# **Contents**

1	Probing the ultra-dense matter			3
	1.1 Measuring the sizes of the bursting sources—		uring the sizes of the bursting sources—	_ 4
	1.2	Scientific summary of the results		9
		1.2.1	Modeling of neutron star atmospheres and emergent radiation —	9
		1.2.2	Understanding the astrophysical environments of X-ray bursts —	9
		1.2.3	Constraining the mass and radius of neutron stars	9
	1.3	The au	The author's contribution to the publications	
2	Bibliography			11



# 1 Probing the ultra-dense matter

The main motive for this thesis was to set constraints for the ultra-dense equation of state. Instead of starting from the nuclear physics that works on the smallest scales, we use astrophysical observations to study large-scale "global" aspects of neutron stars. It is then possible to make a step back to the nuclear physics because the size of a compact star is strongly coupled to the composition of its core.

Looking from the astrophysical point of view, it is the size of the neutron star that will define many of its observable features. One of the most important characteristics is the compactness of the object that will then define the exact shape of the spacetime surrounding it. The strongly curved spacetime, in turn, influences many of the phenomena occurring in the close vicinity of the star and will also leave its distinct imprints on the observations.

The physical phenomena behind the observable features on the other hand, are often highly energetic, otherwise they would not be seen by distant observers, such as us. It is these highly energetic physical processes that will then render the neutron stars visible to us, and that at the same time carry a plethora of information from the surroundings of where they originated from. This gives birth to a beautiful connection where the delicate and unattainable nuclear physics of the ultra-dense matter is coupled to vigorous astrophysical phenomena that we can observe. The caveat here is that the astrophysical processes are often messy and poorly understood. Hence, a thorough understanding of both, the nature of the observed phenomena and how it exactly couples to the nuclear physics, is needed.

In this thesis, we will focus on extracting the information from the X-ray bursts. In theory, this method of using the X-ray bursts to probe the neutron star interiors is robust as we can theoretically model the characteristics of the emerging radiation and these models can be applied to describe the data that we see. In practice, however, caution is needed when applying the models as the environment and the astrophysics near the neutron star play a huge role.

In this final chapter, we will lay out the basics of how by observing the burst cooling

it is possible to set constraints on the size of the emitting area, and in the end, the radius of the neutron star. We will also summarize the content of the articles in this thesis, and discuss discuss our work where we try to understand not only the complex role of the astrophysical surroundings but in the end, the composition of the core.

## 1.1 Measuring the sizes of the bursting sources

Even though the bursts characteristics change from one burst to another as we saw in Sect. ??, the cooling appears to obey some common trends. This means that as long as we have some kind of an energy injection deep below the neutron star's atmosphere, the energy will radiate out and the uppermost layers of the star will then shape it into a similar cooling curve, independent of the actual details of the injection. If we are then able to model the atmosphere and the processes therein, we can use the bursts as probes for the neutron star interiors. Note, however, that not every burst is powerful enough to be of practical use. As we shall see, we additionally require that the bursts reach the Eddington limit, which in practice means using the PRE-bursts only.

To begin, let us define three different families of quantities: Observed quantities (obs), theoretical quantities predicted by our model at infinity  $(\infty)$ , and the same theoretical model quantities in the local frame of the star (\*). This is done, because general relativistic effects change the local physical quantities as they travel from the star to a distant observer.\* More specifically, we can connect the temperatures T, radii R, and luminosities L as

$$R_{\infty} = R_*(1+z) \tag{1.1}$$

$$T_{\infty} = \frac{T_*}{1+z} \tag{1.2}$$

$$L_{\infty} = \frac{L_*}{1+7},\tag{1.3}$$

where (1 + z) is the redshift factor that is related to the previously defined compactness  $u = 2GM/Rc^2$  as

