# 2018-2019: master at Trento University + research study grant for recent graduates *gravitational waves Equation of state and*

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Thesis on postmerger model-independet characterization

TALENT/ECT\*24 - postmerger model-independet characterization 18 July 2024





- A full inspiral, merger, postmerger model for binary neutron stars

TELESCOPE Schianchi,Matthew Beaudoin, Ramon Jaeger, Sahil Tim Dietrich, Henrique Gieg, Vsevolod Nedora, Adrian Abac, Edoardo Giangrandi, Hauke Koehn, Nina Kunert, Ivan Markin, Anna Neuweiler, Henrik Rose, Federico Jhavar, Hannes Kroke, Ranjith Mudimadugula, Karol Pawel Peters, Ashwin Shirke, Sophia Ve Dahm

### General Relativity and gravitational waves

General Relativity: masses deform the spacetime geometry producing curvature, and this geometry is what determines how massive objects move



 $g_{\alpha\beta}$ : spacetime metric



Credit:ESA–C.Carreau



curvature source of the curvature (mass and energy)

### General Relativity and gravitational waves

$$
W\!\text{eak field limit} \qquad \qquad g_{\alpha\beta} = \eta_{\alpha\beta} + h_{\alpha\beta} \qquad \qquad |h_{\alpha\beta}| \ll 1
$$

 $\mathbb{L}$  linearized theory of gravity (expansion of Einstein's equation around flat metric to linear order in  $h\lambda_{\beta}$ 

Linearized Einstein equations:  $\Box \bar{h}_{\alpha\beta} = -\frac{16\pi G}{c^4} T_{\alpha\beta}$ in vacuum  $\Box \bar{h}_{\alpha\beta} = 0 \implies$  wave- equation!





### Gravitational waves detection



### Identifying signals



If you want to know more: tutorial [here](https://github.com/gwastro/PyCBC-Tutorials/blob/master/tutorial/3_WaveformMatchedFilter.ipynb)

#### Matched filtering

Compare data with template banks (only main parameters) Find *trigger time* 



### Gravitational waves detectors



#### Next-generation detectors:

- Einstein Telescope (ET) in Europe
- Cosmic Explorer (CE) in the US



### Gravitational waves detectors



### Gravitational waves sources



### Leading order: mass quadrupole moment

### What we have



# What science can we do with gravitational waves?



### Population properties

#### MASSES



LVK, Phys.Rev.X 13 (2023) 1, 011048

### Population properties

#### MASSES SPINS



#### LVK, Phys.Rev.X 13 (2023) 1, 011048

#### Binaries formation channels:

- Isolated binary evolution: aligned spins
- Dynamical interaction: precession, misaligned spins

Spin properties  $\Longleftrightarrow$  Formation channels Investigate and model different mechanisms

● GW190412: unequal masses



● GW190412: unequal masses

● GW190425: heavy Binary Neutron Star



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● GW190521: the most massive



● GW190412: unequal masses

● GW190425: heavy Binary Neutron Star

● GW190521: the most massive

● GW190814: a mysterious compact object  $m_2$ : 2.50 - 2.67 M☉ => ???



● GW190412: unequal masses

• GW190425: heavy Binary Neutron Star

- GW190521: the most massive
- GW190814: a mysterious compact object
- GW230529: mass-gap event Primary object  $\overline{m_1}=3.6 M_\odot$ BH in mass lower mass gap (3-5  $M_{\odot}$ )



### Testing general relativity

 $\triangleright$  Dynamical, strong-field regime ➢ Comparing data with general relativity predictions

- Parametrized deviations from the phase evolution
- Test the nature of compact objects: echoes (no horizon)
- Propagation of gravitational waves Most recent LVK results:

…

No violations of general relativity found until now!



