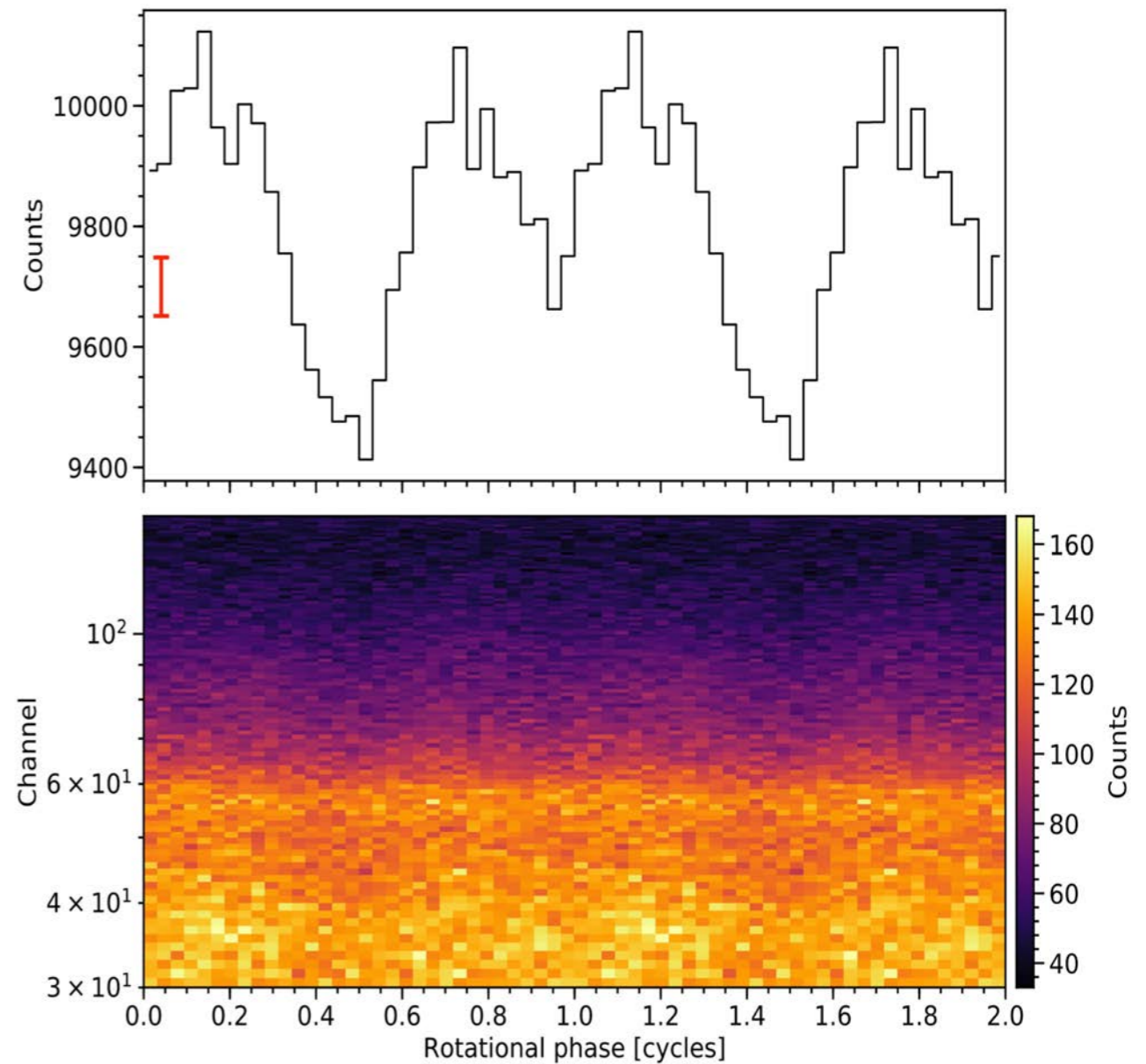
Figure: Adapted from Ray et al. 2019

NICER PULSE PROFILE DATA

ROTATION-POWERED MILLISECOND PULSARS

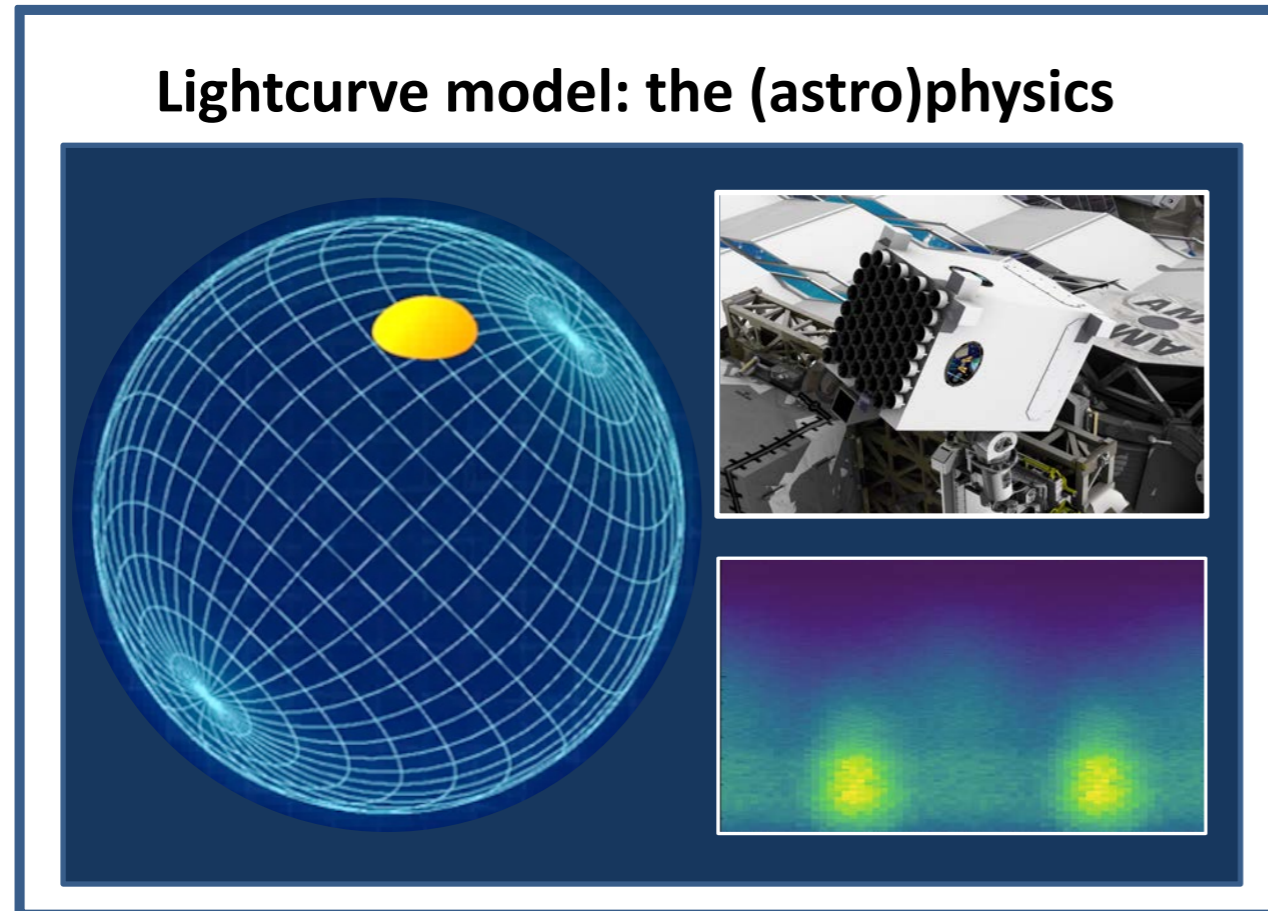
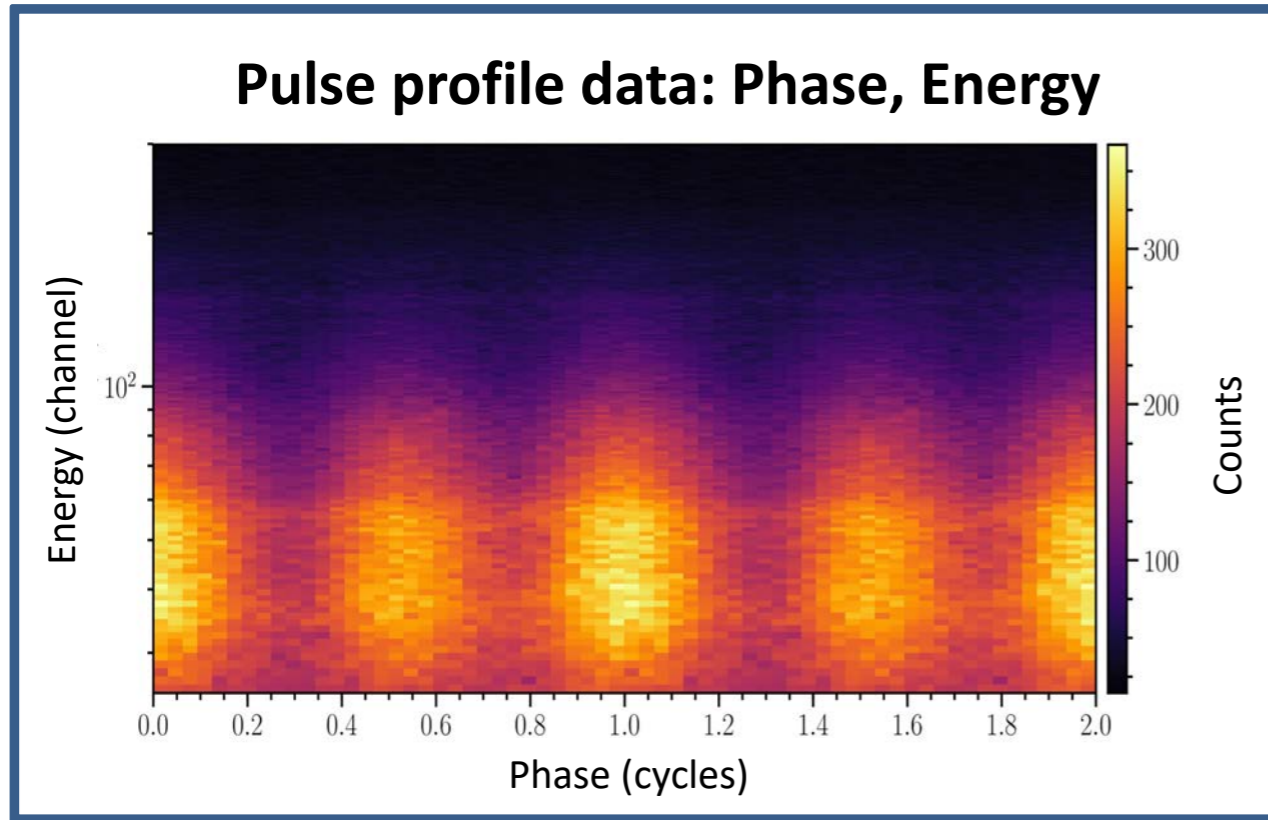


PSR J0030+0451
(Bogdanov et al. 2019)



PSR J0740+6620
(Wolff et al. 2021)

OUR PULSE PROFILE MODELING PROCESS



**Bayesian inference of
model parameters
(statistical sampling)**

**Model parameters:
Mass and radius
Geometric properties**

X-RAY PULSE SIMULATION AND INFERENCE (X-PSI) PACKAGE

🏠 / X-ray Pulse Simulation and Inference (X-PSI) [View page source](#)

X-ray Pulse Simulation and Inference (X-PSI)

An open-source package for neutron star X-ray Pulse Simulation and Inference.

Warning
You are looking at the Python3 version of the documentation. The Python2 version of X-PSI (v1.2.1 and below) is now deprecated, please migrate your code to Python3 and X-PSI v2.0 or higher. The Python2 documentation for X-PSI is still available at [this link](#).

