
Efficiency of template banks for highly-eccentric gravitational-wave sources

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Introduction

Techniques and aims

Motivation:

- Data analysis of targeted search techniques uses a **large number** of predicted waveform templates upon matched filtering. Waveforms for inspirals are parametrized by a set of intrinsic physical quantities (*masses, magnitudes and orientations of eccentricity*) result an **multi-dimensional parameter space**.
- Price of high dimensionality: parameter estimation and modeling are **prohibitively expensive** and **computationally unfeasible** with most methods!

Method:

- High-accuracy reduced basis representations have to be constructed that determines a relatively small set of the most relevant waveforms.
- One of the most common techniques is to eliminate the redundancy of the original data – wherein the waveform is orthogonal base-mediated – by singular value decomposition methods (SVD).
- In the parameter space of few, relevant waveforms (basis), any other waveform can be accurately expressed by interpolation techniques.

Introduction

Some references: Application of efficient basis reduction in GR

Decomposition techniques (SVD and *greedy basis*) have been performed for waveforms of merging binary black holes:

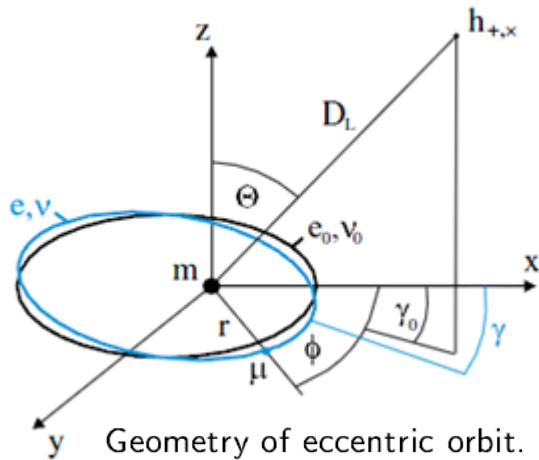
-  Field et al. (2011); Phys. Rev. Lett. 106, 221102; *Reduced basis catalogs for gravitational wave templates*
-  Field et al. (2012); Phys. Rev. D 86, 084046; *Towards beating the curse of dimensionality for gravitational waves using reduced basis*
-  Sathyaprakash et al. (2009); Phys. Rev. D 80, 084043; *Comparison of post-Newtonian templates for compact binary inspiral signals in gravitational-wave detectors*
-  M. Pürrer (2014); arXiv:1402.4146 [gr-qc]; *Frequency domain reduced order models for gravitational waves from aligned-spin black-hole binaries*

...however for elliptic sources such a method is yet to be developed.

- ① Eccentricity is often overlooked, arguing that it evaporates anyway in isolated systems, on the course of its evolution. Its role of eccentricity – like of spin – is fundamental for the prediction of waveform, hence it must be treated alike.
- ② In star clusters, and in the vicinity of galactic nuclei, a system cannot be regarded as being isolated: substantial eccentricity!

Numerical integration

Orbital and waveform evolution



- Reduced mass: $\mu = M_1 M_2 / M$
- Separation: $r = a_0(1 - e_0^2 / (1 + e_0 \cos \phi))$
- Semi-major axis: $a_0 = M^{1/3} (2\pi\nu_0)^{2/3}$

Equations of motion¹ to be integrated:

$$\dot{r} = -\frac{16}{15} \frac{M_1 M_2 M}{a^3 (1 - e^2)^5} [1 + e \cos \phi]^4 \left[12 + (1 + e \cos \phi)^2 + e^2 \cos^2 \phi \right]^4$$

$$\dot{e} = -\frac{8}{15} \frac{M_1 M_2 M}{a^4 e (1 - e^2)^4} [1 + e \cos \phi]^3 \left[\left(12 + (1 + e \cos \phi)^2 + e^2 \sin^2 \phi \right) \right. \\ \left. (1 + e \cos \phi) - 3(1 - e^2)(4 + 6e \cos \phi + e^2(3 \cos^2 \phi - 1)) \right]$$