Phys.Rev.D 108 (2023) 6, 064018

arXiv:[2112.06861](https://arxiv.org/abs/2112.06861)

### Nuclear matter properties



Neutron stars: supranuclear-dense matter

Equation of state : relation between pressure and density mass - radius mass - tidal deformability parameter



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### Nuclear matter properties



Gen. Rel.Grav. 53, 27 (2021)

- measure the system parameters (masses and tidal deformabilities)
- study the postmerger (future)

● multimessenger astrophysics [NMMA](https://nuclear-multimessenger-astronomy.github.io/nmma/)



### Nuclear matter properties



Gen. Rel.Grav. 53, 27 (2021)

- **•** measure the system parameters (masses and tidal deformabilities)
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# How do we estimate the source parameters?

 $1e-17$  $\overline{1}$  $\overline{0}$  $^{-1}$  $-2$  $150$  $200$  $250$  $300$  $+1.369419e9$ Time

We assume that from match filtering we know there is a signal



- The measured GW data
- $\bullet$  A model H to describe our data, whose parameters we want to estimate (ex: the masses)
- An idea of the range in which the parameters lie (ex: for a NS,  $m_1, m_2 \in [1,3]M_{\odot}$ )

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### Parameter estimation - Bayesian inference





Posterior probability density

$$
\begin{pmatrix}\text{Evidence}\rightarrow \text{Model comparison} \\ \mathcal{B}^B_A=\frac{p(d|H_B)}{p(d|H_A)}=\frac{Z_B}{Z_A} \end{pmatrix}
$$

### Parameter estimation - waveform models



Accurate models needed: include tidal effects, spins, precession, higher-order modes, eccentricity…

### Waveform models

GW signal  $\Rightarrow$  solve Einstein Field Equations:  $R_{\alpha\beta} - \frac{1}{2}Rg_{\alpha\beta} = \frac{8\pi G}{c^4}T_{\alpha\beta}$ Numerical Relativity  $\implies$  Computationally expensive

**NRsurrogate** models: directly interpolated on a set of pre-computed NR waveforms

◆ very accurate limited parameters space **X**

Approximations

### Waveform models



### Waveform models - Post Newtonian expansion

 $\triangleright$  GWs carry energy -> remove energy from the system -> orbit shrinks





### Waveform models - Post Newtonian expansion

#### ➢ Curvature induced by the source



Inspiral: Assume binary components at large distance and with small velocities

Energy balance:

$$
\mathcal{F}(v)=-\dot{E}(v)
$$

expand both sides in power series of  $(v/c)$ : post-Newtonian expansion

Post-Newtonian (PN) expansion = expansion in (v/c) n-th PN order  $\iff \mathcal{O}\left(\frac{v^{2n}}{c^{2n}}\right)$ 

compute energy and flux up to needed order  $\Rightarrow$  compute the GW phase  $h(t) = B(t)e^{i\Phi(t)}$ 

$$
\widehat{\dot{\phi}(t)=v^3/M_{\rm tot}}\hspace{-2mm}\dot{\dot{\psi}}=-\mathcal{F}(v)/E'\hspace{-2mm}\dot{\int}
$$

Taylor family models  $(E' = dE/dv)$ 

### Waveform models - Post Newtonian expansion

$$
\begin{aligned}\n\mathcal{E}_4(v) &= -\frac{1}{2}\eta v^2 \left\{ 1 - \left(\frac{3}{4} + \frac{1}{12}\eta\right)v^2 - \left(\frac{27}{8} - \frac{19}{8}\eta + \frac{1}{24}\eta^2\right)v^4 \right. \\
&\quad \left. + \left[ -\frac{675}{64} + \left(\frac{34445}{576} - \frac{205}{96}\pi^2\right)\eta - \frac{155}{96}\eta^2 - \frac{35}{5184}\eta^3 \right] v^6 \right. \\
&\quad \left. + \left[ -\frac{3969}{128} + \left(-\frac{123671}{5760} + \frac{9037}{1536}\pi^2 + \frac{896}{15}\gamma_{\rm E} + \frac{448}{15}\ln(16v^2)\right)\eta \right. \\
&\quad \left. + \left(-\frac{498449}{3456} + \frac{3157}{576}\pi^2\right)\eta^2 + \frac{301}{1728}\eta^3 + \frac{77}{31104}\eta^4 \right] v^8 + \mathcal{O}(v^{10}) \right\}\n\end{aligned}
$$