X-PSI is designed to simulate rotationally-modified (pulsed) surface X-ray emission from neutron stars, taking into account relativistic effects on the emitted radiation. This can then be used to perform Bayesian statistical inference on real or simulated astronomical data sets. Model parameters of interest may include neutron star mass and radius (useful to constrain the properties of ultradense nuclear matter) or the system geometry and properties of the hot emitting surface-regions. To achieve this, X-PSI couples code for likelihood functionality (simulation) with existing open-source software for posterior sampling (inference).

X-PSI has been used most prominently (to date) in modelling pulsar data from NASA's [Neutron Star Interior Composition Explorer \(NICER\)](#), for details see [Applications](#).

JOSS
The Journal of Open Source Software

X-PSI: A Python package for neutron star X-ray pulse simulation and inference

Thomas E. Riley¹, Devarshi Choudhury¹, Tuomo Salmi¹, Serena Vinciguerra¹, Yves Kini¹, Bas Dorsman¹, Anna L. Watts¹, Daniela Huppenkothen², and Sebastien Guillot³

¹ Anton Pannekoek Institute for Astronomy, University of Amsterdam, Science Park 904, 1090GE Amsterdam, The Netherlands ² SRON Netherlands Institute for Space Research, Niels Bohrweg 4, NL-2333 CA Leiden, the Netherlands ³ Institut de Recherche en Astrophysique et Planétologie, UPS-OMP, CNRS, CNES, 9 avenue du Colonel Roche, BP 44346, F-31028 Toulouse Cedex 4, France

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Software

- Review
- Repository
- Archive

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Summary

The X-ray Pulse Simulation and Inference (X-PSI) package is a software package designed to simulate rotationally-modulated surface X-ray emission from neutron stars and to perform Bayesian statistical inference on real or simulated pulse profile data sets. Model parameters of interest include neutron star mass and radius and the system geometry and properties of the hot emitting surface regions.

Statement of need

Pulsed X-ray signals from neutron stars can be modeled to statistically estimate parameters such as stellar mass and radius, and properties of the surface radiation field such as a map of temperature. The mass and radius of a neutron star are a function of the equation of state of internal matter, especially the dense matter in the core, and the formation history of the star, which determines the central energy density and the spin frequency. The state of the surface radiation field is the product of a potentially long and complex stellar evolutionary history, especially that of the stellar magnetosphere. Such parameter estimation requires relativistic tracing of radiation as it propagates from surface to a distant telescope. Pulse-profile modelling to infer neutron star parameters is a major science goal for both current X-ray telescopes such as the Neutron Star Interior Composition Explorer (NICER, [Gendreau et al., 2016](#)) and proposed future telescopes such as eXTP and STROBE-X ([Ray et al., 2019](#); [Watts et al., 2019](#)).

While there are some open-source libraries for simulating the X-ray signals from rapidly spinning neutron stars and more generally from the vicinity of general relativistic compact objects including black holes ([Nättilä & Pihajoki, 2018](#); [Pihajoki et al., 2018](#)) the scope of these projects does not include statistical modeling, which necessitates tractable parametrised models and a modular framework for constructing those models. X-PSI addresses this need, coupling code for likelihood functionality (simulation) with existing open-source software for posterior sampling (inference).

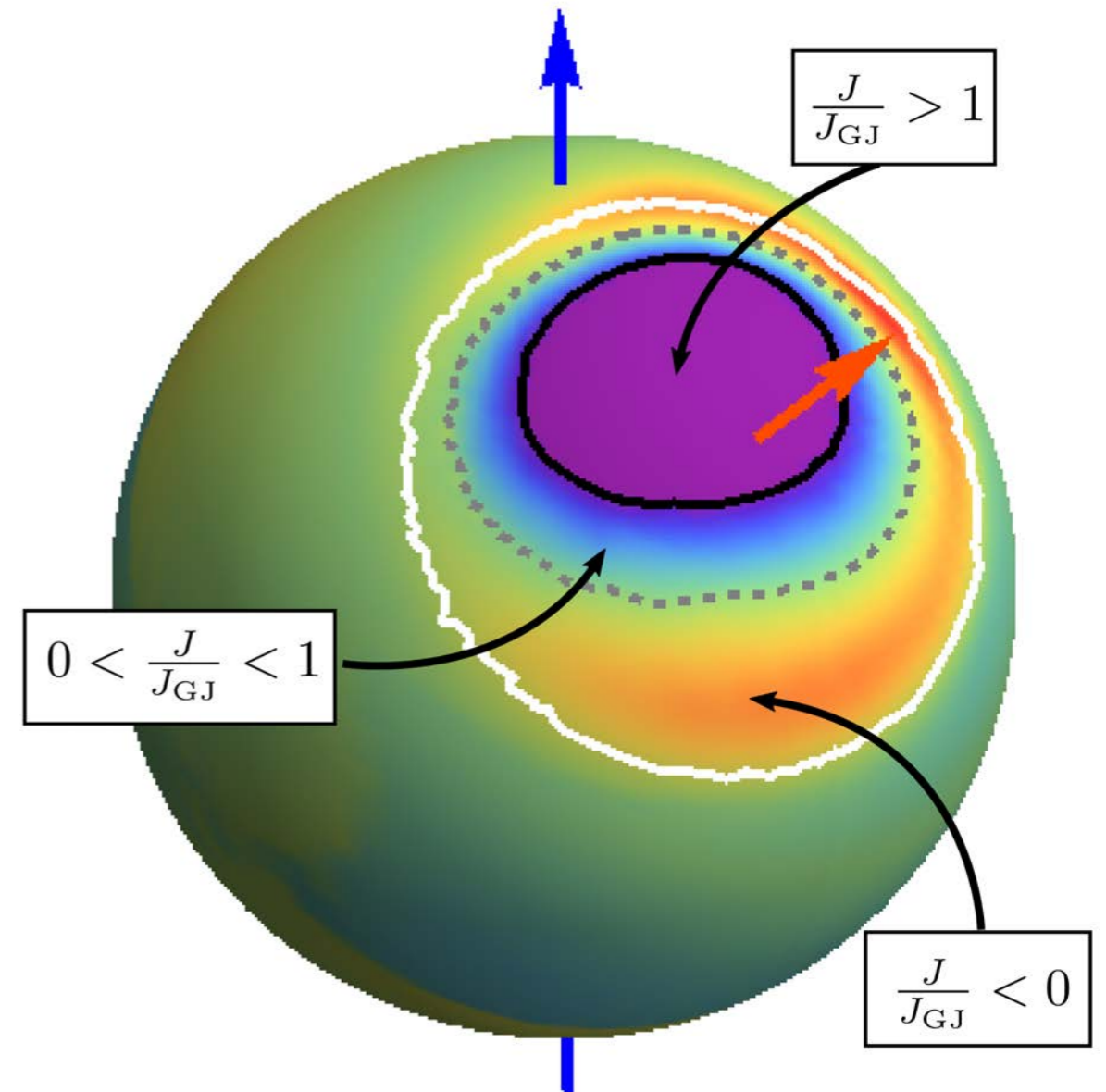
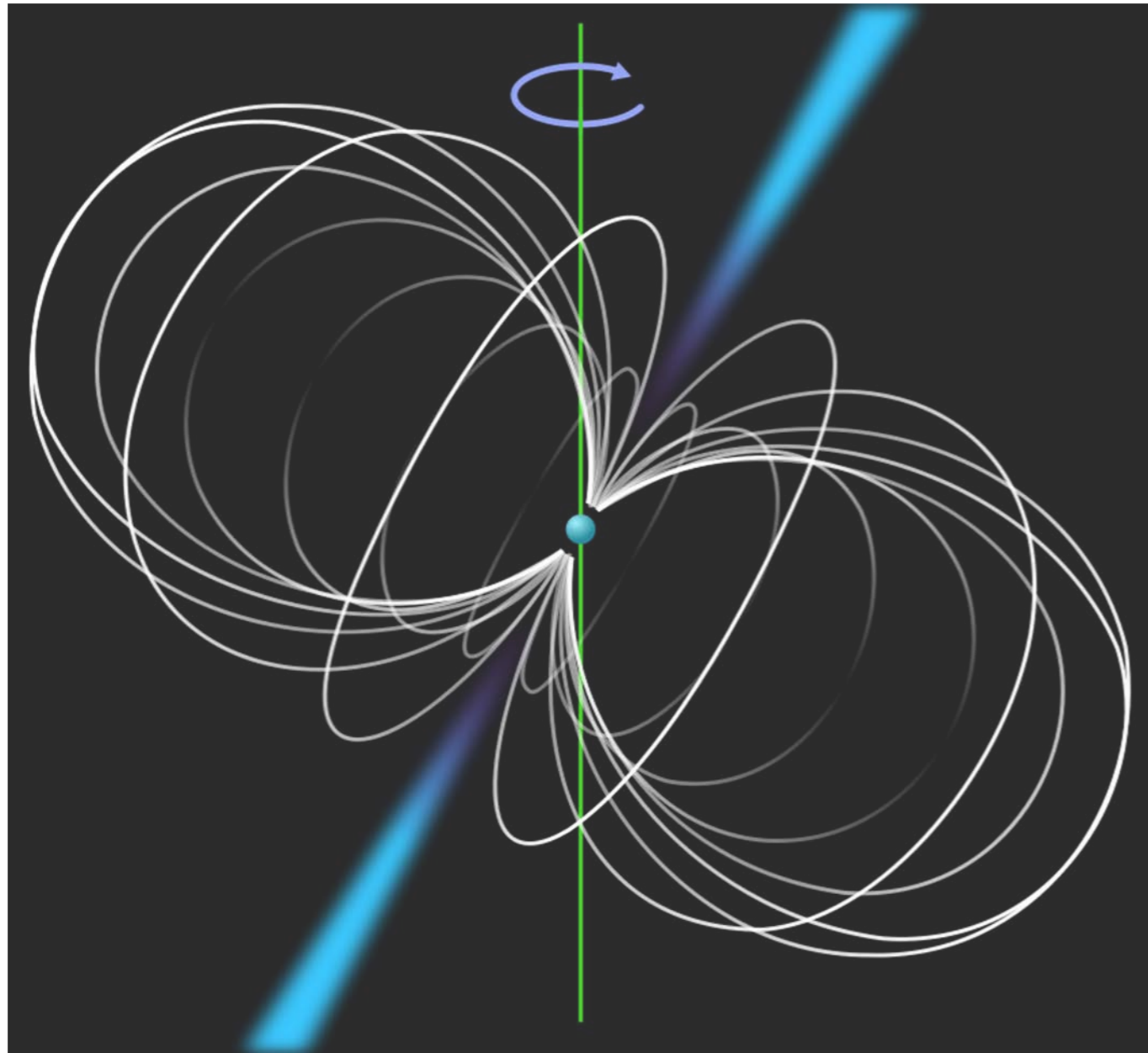
The X-PSI package and science use

X-PSI is an open-source Python package for Bayesian modeling of time- and energy-resolved X-ray emission. X-PSI is designed to simulate rotationally-modulated surface X-ray emission from neutron stars and to perform Bayesian statistical inference on real or simulated pulse profile data sets. Model parameters of interest include neutron star mass and radius and the system geometry and properties of the hot emitting surface regions.

X-PSI software (used for our NICER analysis) available via Github – finally available for Python 3 as well.
<https://github.com/xpsi-group/xpsi>

Full reproduction packages for all NICER analyses available via Zenodo (scripts to run X-PSI, data and model files, post-processing notebooks, full samples). Links to papers and Zenodos via ‘Applications’ tab on X-PSI pages.

PULSAR SURFACE EMISSION PATTERNS



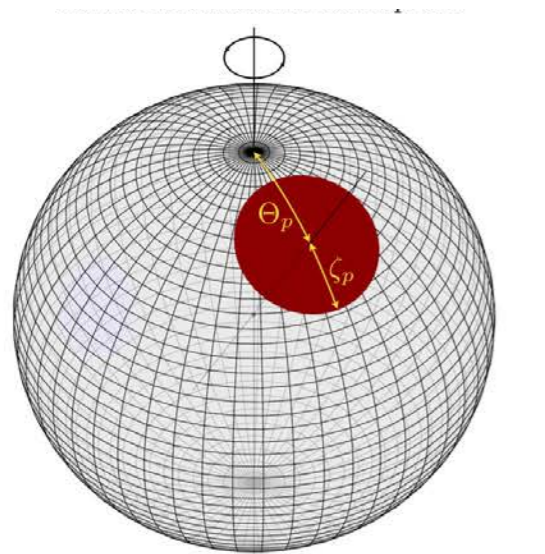
Surface heating pattern due to return currents a priori poorly constrained.