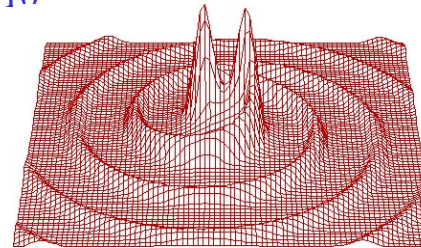
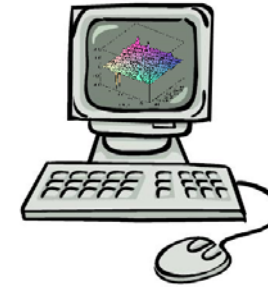
$$\dot{\phi} = \frac{M^{1/2}}{a^{3/2} (1 - e^2)^{3/2}} (1 - e \cos \phi)^2$$

¹ leading order Keplerian orbit and quadrupole radiation

Adaptive stepsize int. →

Parametric *NDSolve*:

- Cut off, if the separation reaches $6M_\odot$ (Schw. ISCO)
- MaxSteps = 10^{15}



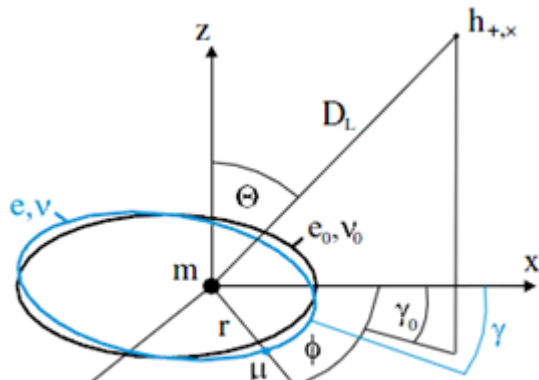
Waveform (2.5PN):

$$h_{\times}(\phi) = -\frac{\mu m \cos \Theta}{a(1 - e^2)D_L} \times [(5e \sin \phi + 4 \sin 2\phi + e \sin 3\phi) \cos 2\gamma - (5e \cos \phi + 4 \cos 2\phi + e \cos 3\phi + 2e^2) \sin 2\gamma],$$

$$h_{+}(\phi) = -\frac{\mu m (1 + \cos^2 \Theta)}{a(1 - e^2)D_L} \left[\left(\frac{5e}{2} \cos \phi + 2 \cos 2\phi + \frac{e}{2} \cos 3\phi + e^2 \right) \cos 2\gamma + \left(\frac{5e}{2} \sin \phi + 2 \sin 2\phi + \frac{e}{2} \sin 3\phi \right) \sin 2\gamma + (e \cos \phi + e^2) \frac{\sin^2 \Theta}{1 + \cos^2 \Theta} \right]$$