Characteristic velocity of the binary  $v = \left(\pi f_{\mathrm{gw}} M_{\mathrm{tot}}\right)^{1/3}$ 

Symmetric mass ratio

$$
\eta=\tfrac{m_1m_2}{\left(m_1+m_2\right)^2}
$$

Currently: energy up to 4 PN, flux up to 4.5 PN

$$
\mathcal{F}_{4.5}(v) = \frac{32}{5}\eta^2v^{10}\left\{1-\left(\frac{1247}{336}+\frac{35}{12}\eta\right)v^2+4\pi v^3\right.\n-\left(\frac{44711}{9072}-\frac{9271}{504}\eta-\frac{65}{18}\eta^2\right)v^4-\left(\frac{8191}{672}+\frac{583}{24}\eta\right)\pi v^5\right.\n+\left[\frac{6643739519}{69854400}+\frac{16}{3}\pi^2-\frac{1712}{105}\gamma_{\rm E}+\left(\frac{41}{48}\pi^2-\frac{134543}{7776}\right)\eta-\frac{94403}{3024}\eta^2-\frac{775}{324}\eta^3\right.\n-\frac{856}{105}\ln\left(16v^2\right)\left[v^6-\left(\frac{16285}{504}-\frac{214745}{1728}\eta-\frac{193385}{3024}\eta^2\right)\pi v^7\right.\n+\left[-\frac{323105549467}{3178375200}+\frac{232597}{4410}\gamma_{\rm E}-\frac{1369}{126}\pi^2+\frac{39931}{294}\ln 2-\frac{47385}{1568}\ln 3+\frac{232597}{8820}\ln\left(v^2\right)\right.\n+\left(-\frac{1452202403629}{1466942400}+\frac{41478}{245}\gamma_{\rm E}-\frac{267127}{4608}\pi^2+\frac{479062}{2205}\ln 2+\frac{47385}{392}\ln 3+\frac{20739}{245}\ln\left(v^2\right)\right)\eta\right.\n+\left(\frac{1607125}{6804}-\frac{3157}{384}\pi^2\right)\eta^2+\frac{6875}{504}\eta^3+\frac{5}{6}\eta^4\right]v^8\right.\n+\left[\frac{265978667519}{745113600}-\frac{6848}{105}\gamma_{\rm E}-\frac{342
$$

### Post Newtonian expansion - GW phase

In frequency domain:

$$
\tilde{h}(f)=A(f)e^{i\Psi(f)}
$$

GW phase:

$$
\boxed{\Psi(f) = 2\pi f t_c - \phi_c - \frac{\pi}{4} + \frac{3}{128\eta}v^{-5}\left[\sum_{k=0}^{7} \phi_k(\eta) v^k\right]}
$$

$$
\left\{ \begin{array}{l} \displaystyle v = \left( \pi f_{\rm gw} M_{\rm tot} \right)^{1/3} \\ \displaystyle \eta = \frac{m_1 m_2}{\left( m_1 + m_2 \right)^2} \end{array} \right.
$$

$$
\qquad \qquad \text{PN:} \ \ \phi_0 = 1 \qquad \quad \ \Psi(f)_{0 \text{PN}} = \tfrac{3}{128 \eta} v^{-5} \propto (\text{Myr})^{5/3}
$$

 $\implies$  phase evolution dominated by chirp mass

### Post Newtonian expansion - GW phase

In frequency domain:  $\tilde{h}(f) = A(f)e^{i\Psi(f)}$ GW phase:  $\Psi(f) = 2\pi f t_c - \phi_c - \frac{\pi}{4} + \frac{3}{128\eta} v^{-5} \left[ \sum_{k=0}^{7} \phi_k(\eta) v^k \right]$   $\left\{ v = \left( \frac{\pi f_{\text{gw}} M_{\text{tot}}}{\eta} \right)^{1/3} \right\}$  $\phi_0 = 1$   $\Psi(f)_{0 \rm PN} = \frac{3}{128n} v^{-5} \propto (M_c) \pi f)^{5/3}$  $\implies$  phase evolution dominated by chirp mass  $\boxed{\psi = \psi_{\mathrm{PP}} + \psi_{\mathrm{SO}} + \psi_{\mathrm{SS}} + \psi_{\mathrm{T}}}$  $\sim$  point-particle  $\Psi(\overline{f})$ tidal effectsspin-orbit spin-spin