(Figure courtesy of Kostas Kalapotharakos, see also Harding & Muslimov 2011)

POLAR CAP MODELS

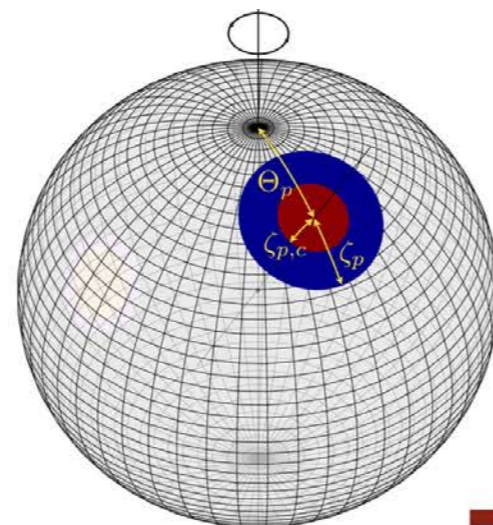
- We use 2-cap models of increasing surface pattern complexity.

Northern rotational hemisphere



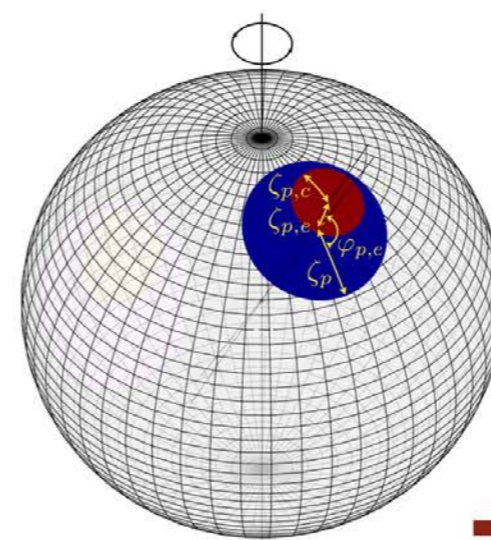
ST-U
(Single-temperature with unshared parameters)

T_p
 T_s



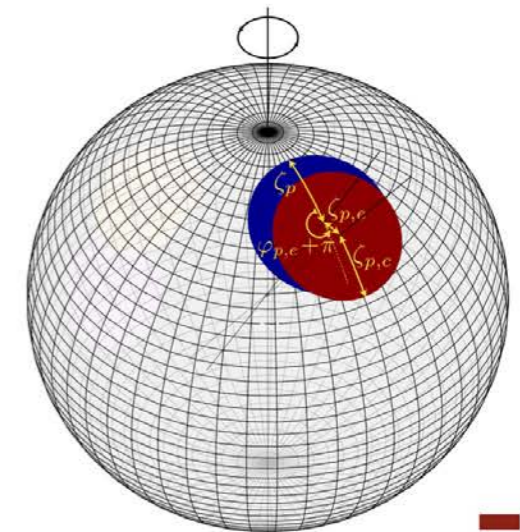
CDT-U
(Concentric dual-temperature with unshared parameters)

$T_{p,c}$
 $T_{p,a}$
 $T_{s,c}$
 $T_{s,a}$



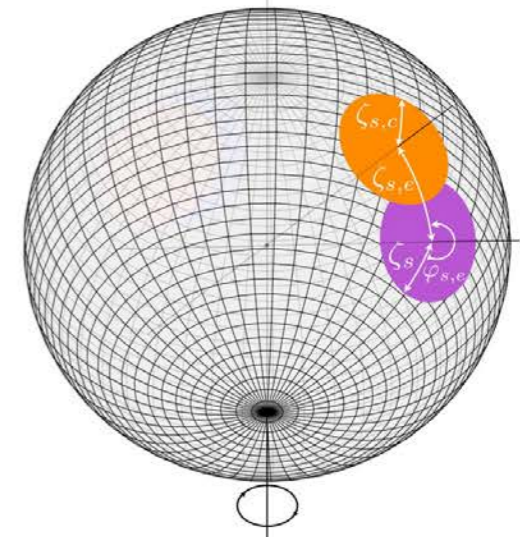
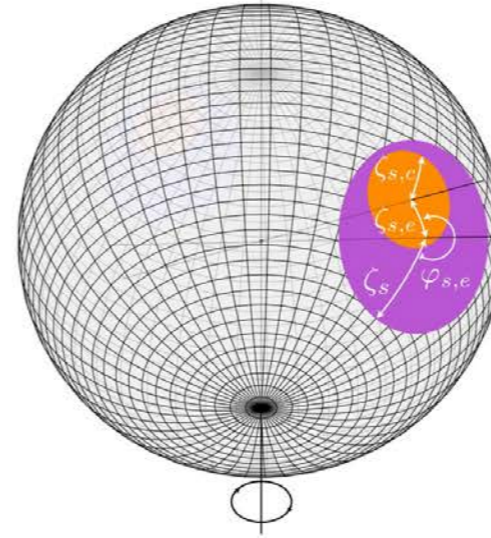
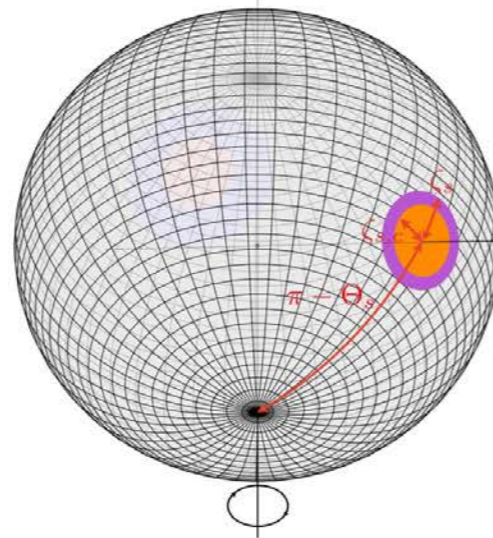
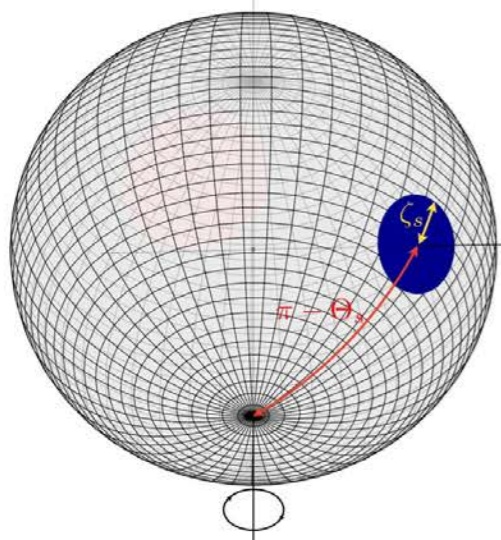
EDT-U
(Eccentric dual-temperature with unshared parameters)

$T_{p,c}$
 $T_{p,a}$
 $T_{s,c}$
 $T_{s,a}$



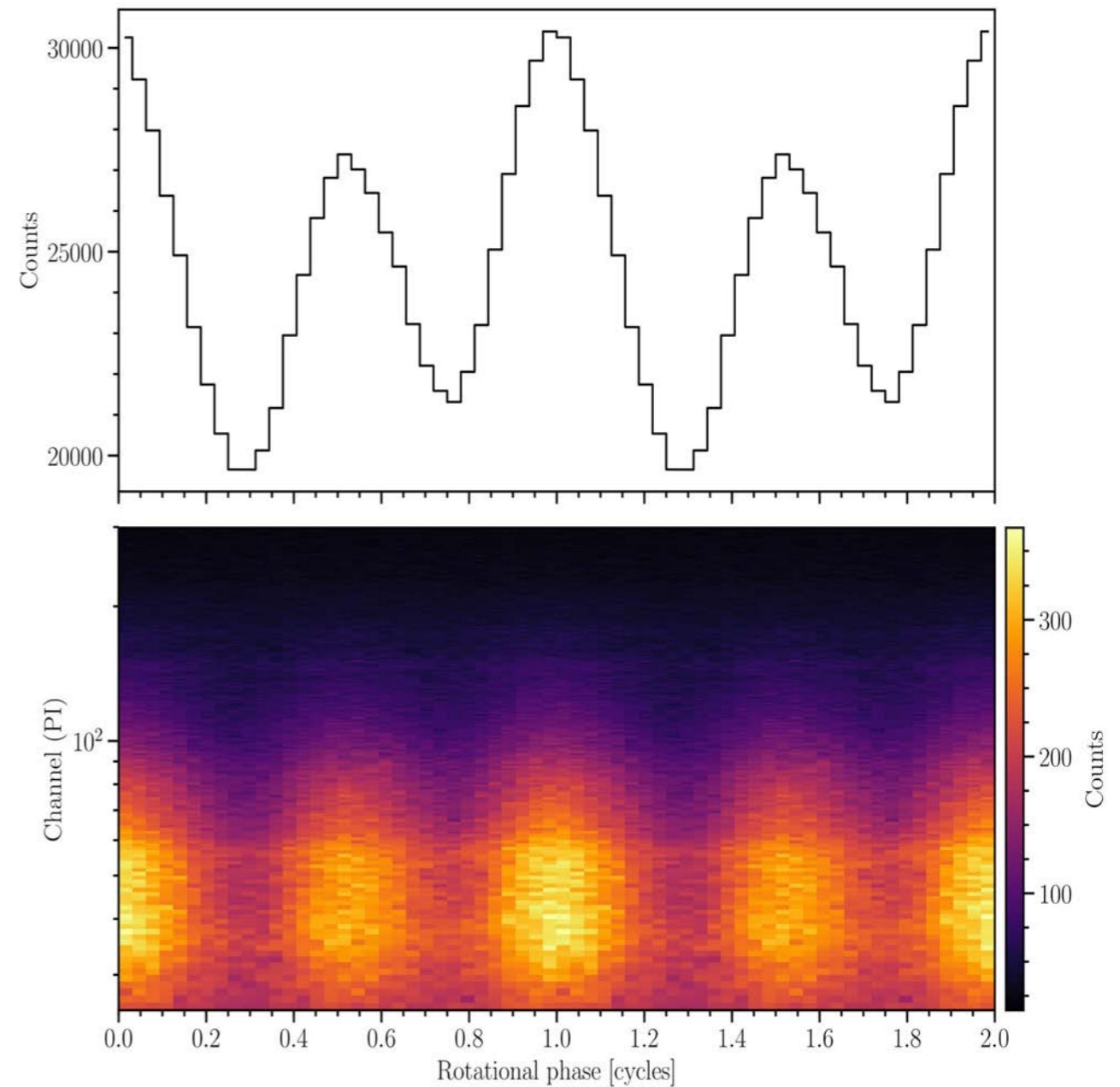
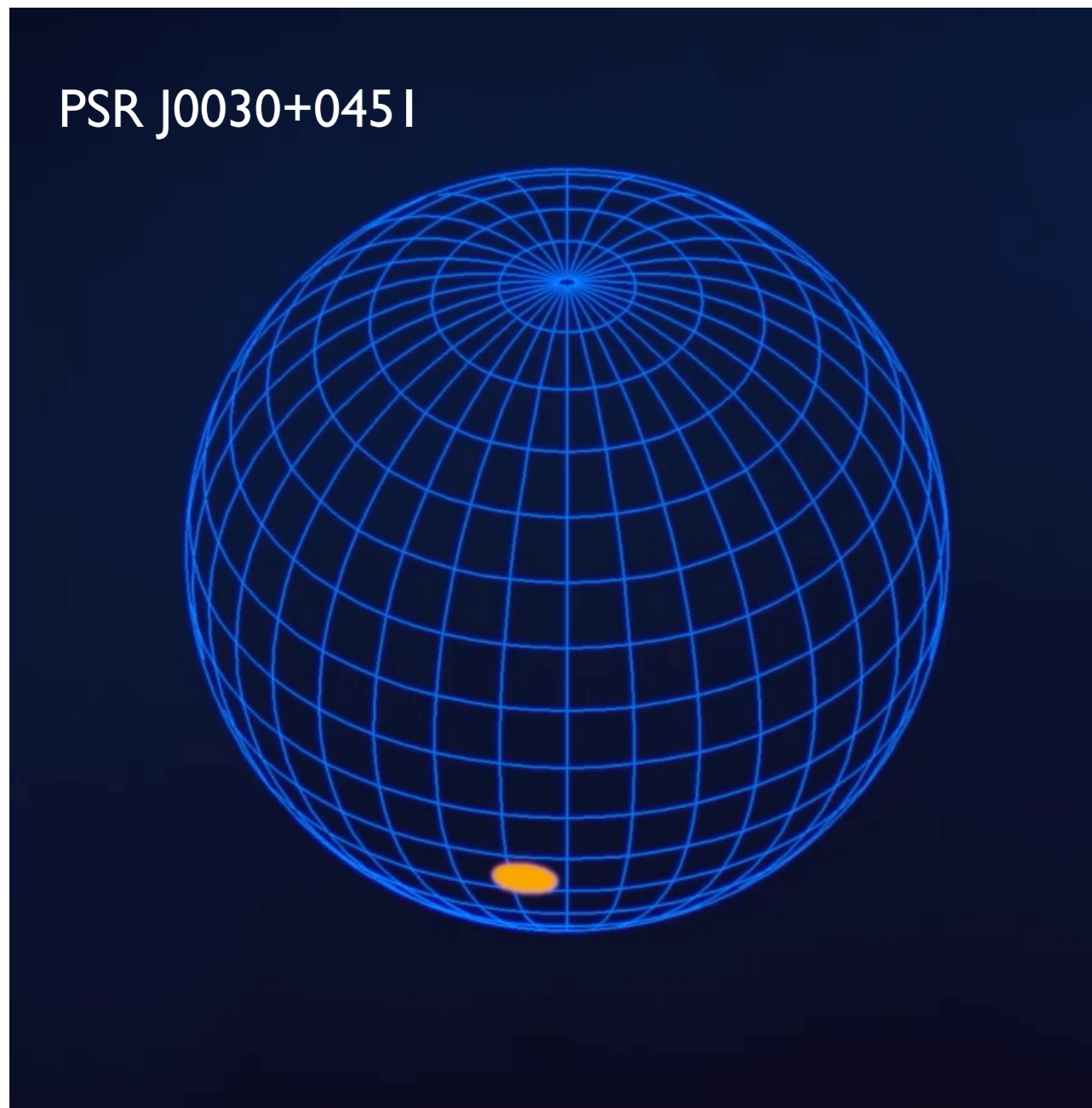
PDT-U
(Protruding dual-temperature with unshared parameters)