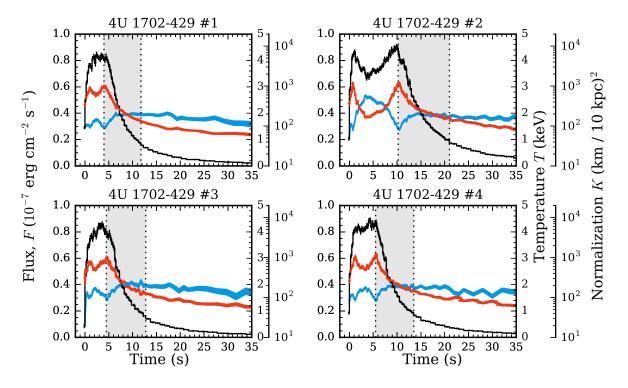
$$1 + z = (1 - u)^{-1/2}. (1.4)$$

From the observations, we see that the detected burst spectra are reasonably well-described by the Planck function (blackbody) as

$$F_{E.\text{obs}} \approx \pi B_E(T_{\text{obs}}) K_{\text{obs}},$$
 (1.5)

where  $B_E(T_{\rm obs})$  is a blackbody function with a measured temperature  $T_{\rm obs}$  and normalization  $K_{\rm obs}$ , together with E which is energy that we observe at. The normalization for a

<sup>\*</sup>see, e.g. [1] W. H. G. Lewin, J. van Paradijs, and R. E. Taam. SSRv. (1993).



**Figure 1.1:** Examples of bolometric flux, temperature and blackbody normalization evolution during the hard-state PRE bursts. The black line shows the estimated bolometric flux (left-hand vertical axis) in units of  $10^{-7}$  erg cm<sup>-2</sup> s<sup>-1</sup>. The blue ribbon shows the blackbody normalization (outer right-hand vertical axis) in  $(km/10 \, kpc)^2$ . The red ribbon show the blackbody temperature (inner right-hand vertical axis) in keV. Highlighted gray area marks a typical region of the cooling tail used in the fitting procedures.

circular object at a distance D in the sky is

$$K_{\text{obs}} = \frac{R_{\text{obs}}^2}{D^2}. (1.6)$$

Observed bolometric flux is then

$$F_{\text{obs}} = \int_0^\infty F_{E,\text{obs}} dE = \sigma_{\text{SB}} T_{\text{obs}}^4 \frac{R_{\text{obs}}}{D^2}.$$
 (1.7)

Some examples of Planck function fit results for X-ray bursts are shown in Fig. 1.1. Here the time-dependent spectral fits are shown for one particular source, 4U 1702–429.\*

<sup>\*</sup>NMS17, see [2] J. Nättilä et al. A&A. (2016), for more detailed description of the data.

All of the bursts shown here are exhibiting the photospheric radius expansion, that can be seen from the characteristic dip in the normalization and of the simultaneous maximum in the temperature.\* The flux corresponding to the exact moment when the photosphere collapses back to the neutron star's surface is dubbed the touchdown flux, and it is visualized by the first vertical dotted line in the Figures.

From the atmosphere models of neutron stars, we obtain a similar result. The local detailed model spectra is well approximated by a so-called diluted blackbody model given as

$$F_{E,*} \approx \pi w B_E(f_c T_{\text{eff},*}), \tag{1.8}$$

where w is the dilution factor,  $f_c$  is the color-correction factor, and  $T_{\rm eff,*}$  is the effective temperature of the atmosphere. This allows us to connect the observed values to the theoretical model values by first redshifting these quantities to infinity. From (1.2) we simply obtain that the temperature of the model as seen by a distant observed must be

$$f_{\rm c}T_{\rm eff,\infty} = f_{\rm c}\frac{T_{\rm eff,*}}{1+z}.$$
 (1.9)

Similarly, the area of the star on the sky must be related not to  $R_*$  but to  $R_\infty$  as given by (1.1)

$$w\frac{R_{\infty}^2}{D^2} = w\frac{R_*^2(1+z)^2}{D^2}. (1.10)$$

The latter (1.10) gives immediate constraints for the radius as it can be equated with the observed size (1.6) as<sup> $\dagger$ </sup>

$$R_{\text{obs}}^2 = wR_{\infty}^2 = wR_*^2 (1+z)^2. \tag{1.11}$$

Additional constraints can be obtained by measuring Eddington limit of the source. As we have seen, there exists a flux for which the radiation forces equal to the gravitational forces (see Sect. ??), given as

$$F_{\rm Edd,*} = \frac{GMc}{\kappa_{\rm T}R_*^2}(1+z),$$
 (1.12)

where  $\kappa_T = 0.2(1 + X)$  cm<sup>2</sup> g<sup>-1</sup>, is the Thomson electron scattering opacity and X is the hydrogen mass fraction. One should note here that even though we use the Thomson electron scattering opacity in the notation, one is not restricted to assuming this. It is, for example, possible to take the Klein-Nishina reduction in the cross-section into account which formally allows for super-Eddington fluxes.<sup>‡</sup> In reality the Eddington limit is, of