Numerical integration

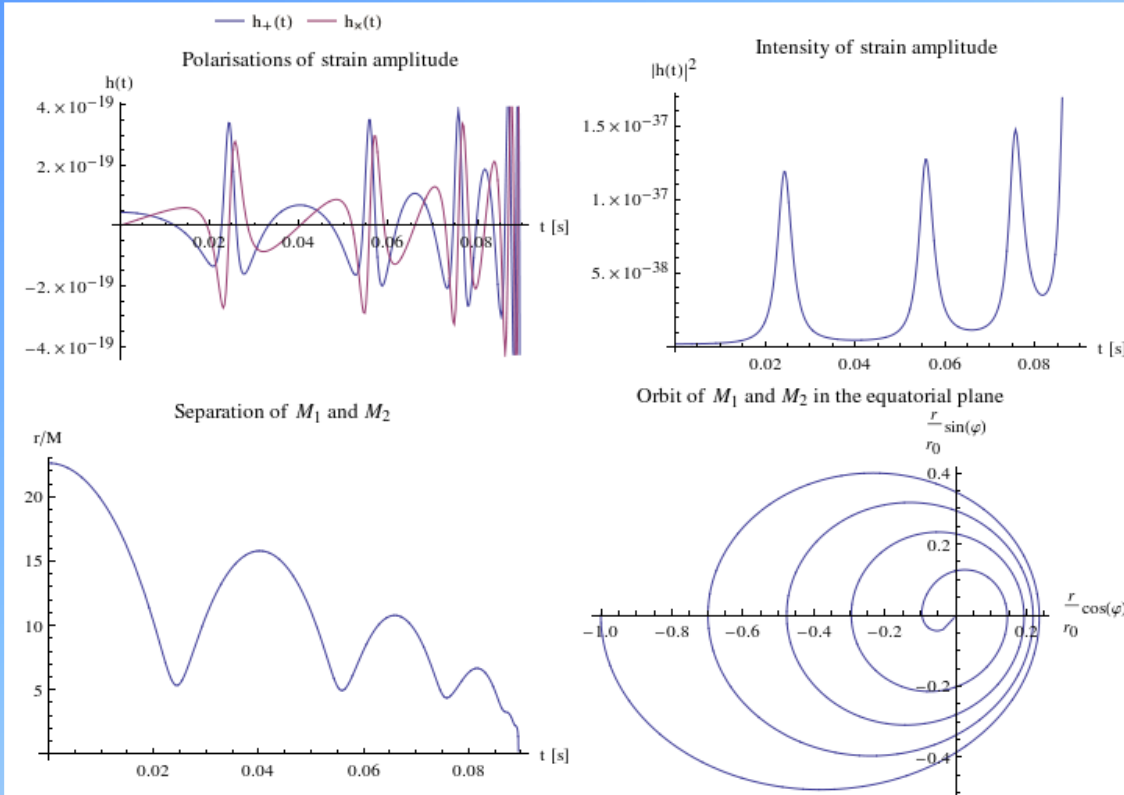
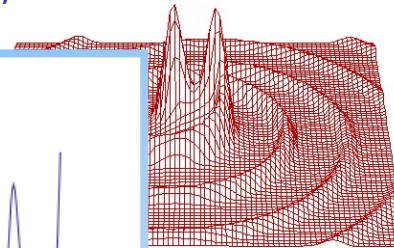
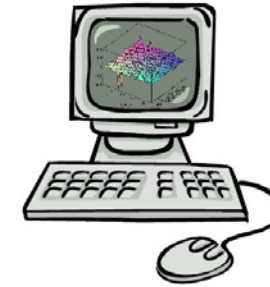
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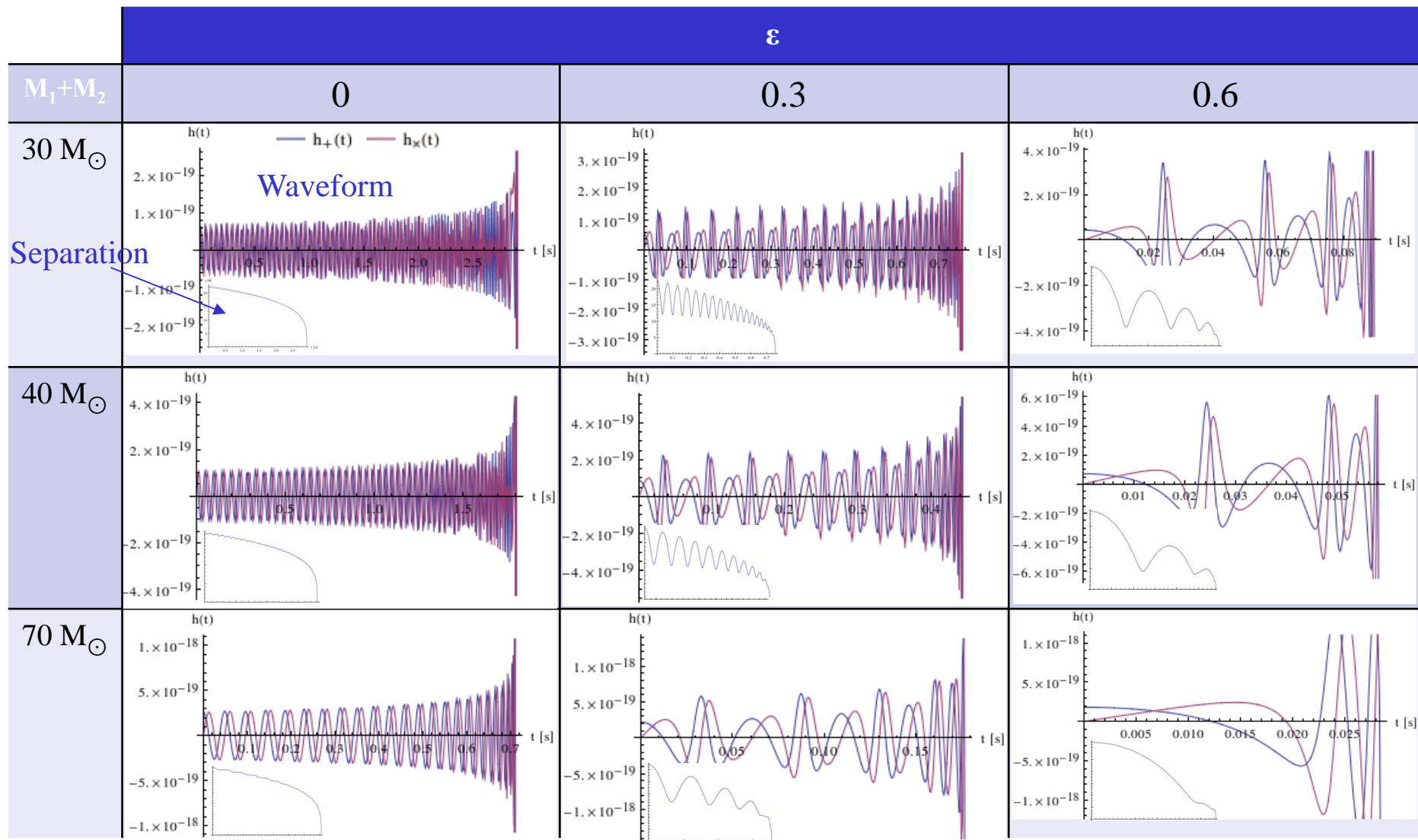
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Numerical integration