### Post Newtonian expansion - spins

 $\triangleright$  lowest spin correction at 1.5 PN (k=3):

 $76\eta(\chi_1 + \chi_2)$  $\left\{ m_1 \chi_1{+}m_2 \chi_2 \right\}$  $\chi_i$  = dimensionless spin aligned with orbital  $\propto$ angular momentum 226  $M_{\rm tot}$ changing mass ratio can mimic spin  $\chi_{\rm eff}$ effects -> degeneracy

### Post Newtonian expansion - spins

226

 $\triangleright$  lowest spin correction at 1.5 PN (k=3):

 $\left\{ m_1 \chi_1 + m_2 \chi_2 \right\}$ 

 $M_{\rm tot}$ 

 $\chi_{\rm eff}$ 

 $\propto$ 

 $76\eta(\chi_1+\chi_2)$  $\chi_i$  = dimensionless spin aligned with orbital angular momentum

changing mass ratio can mimic spin effects -> degeneracy





### Post Newtonian expansion - spins









 $\overline{7}$ 

Time[s]

8

9

5

### Post Newtonian expansion - tidal corrections



 $\delta Q_{ij}=-\Lambda m^5\mathcal{E}_{ij}$  . tidal field quadrupole tidal deformability moment parameter:

 $\Lambda = \frac{2}{3} k_2 \left(\frac{R}{m}\right)^5$ 

Tidal deformability -> orbital energy loss -> faster inspiral

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$$
\psi(f) = \dots -\frac{39}{2} \tilde{\Lambda} v^{10}
$$
 From 5PN order ( $\sim \mathcal{O}(100)$  Hz)

$$
\tilde{\Lambda} = \frac{16}{13} \left[ \left( 1 + \frac{12m_2}{m_1} \right) \frac{\lambda_1^5}{M^5} + \left( 1 + \frac{12m_1}{m_2} \right) \frac{\lambda_2^5}{M^5} \right]
$$

mass-weighted tidal deformability

6PN order  $\propto \Delta \tilde{\Lambda}$ 



### Waveform models - Post Newtonian

- $\bullet$  PN approximation: expansion in (v/c)
- It explains why observe certain effects
- We can derive models directly from it (TaylorF2), analytical and fast

#### but

- PN expansion valid until ISCO  $f_{\rm ISCO} = \left(6^{3/2} \pi M_{tot}\right)$
- Taylor models for inspiral only
- Not extremely accurate (velocity increases)



We measure chirp mass and mass-weighted tidal deformability, not radius!

## Waveform models - Effective one body



Define a map between the Hamiltonian of the binary problem and the one of effective description:  $H_{\text{eff}} \rightarrow$  Concise resummation of PN results

Add terms corresponding to not-yet-computed PN orders and calibrate to NR simulations

#### Equations of motion

H

$$
\Rightarrow \qquad \frac{dx^i}{dt} = \frac{\partial H}{\partial p_i}, \qquad \frac{dp_i}{dt} = -\frac{\partial H}{\partial x^i} + \mathcal{F}_i \qquad \qquad \overbrace{\qquad \qquad}
$$
 Gravitational wave signal

### Waveform models - Effective one body

● Inspiral-merger-ringdown (IMR) model:

EOB dynamics until lighting + quasinormal ringdown modes

- Extend region of validity by calibrating to NR waveforms
- Examples: SEOBNRv4PHM, SEOBNRv5, TEOBResumS