$T_{p,c}$
 $T_{p,a}$
 $T_{s,c}$
 $T_{s,a}$



Southern rotational hemisphere

NICER'S FIRST SURFACE MAP



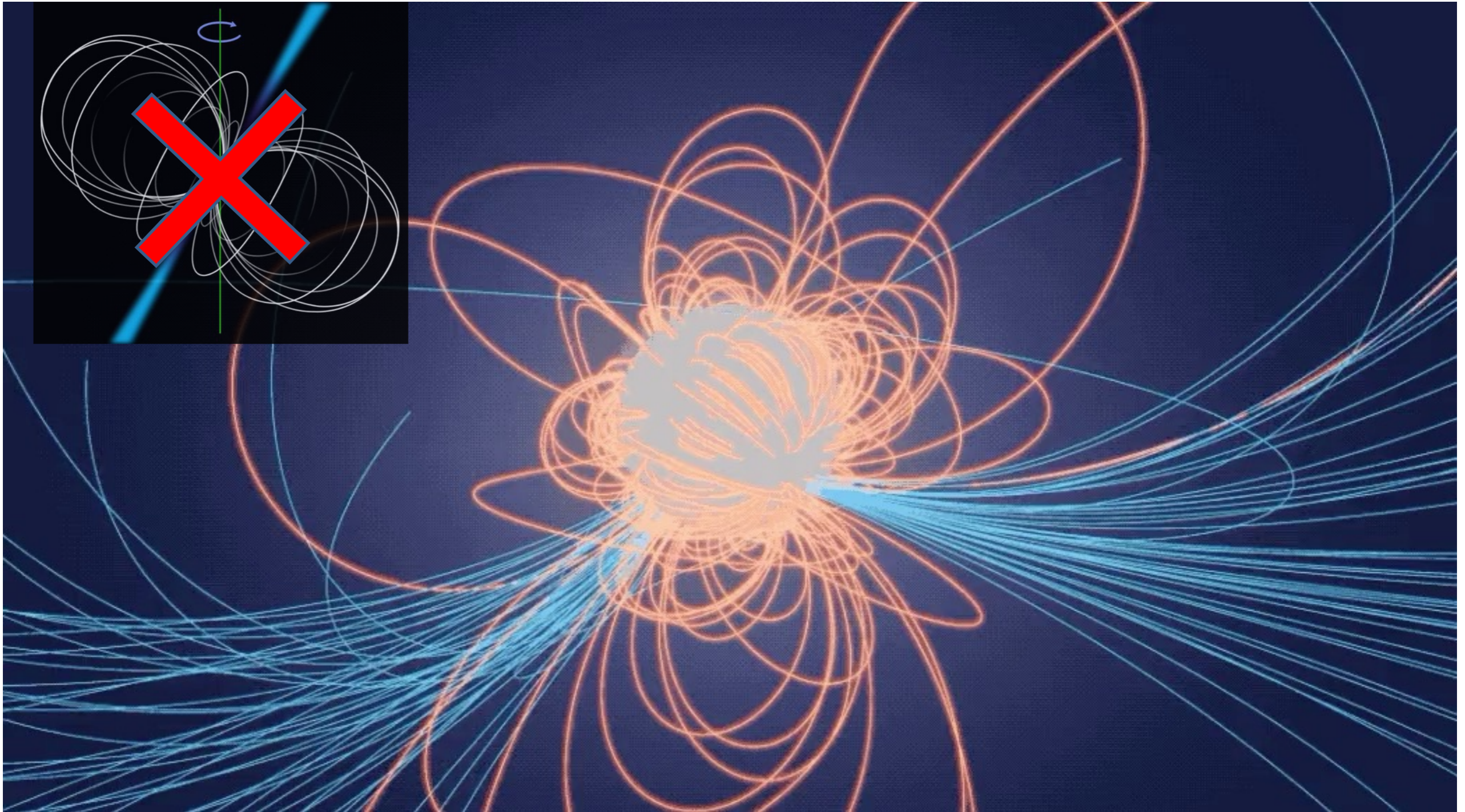
NICER team J0030 papers

Data and supporting analysis (Bogdanov et al. 2019a,b, 2021);

X-PSI analysis group (Riley et al. 2019, Raaijmakers et al. 19, Bilous et al. 2019);

Maryland-Illinois analysis group (Miller et al. 2019).

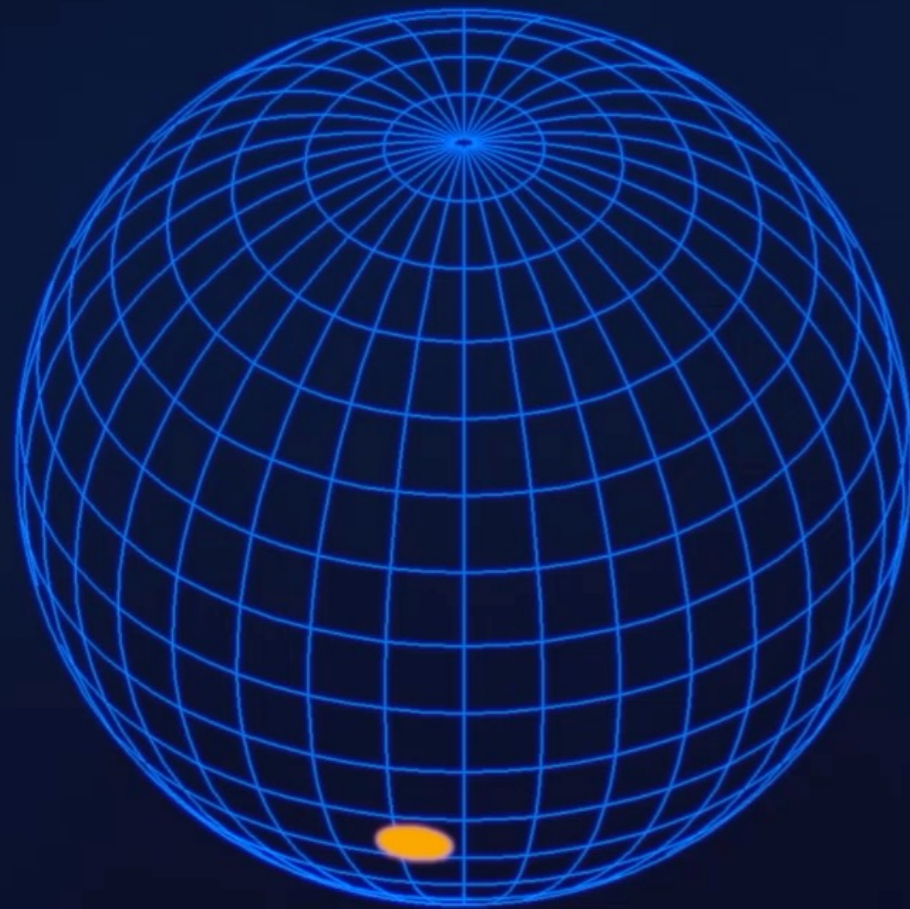
COMPLEX MAGNETIC FIELD



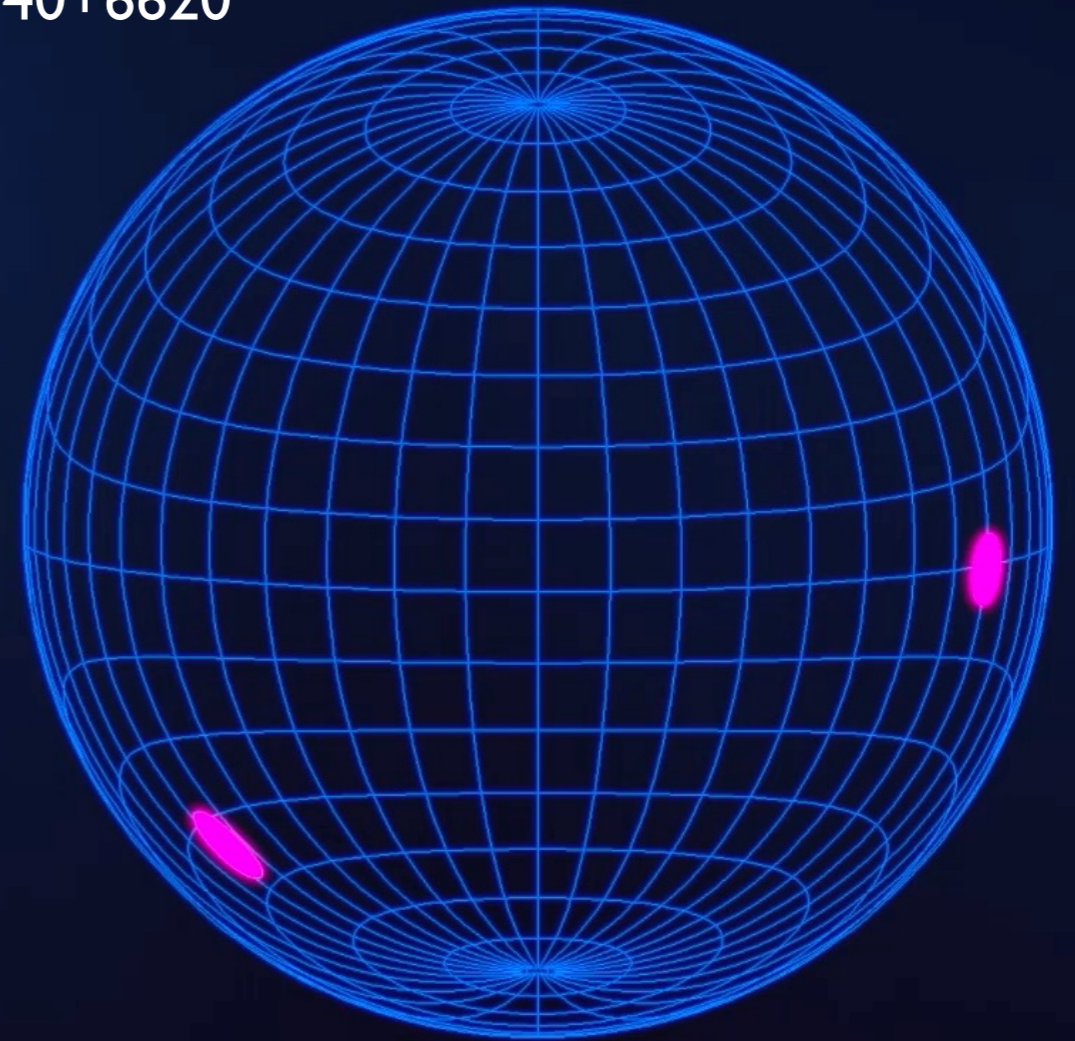
Credit: NASA's Goddard Space Flight Center/Harding, Kalapocharakos, Wadiasingh.