<sup>\*</sup>see, e.g. [3] D. K. Galloway *et al. ApJS*. Paradijs *et al. PASJ*. (1990). (2008), for more thorough discussion. <sup>‡</sup> [6] V. Suleimanov, J. Poutanen, and K. <sup>†</sup> [4] W. Penninx *et al. A&A*. (1989); [5] J. van Werner. *A&A*. (2012).

course, still respected. Using this characteristic flux we can also define the Eddington luminosity  $L_{\rm Edd,*}$  and the corresponding Eddington temperature  $T_{\rm Edd,*}$  as

$$L_{\rm Edd.*} = 4\pi R_*^2 F_{\rm Edd.*} = 4\pi R_*^2 \sigma_{\rm SB} T_{\rm Edd.*}^4. \tag{1.13}$$

These are again quantities defined near the star whereas what one observes at infinity are given by

$$L_{\rm Edd,\infty} = \frac{L_{\rm Edd,*}}{1+z},\tag{1.14}$$

$$F_{\text{Edd},\infty} = \frac{L_{\text{Edd},\infty}}{4\pi D^2} = \frac{GMc}{\kappa_{\text{T}}D^2} \frac{1}{1+z},$$
 (1.15)

and

$$T_{\rm Edd,\infty} = \frac{T_{\rm Edd,*}}{1+z}.$$
 (1.16)

As the simplest case, we can obtain additional constraints for the radius and mass by just measuring the  $F_{\rm Edd,\infty}$  somehow. This can be done, for example, by equation it with the touchdown flux obtained from the time-dependent burst spectra. This is the basis of the so-called "touchdown method".\*

A more sophisticated version of this is the so-called "cooling tail method". Here we can compute the varying color-correction factor  $f_c$  from the atmosphere models as a function of  $\ell \equiv L_*/L_{\rm Edd,*}$ . In this case, the dilution factor was fully omitted as  $f_c \approx w^{-4}$ . The color-correction factor can then be related to multiple  $K_{\rm obs}$  measurements, each representing an one time snapshot from the cooling tail. As the time time passes and the surface cools down, the flux decreases. This allows us to compare the model dependency of  $\ell$  vs.  $f_c$  to the observations of  $F_{\rm obs}/F_{\rm Edd,\infty}$  vs.  $K_{\rm obs}^{-1/4}$ . Hence, extra information from the observations is used because not only are the individual color-correction factor values compared against the model but also the mutual dependency of them. The fitting procedure is two dimensional in this case as we fit  $F_{\rm Edd,\infty}$  and  $R_{\infty}^2/D^2$  simultaneously. Interestingly, the combination of these two fit parameters then yield a distance-independent quantity, physically corresponding to the Eddington temperature of the source at infinity, and given ascheck

$$T_{\rm Edd,\infty} = 1.14 \times 10^8 \left( \frac{F_{\rm Edd,\infty}}{10^{-7} \text{ erg cm}^{-2} \text{ s}^{-1}} \right)^{1/4} \left( \frac{(\text{km}/10 \text{ kpc})^2}{R_{\infty}^2/D^2} \right)^{1/4} \text{ K.}$$
 (1.17)

Paradijs et al. PASJ. (1990); [8] F. Özel. Nature. (2011); (2006); [9] F. Özel et al. ApJ. (2016).

<sup>† [10]</sup> V. Suleimanov et al. ApJ. (2011); [11] V. RAS. (2014).