### Waveform models - Phenom

- Phenomenological ansatz with coefficients calibrated to NR waveforms
- Three different regions
- $\begin{aligned} \bullet \quad \tilde{h}(f) = A(f) e^{i \Phi(f)} \end{aligned}$ Different phase and amplitude ansatz for each region



$$
\Phi_{\text{Ins}} = \Phi_{\text{spin}}^{F2}(f; \Xi) + \frac{1}{\eta} \left( \sigma_0 + \sigma_1 f + \frac{3}{4} \sigma_2 f^{4/3} + \frac{3}{5} \sigma_3 f^{5/3} + \frac{1}{2} \sigma_4 f^2 \right)
$$
  

$$
\Phi_{\text{Int}} = \frac{1}{\eta} \left( \beta_0 + \beta_1 f + \beta_2 \ln(f) - \frac{\beta_3}{3} f^{-3} \right)
$$
  

$$
\Phi_{\text{MR}} = \frac{1}{\eta} \left[ \alpha_0 + \alpha_1 f - \alpha_2 f^{-1} + \frac{4}{3} \alpha_3 f^{3/4} + \alpha_4 \tan^{-1} \left( \frac{f - \alpha_5 f_{\text{RD}}}{f_{\text{damp}}} \right) \right]
$$



[Phys. Rev. D 93, 044007 ]



### Waveform models - effects of matter

 $\psi = \psi_{\rm PP} + \psi_{\rm SO} + \psi_{\rm SS} + \sqrt{\psi_{\rm T}}$  Tidal deformability

NRTidal: closed-form expression to describe tidal effects, calibrated to NR

Most recent: NRTidalv3 [arXiv:2311.07456]

- different EoS
- also not-equal mass



Add phase corrections to existing BBH models IMRPhenomD\_NRTidalv3, IMRPhenomXAS\_NRTidalv3, IMRPhenomXP\_NRTidalv3, SEOBNRv5\_ROM\_NRTidalv3

### Parameter estimation - Bayesian inference



Bayes theorem:



Likelihood and evidence are multidimensional integrals on the parameters space: 15 parameters for BBHs, 17 for BNSs



### Parameter estimation - Bayesian inference



Bayes theorem:



Likelihood and evidence are multidimensional integrals on the parameters space: 15 parameters for BBHs, 17 for BNSs  $\mathbf{A}$ 



Stochastic sampling

- ➔ nested sampling (evidence)
- ➔ Markov Chain Monte Carlo (MCMC) (see backup slides for details)

### Neutron stars EOS with current detectors



Two BNSs events:

● GW170817

(close, loud, multimessenger)

• GW190425 (far, no  $\tilde{\Lambda}$  information )



### Neutron stars EOS with current detectors



Phys.Rev.Lett. 121 (2018) 16, 161101

Sample on the EoS -> compute  $\tilde{\Lambda}$ from mass and EoS -> use it in the model

Combine with other sources of information! Overview: <https://arxiv.org/abs/2402.04172>



### Combining information



### Combining information



#### Web interface: [https://multi-messenger.physik.uni-potsdam.de/eos\\_constraints/](https://multi-messenger.physik.uni-potsdam.de/eos_constraints/)



### Future detectors



### Future detectors



#### Extended frequency band



EoS in different temperature and density regime

### Future detectors - nuclear parameters



Posteriors for masses and lambdas + nuclear meta-model (expansion of energy per particle in density)

Phys.Rev.D 108 (2023) 12, 122006

### Future detectors - challenges

More events, louder, more time in band

- $\triangleright$  Overlapping signals
- Systematics (ex: waveform models)
- ➢ Computational issues!





Phys.Rev.D 104 (2021) 4, 044003

### Future detectors - challenges

More events, louder, more time in band

- ➢ Overlapping signals
- Systematics (ex: waveform models)
- Computational issues!

### BNS full parameter estimation with LIGO-Virgo takes

weeks, with ET/CE months



- Faster waveform/samplers
- Machine learning to evaluate the posteriors
- Approximate likelihood (Reduced Order Quadratures, Relative Binning, Multibanding)





Phys.Rev.D 104 (2021) 4, 044003

### Take-away message

- From GWs we can measure chirp mass and mass-weighted tidal deformability
- We can use this information (possibly combined with other data) to get information about the EoS
- To get chirp mass and  $\tilde{\Lambda}$  we use Bayesian inference:
	- Computationally very expensive -> nested or mcmc sampling
	- $\circ$  We need waveform models -> accurate but fast ( $\mathcal{O}(10^6)$ ) evaluations per analysis)
- Next generation detectors:
	- More precise measurements
	- Postmerger (different temperature and density, but very complicated)
	- Various challenges