MAPPING THE MOST MASSIVE PULSAR

PSR J0030+0451



PSR J0740+6620

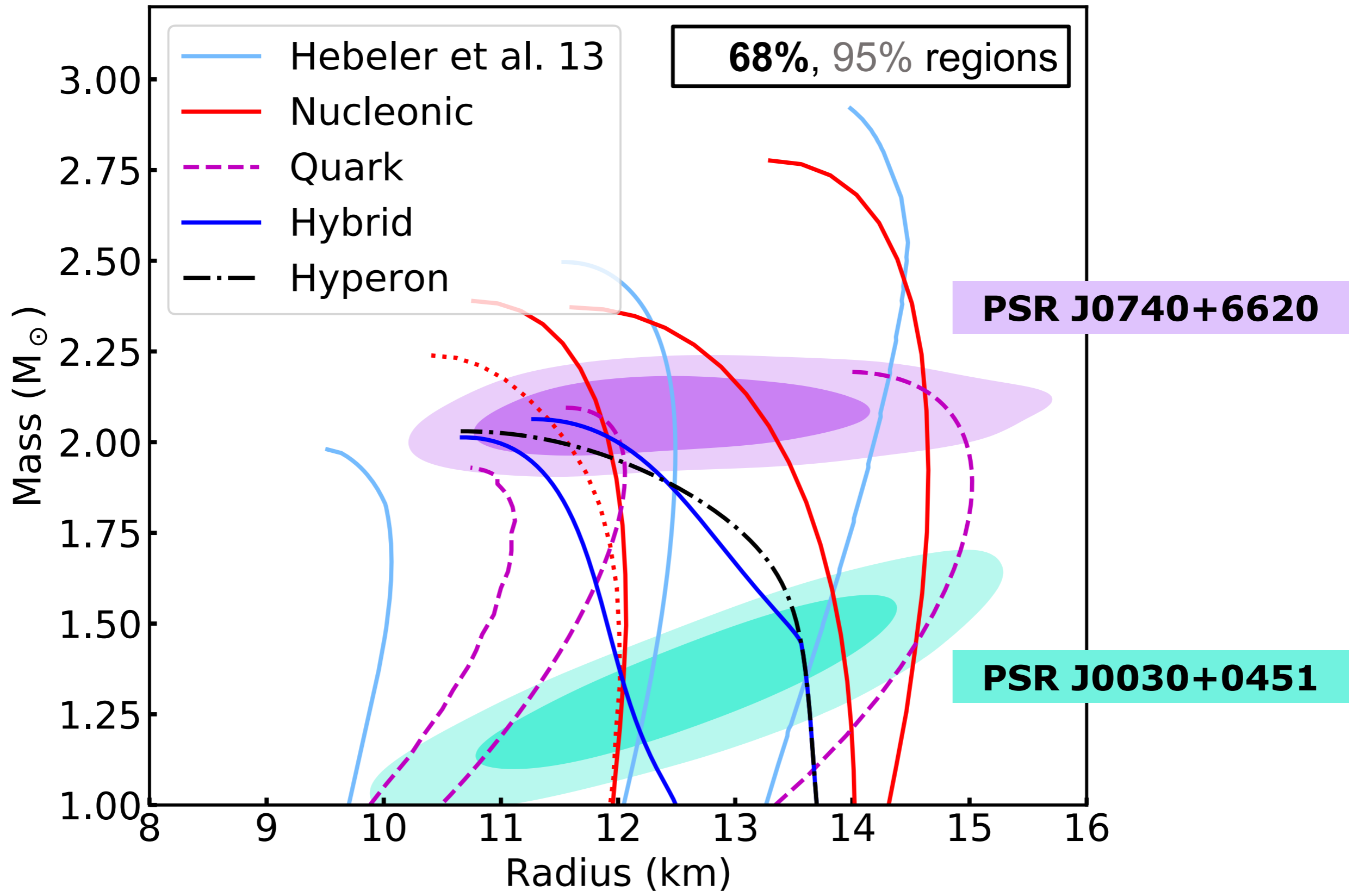


Movie: Sharon Morsink, NASA

NICER team J0740 papers

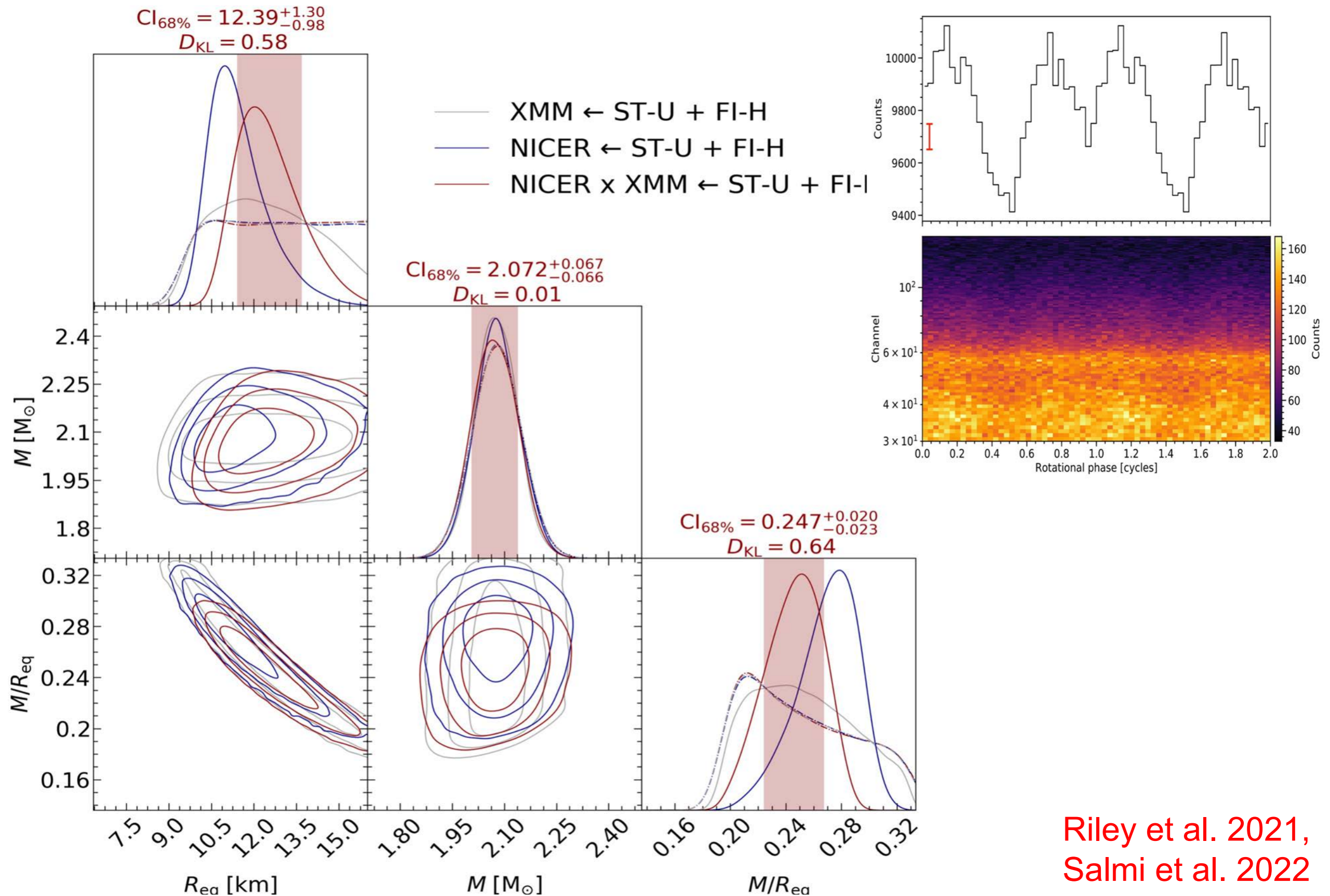
Wolff et al. 2021, [Riley et al. 2021](#), [Raaijmakers et al. 2021](#),
Miller et al. 2021, [Salmi et al. 2022](#)

FROM SURFACE TO SUBSURFACE



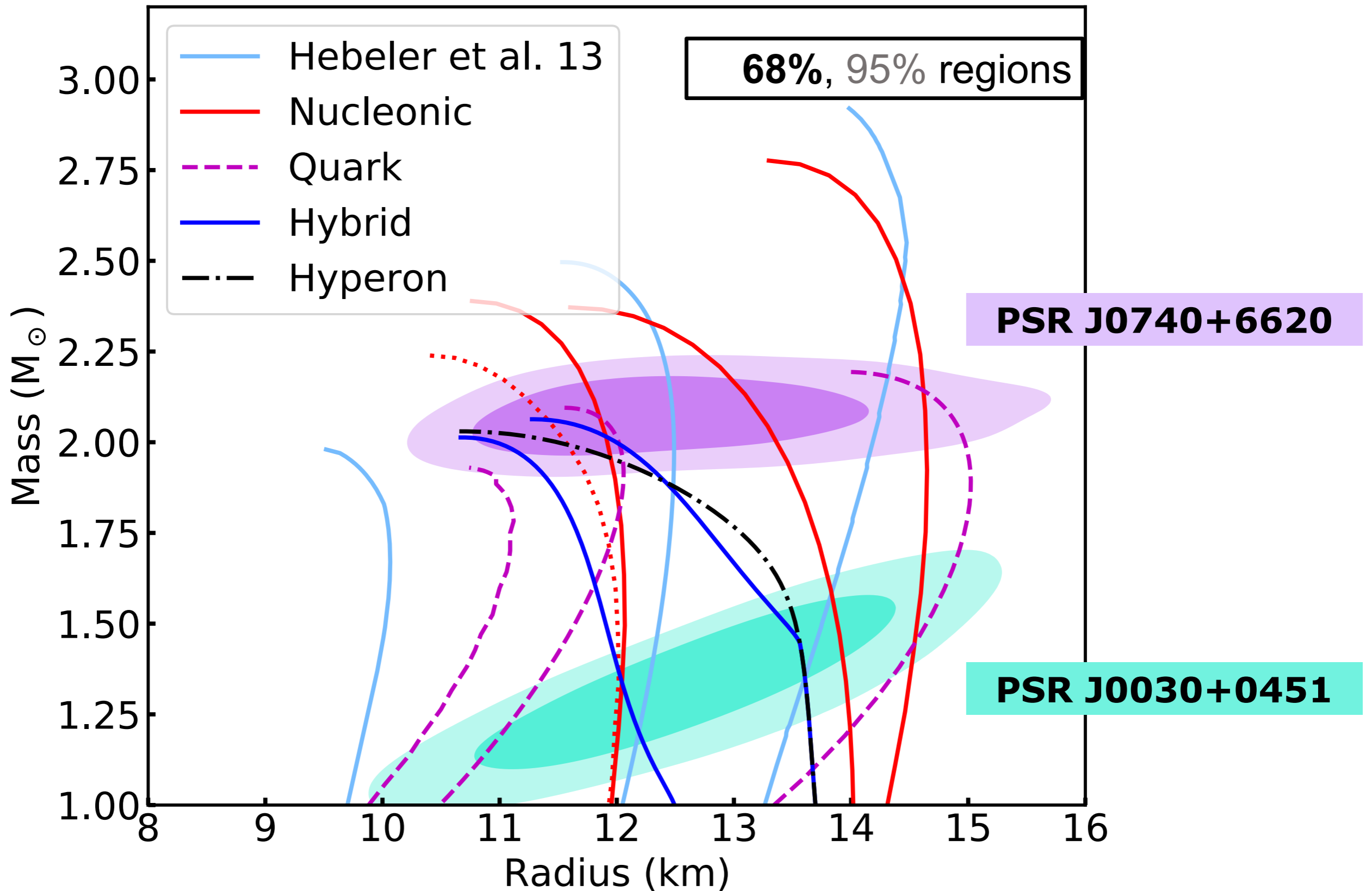
NICER M-R Credible regions from [Riley et al. 2019, 2021](#)