Construction of data basis

Data to be stored:

- Setting the sample rate: $M_{\text{start}} = 5.00$; $M_{\text{end}} = 35.00$; $M_{\text{step}} = 5.00$;
 $\varepsilon_{\text{start}} = 0.01$; $\varepsilon_{\text{end}} = 0.50$; $\varepsilon_{\text{step}} = 0.20$;
- Waveforms
- Time to reach Schwarzschild ISCO ($6M$): t_{end}



'Recipe'

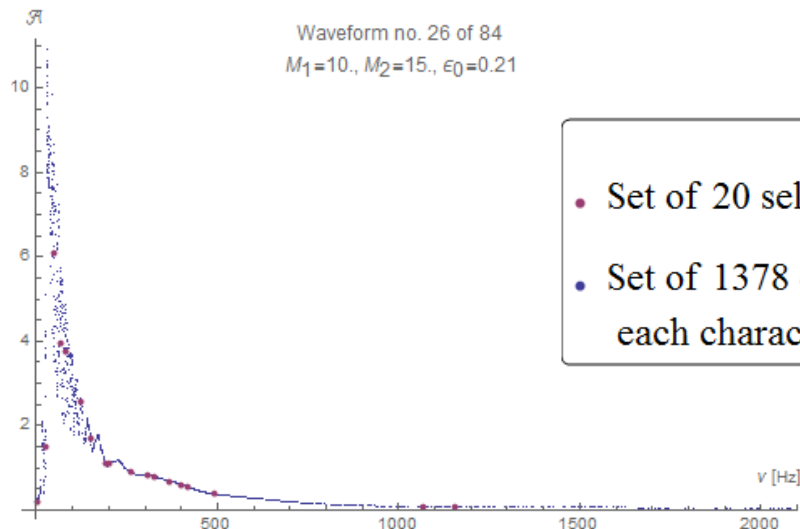
Blueprint for building reduced order models