### **Software**

**Parameter estimation** : bilby (python) documentation:<https://lscsoft.docs.ligo.org/bilby/> [google 'bilby software']





- nested: dynesty [documentation: https://dynesty.readthedocs.io/en/latest/]
- mcmc: bilby\_mcmc

[Bilby pipe,](https://lscsoft.docs.ligo.org/bilby_pipe/master/index.html) [parallel bilby](https://lscsoft.docs.ligo.org/parallel_bilby/): automation and parallelization

Waveforms: LALsuite library (C), [documentation](https://lscsoft.docs.ligo.org/lalsuite/lalsimulation/index.html)

Useful tools: pyCBC (python), documentation: https://pycbc.org/

### **Tutorials**

Python notebook:

- "toy\_model\_sampling.ipynb" : how PE works, example on a toy model (no GW)
- "waveforms\_and\_mismatch.ipynb": how to generate different GW waveforms for different parameters, mismatch computation between different waveforms
- "gw\_pe.ipynb": example of PE on GW signals (simplified sampler settings)

### Nested sampling

 $\mathcal{P}(\vec{\theta}) = \frac{L(\vec{\theta})\pi(\vec{\theta})}{\sqrt{Z(\vec{\theta})}}$  $Z = \int L(\vec{\ddot{\theta}}) \pi(\vec{\theta}) d\vec{\theta}$  $Z=\int_0^1 L(X)dX$  $Z \sim \sum_k g(L_k) \Delta X_k$ 

Estimate evidence, posterior as by-product

*Prior mass*  $X(\lambda)$  := integral over the prior volume of all parameters with likelihood greater than a given value  $\lambda$  $\mathcal{X}(\lambda)=\int_{\vec{\theta}:L(\vec{\theta})>\lambda}\pi(\vec{\theta})d\vec{\theta}$ 

discrete samples

$$
\textcolor{red}{\textbf{Evidence}\rightarrow \textbf{Model comparison}\atop \textbf{B}^{B}_{A}=\frac{p(d|H_B)}{p(d|H_A)}=\frac{Z_B}{Z_A}}
$$

### Nested sampling

- 1. Sample  $N_{\text{live}}$  points  $\left\{\vec{\theta}_1,\vec{\theta}_2,\ldots,\vec{\theta}_{N_{\text{live}}}\right\}$  from the prior and compute their likelihood
- 2. For the point with the lowest likelihood  $L_k$ , estimate the corresponding prior mass  $X_k$ ; save  $(\vec{\theta}, L_k, X_k)$ , and remove  $\vec{\theta}_k$  from the set of live points
- 3. Increase evidence by  $Z_k = f(L_k, X_k)$
- 4. Randomly draw  $\vec{\theta}_i$  from the prior, with  $L(\vec{\theta}_i) > L_k$
- 5. Repeat until termination condition

We obtain a series of  $(\vec{\theta},L_k,X_k)$  with increasing  $L_k$ 

$$
\quad \quad \overrightarrow{\hspace{1cm}} \quad \mathcal{P}(\vec{\theta}_k) \simeq \tfrac{Z_k}{Z}
$$



### MCMC

Sample from the posterior distribution

- 1. Sample  $\vec{\theta}$  from the prior
- 2. Generate next point  $\vec{\theta}'$  from a proposal distribution  $Q(\vec{\theta}'|\vec{\theta})$
- 3. Accept the new point with probability

 $\delta \alpha = \min \left\{ 1, \frac{L(\vec{\theta}^{'})\pi(\vec{\theta}^{'})Q(\vec{\theta}^{'}|\vec{\theta})}{L(\vec{\theta})\pi(\vec{\theta})Q(\vec{\theta}|\vec{\theta}^{'})} \right\}.$ 

accepted -> append  $\vec{\theta}'$  to list of samples rejected -> append  $\vec{\theta}$  to list of samples

4. Repeat from the appended sample

Proposal distributions for GWs can be very complicated!