THE IMPORTANCE OF BACKGROUND

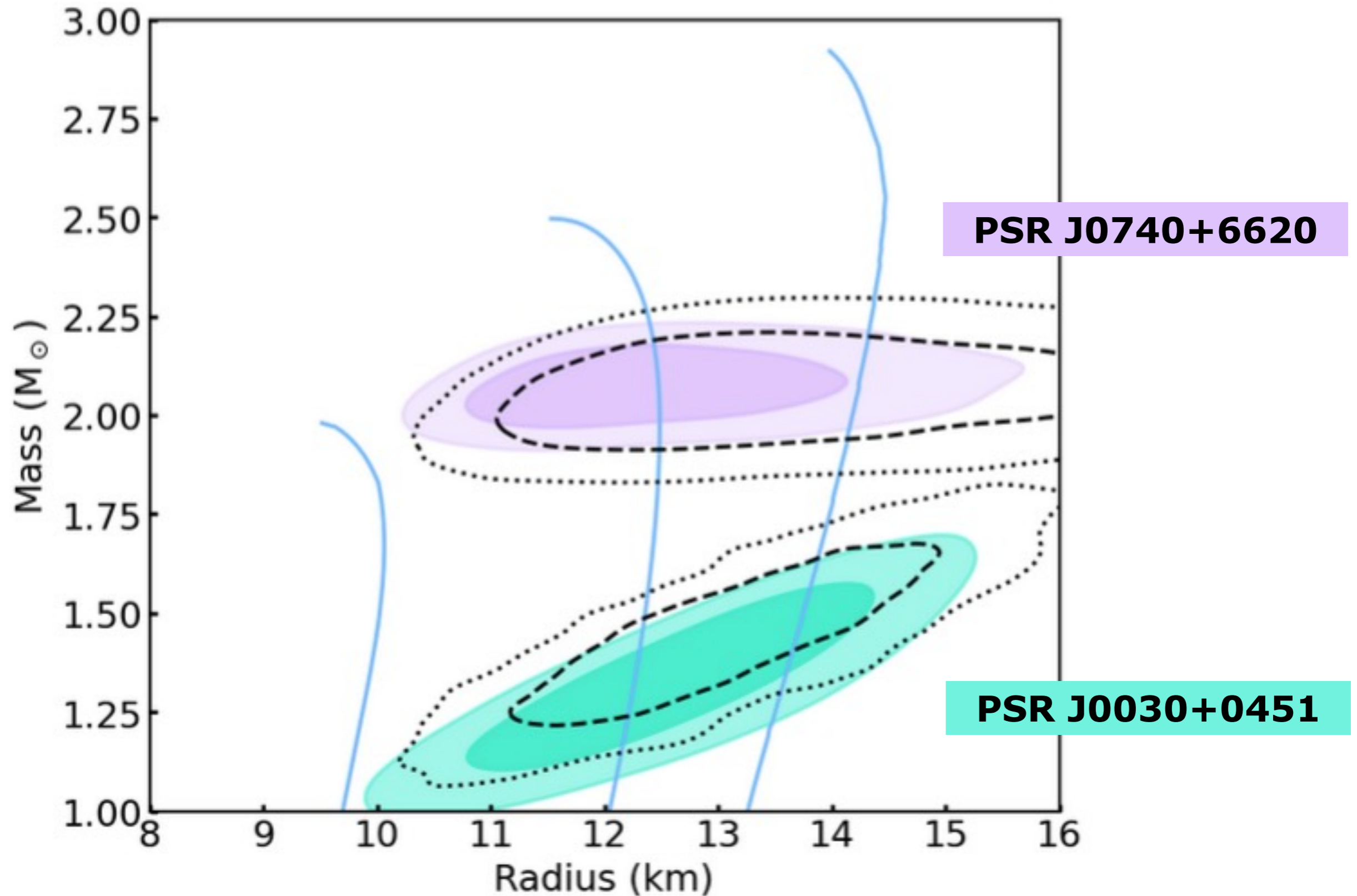


Riley et al. 2021,
Salmi et al. 2022

INFERRED MASS AND RADIUS

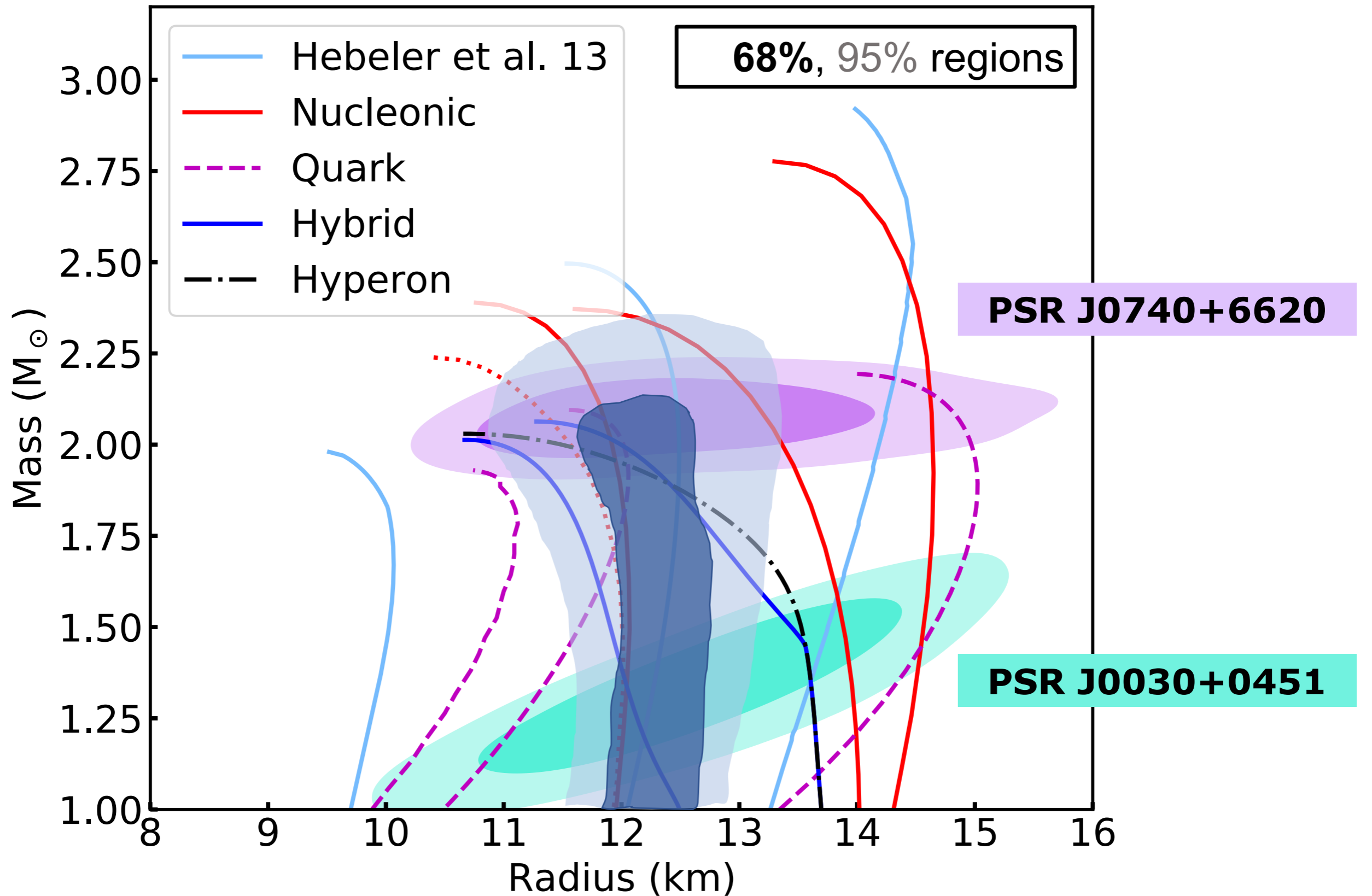


INFERRED MASS AND RADIUS



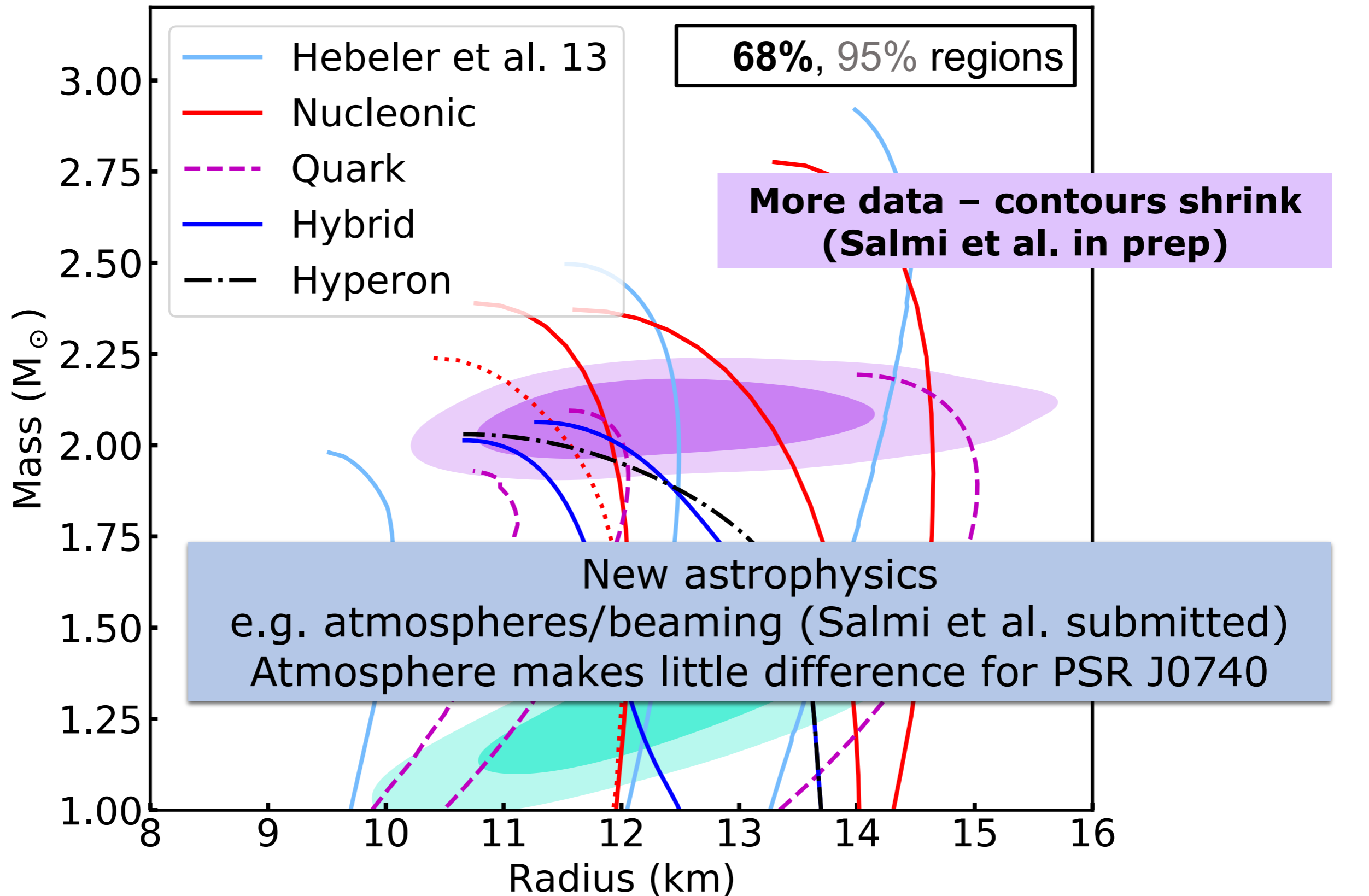
Now comparing Riley et al. 2019, 2021 to Miller et al. 2019, 2021