<sup>\* [7]</sup> T. Ebisuzaki. PASJ. (1987); [5] J. van Suleimanov, J. Poutanen, and K. Werner. A&A. [6] V. Suleimanov, J. Poutanen, and K. Werner. A&A. (2012); [12] J. Poutanen et al. MN-

This corresponds to a parametric relation for the M and R via the compactness u, given as

$$R = \frac{c^3 u (1 - u)^{3/2}}{2\kappa_{\rm T} \sigma_{\rm SB} T_{\rm Edd,\infty}^4} \approx 1188 \frac{u (1 - u)^{3/2}}{(1 + X) T_{\rm Edd,\infty,7}^4} \, \text{km},$$

$$M \approx u \frac{R}{2.95 \, \text{km}} \, \text{M}_{\odot},$$
(1.18)

where  $T_{\rm Edd,\infty,7}=T_{\rm Edd,\infty}/10^7$  K. Later on, another variant of this was introduces, called "direct cooling tail method" where the assumption of  $f\approx w^{-4}$  was relaxed, i.e., both  $f_{\rm c}$  and w are considered, and the fitting is done directly via the M, R and D parameters.\*

The usage of these methods on X-ray burst data span almost a three decades of scientific work as of now. Starting from the early work in the late 80s they have since improved and been applied to various sources to estimate the radius and mass. Latest in the family, is the method of fitting the observed data directly with the atmosphere models. Although computationally more demanding exercise, it allows us to finally extract every piece of information possible from the data. This is based on the additional model dependency on the surface gravity, composition, and detailed spectral shape that slightly deviates from the assumed Planck function.

The big caveat here for any of the aforementioned methods are the surroundings. We have seen that the astrophysical environment of neutron stars can be very active and lively. In the general picture, we have the accretion as an energy source and the disk to dissipate this energy. The disk is, however, not a simple geometrically thin steady layer but can have complex inner flow. On the other hand, if the disk does extend all the way down to the star, an additional complication originates from the boundary or spreading layer that can not only cover the star but also radiate on its own. These are some of the complications that we face when trying to analyze our neutron star observations, as after all when trying to constrain the mass and radius of the star we must make sure that it is actually the star that we are looking.

<sup>\* [2]</sup> J. Nättilä *et al. A&A*. (2016); [13] V. F. †**NMS17**. Suleimanov *et al. MNRAS*. (2017).

## 1.2 Scientific summary of the results

- 1.2.1 Modeling of neutron star atmospheres and emergent radiation
- 1.2.2 Understanding the astrophysical environments of X-ray bursts
- 1.2.3 Constraining the mass and radius of neutron stars

## 1.3 The author's contribution to the publications

### Paper I.

The author of the thesis made contributions to the manuscript, reduced and analyzed the observational X-ray data, and contributed to the scientific discussions related to the manuscript.

## Paper II.

The author participated in the reduction and analysis of the observational data, made significant contributions to the development of the data reduction software, and helped in the preparation of the manuscript.

#### Paper III.

The author contributed to the main idea of the paper, independently redesigned the neutron star atmosphere code used for the calculations, and implemented new physical processes to this numerical framework. The author also prepared most of the manuscript.

#### Paper IV.

The author independently designed the Bayesian fitting framework for the cooling tail method, reduced and analyzed the X-ray observations, and finally led the equation of state modeling from the observations. The author also prepared the manuscript.

#### Paper V.

The author contributed to the main idea of this research and was responsible of the atmosphere modeling of the observations. The Bayesian atmosphere spectral model fitting framework was also independently designed by the author. Author also contributed to the manuscript.

#### Paper VI.

Author helped in designing the fitting framework, based on his own previous results, and contributed to the scientific and statistical discussions of the results.. The author also contributed to the manuscript.

## Paper VII.

In this paper, the author proposed the usage of the dynamic power-law method and cosupervised the project together with Dr. Jari Kajava. The project is originally related to the Master's thesis of MSc. Jere Kuuttila. Author also made significant contributions to the manuscript.

## Paper VIII.

The author of the thesis took part in the discussion of the theoretical explanation for the obtained observational results and contributed significantly to the statistical analysis of data. The author also contributed to the manuscript.

## Paper IX.

The author independently proposed the idea of applying the split-Hamilton method to the ray tracing problem of photons, derived the theoretical framework and all the related formulae, designed the numerical code, and prepared most of the manuscript.

## Paper X.

The author independently designed the hierarchical Bayesian fitting framework, implemented it into a code together with M.C. Miller and A.W. Steiner, analyzed the data, and, finally, prepared the manuscript together with M.C. Miller, with the help from the other co-authors.

## Paper XI.

In this paper, the author took part in the scientific discussion of the results, helped in the statistical analysis and contributed to the manuscript.

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