The model following the footsteps of the code *SEOBNRv1* for merging black holes, described in [Pürrer (2014)] with some modifications:

I. Generate a set of n input waveforms that cover the multi-dimensional (in our case: 3) parameter space domain of interest, as densely as desired:

$$\{M_1, M_2\} \in (5M_\odot, 35M_\odot), \varepsilon \in (0, 1)$$

- 1 Choose starting and ending frequencies (10 és 8000 Hz), total mass and sampling rate so that the fast Fourier Transforms (FFTs) of the time-domain (TD) waveforms cover a suitable frequency range.
- 2 Generate n waveforms on a regular grid over the multi-dimensional parameter space
- 3 Store the amplitude (original and normalized), the phase and the interpolating functions fitted to them for each and every sample waveforms.



Datasets

- Set of 20 selected frequency points characteristic for the specific waveform
- Set of 1378 other points in the same frequency range (among all 1680), each characteristic for one of the other waveforms

'Recipe'

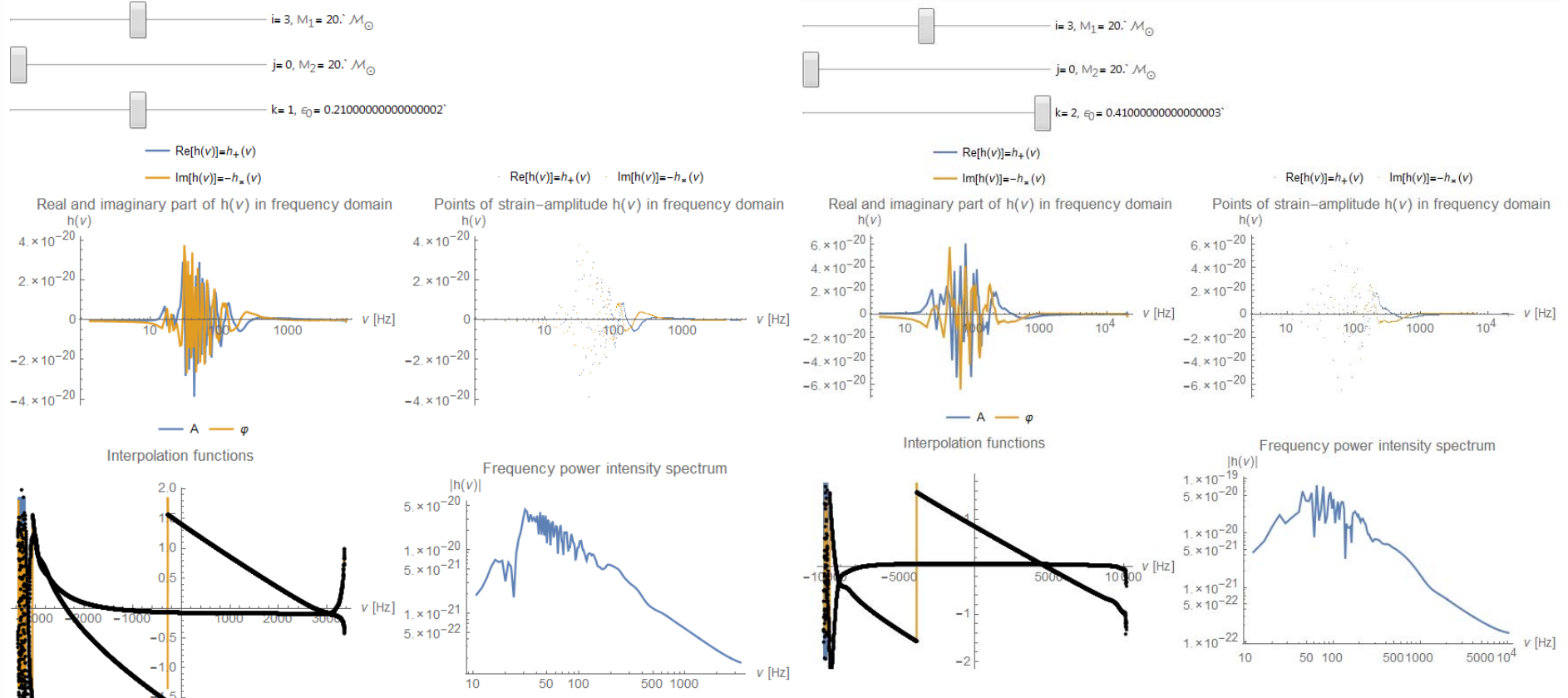
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- ③ Store the amplitude (original and normalized), the phase and the interpolating functions fitted to them for each and every sample waveforms.