INFERRED EQUATION OF STATE

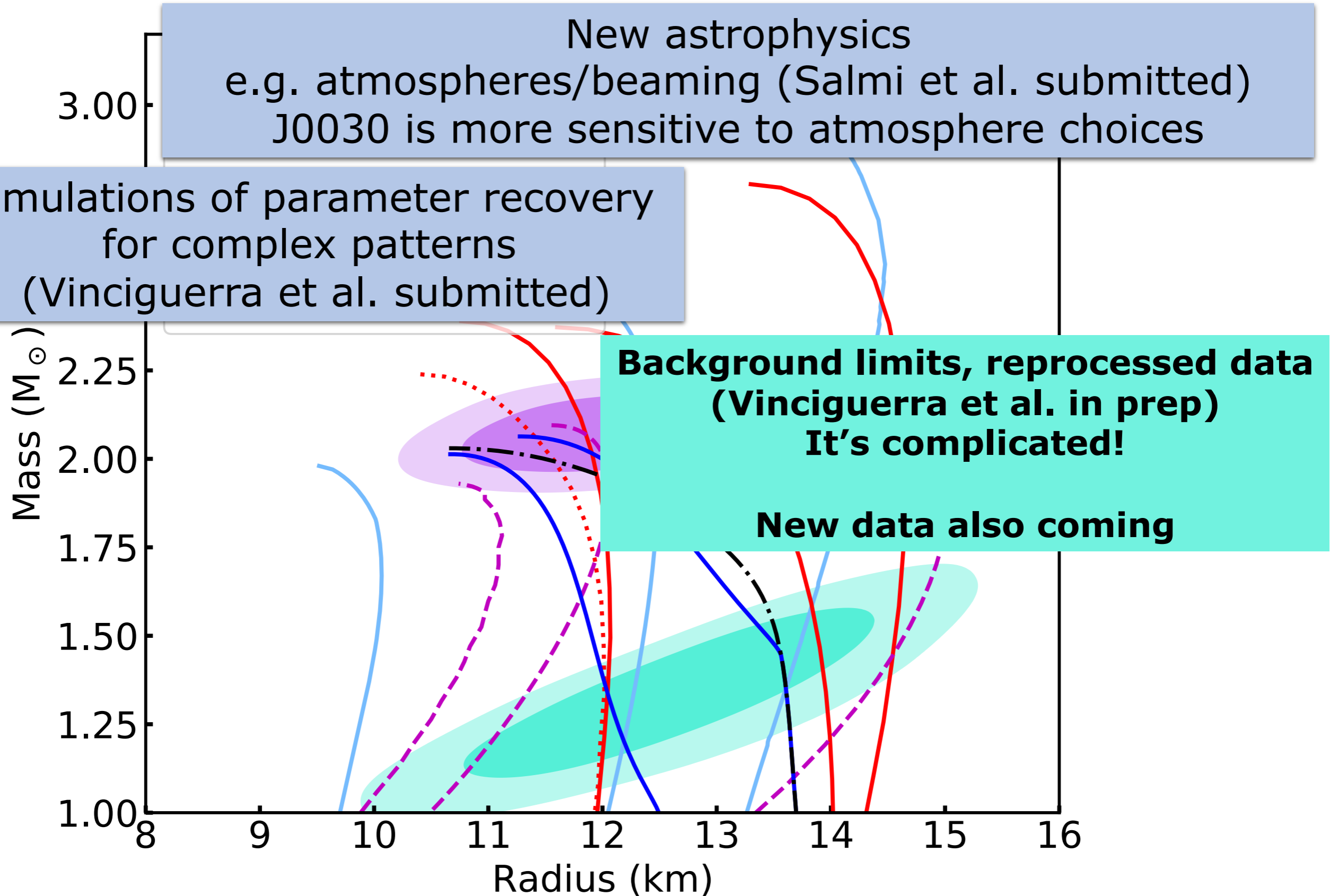


M-R relation (for a specific EOS parameterization) from [Raaijmakers et al. 2021](#)

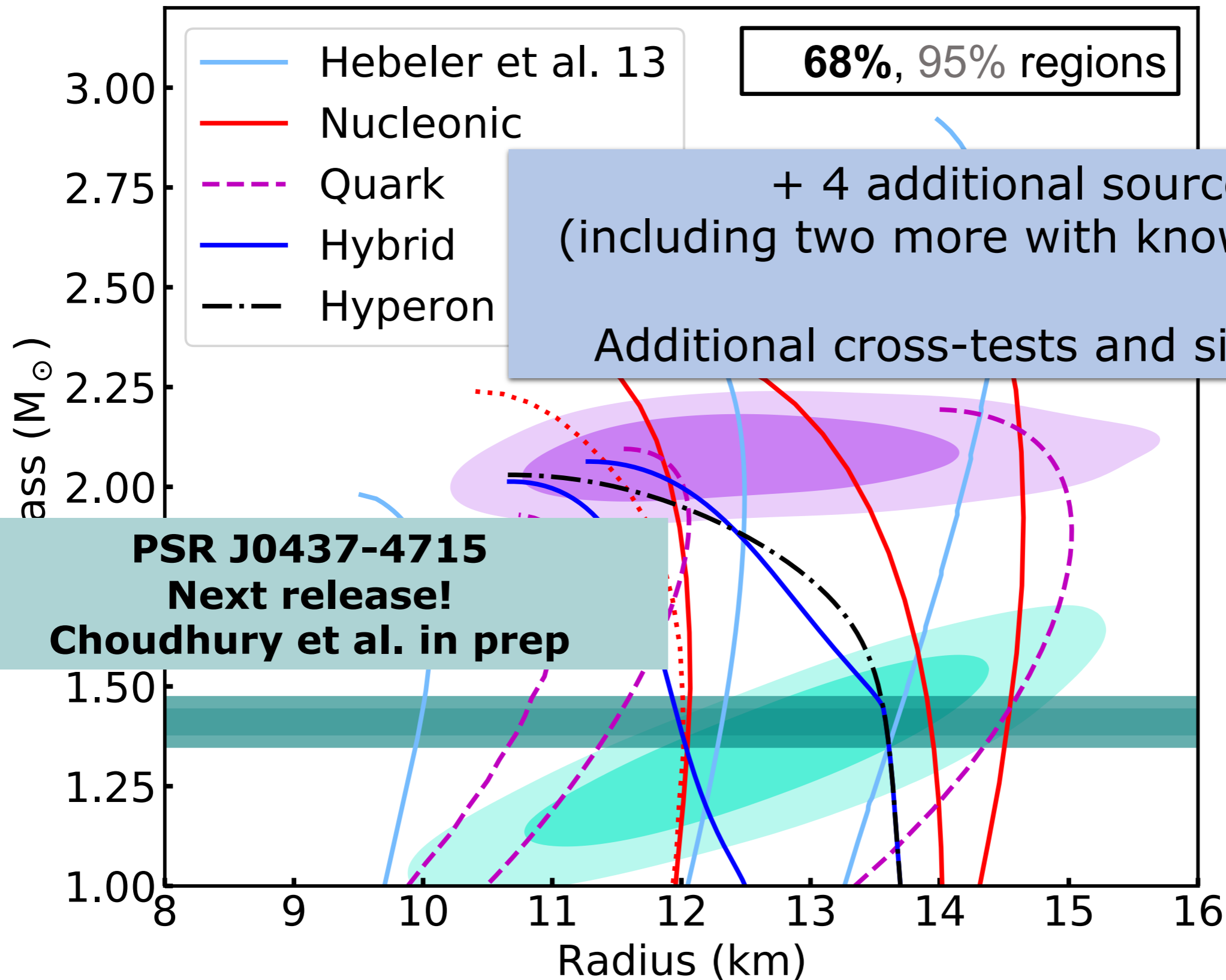
WHAT'S NEXT FOR PSR J0740+6620?



WHAT'S NEXT FOR PSR J0030+0451?



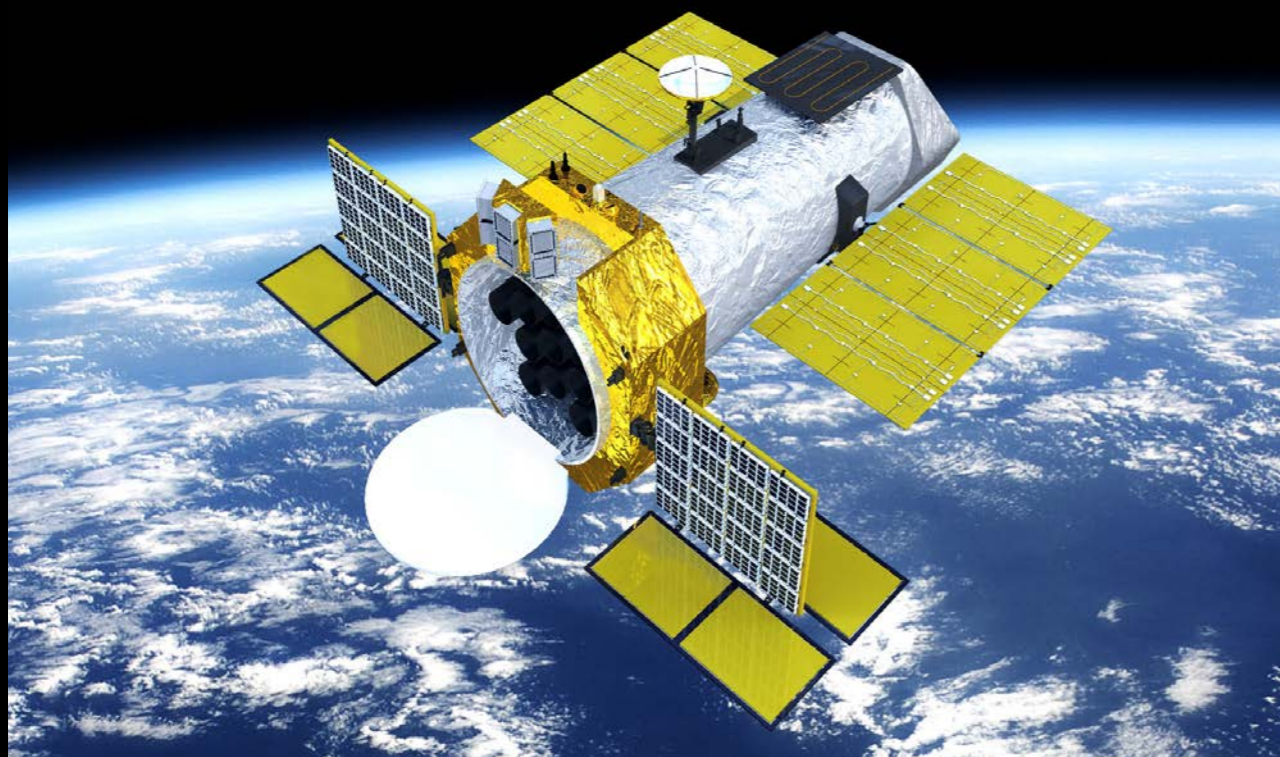
WHAT'S NEXT FOR NICER?



LARGE AREA X-RAY SPECTRAL-TIMING

New telescopes are being proposed –
larger area, wider X-ray band than NICER

eXTP



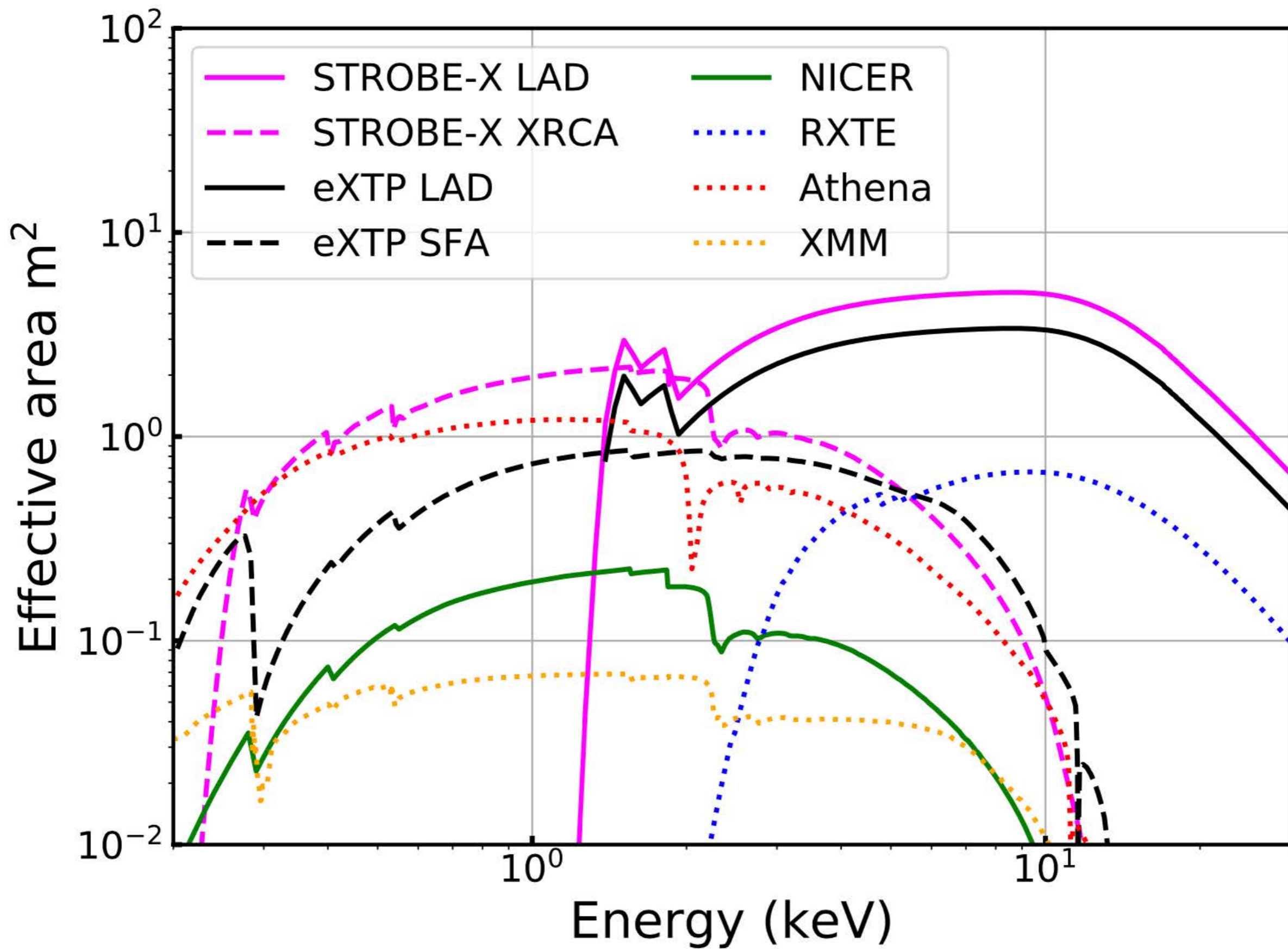
Chinese-European project
Zhang et al. 2019

STROBE-X

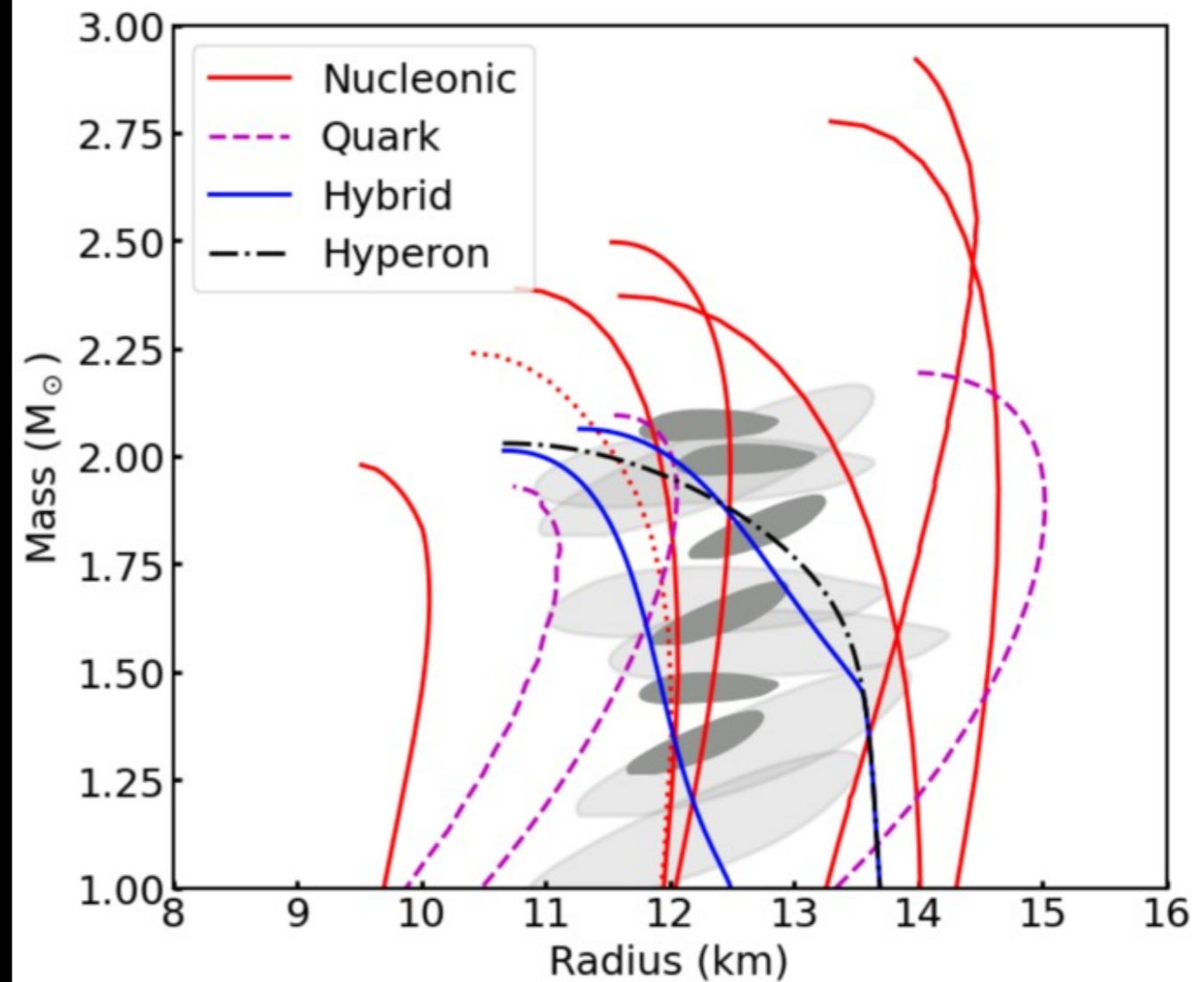
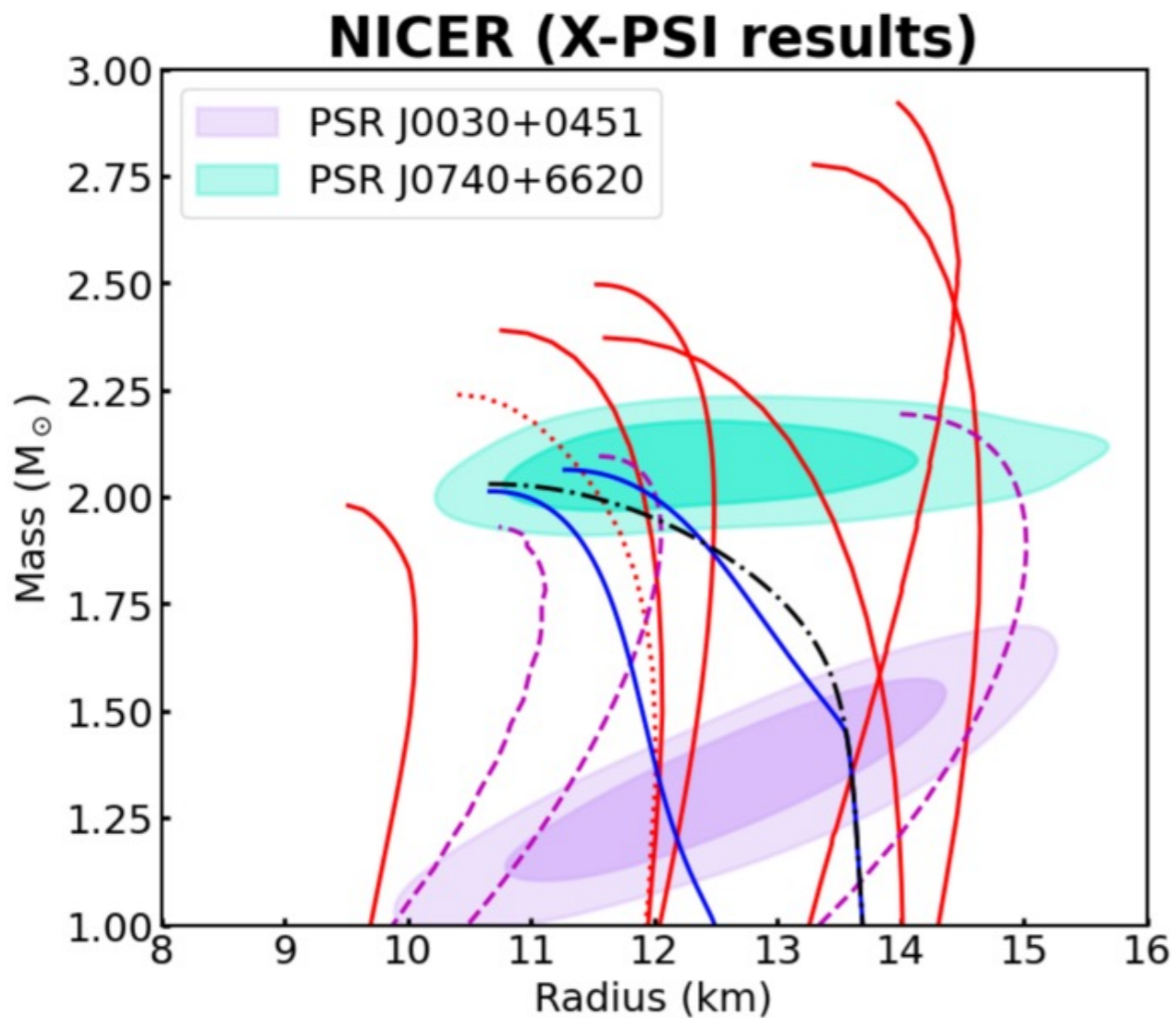


NASA probe-class proposal
Ray et al. 2019, @strobexastro

Analysis pipelines being developed and tested using
simulated and real (NICER/RXTE) data



STROBE-X/EXTP PROSPECTS



95% credible regions shown

Three different classes of neutron star: rotation-powered millisecond pulsars (more with mass priors), accretion-powered pulsars, thermonuclear burst oscillation sources.

Initial survey at $\pm 5\%$, run cross-checks to address any systematics.
Deep observations to hit $\pm 2\%$ for most promising sources.