II. Define frequency grids separately for amplitudes and phases.

- ① Find m (100 – 200) db. sparse amplitude and frequency points.
- ② The preferred prescription to generate the frequency points keeps the error of cubic spline interpolation $I_f[\cdot]$ approximately constant in frequency.
- ③ Interpolate input amplitudes and phases onto the sparse frequency grids.

'Recipe'

Blueprint for building reduced order models

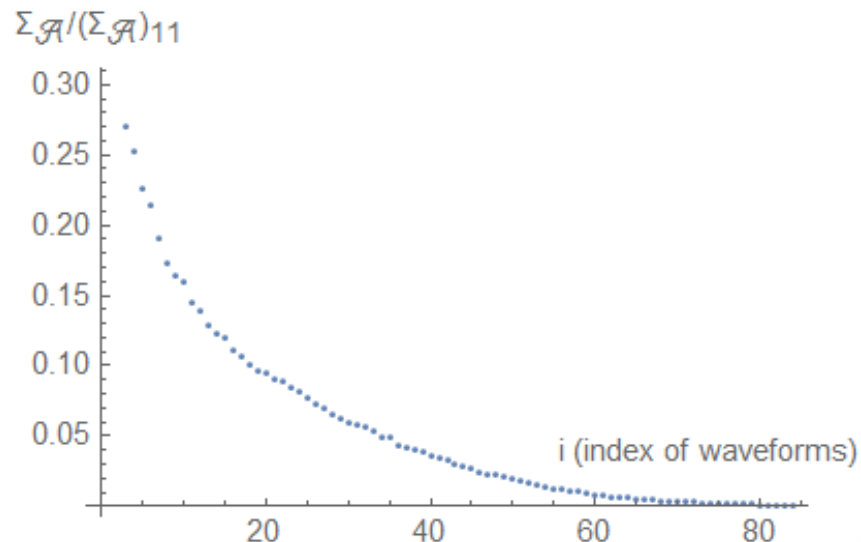
III. Compute *reduced bases* for the amplitudes and phases with the SVD:

- 1 Pack the input amplitudes and phases into the columns of matrices $T_A, T_\phi \in \mathbb{R}^{m \times n}$.
- 2 Take the SVD of the input amplitude T_A and phase T_ϕ matrices.
- 3 Obtain orthonormal amplitude B_A and phase bases B_ϕ and a list of decreasing singular values $\sigma_{A,i}, \sigma_{\phi,i}$ indicating the relative importance of the SVD-modes.

Compression: The basis of amplitude/phase is given in column vectors B_i

where $B \equiv \begin{cases} V_n \in \mathbb{R}^{m \times n}, & \text{if } m > n \\ V \in \mathbb{R}^{m \times m}, & \text{if } m \leq n \end{cases}$ and we desire a full rank approximation

\Rightarrow *thin SVD*. If $m < n$, i.e. the number m of grid points is smaller than the number n of waveforms we compute a full SVD.



'Recipe'

Blueprint for building reduced order models

IV. Interpolation over the parameter space:

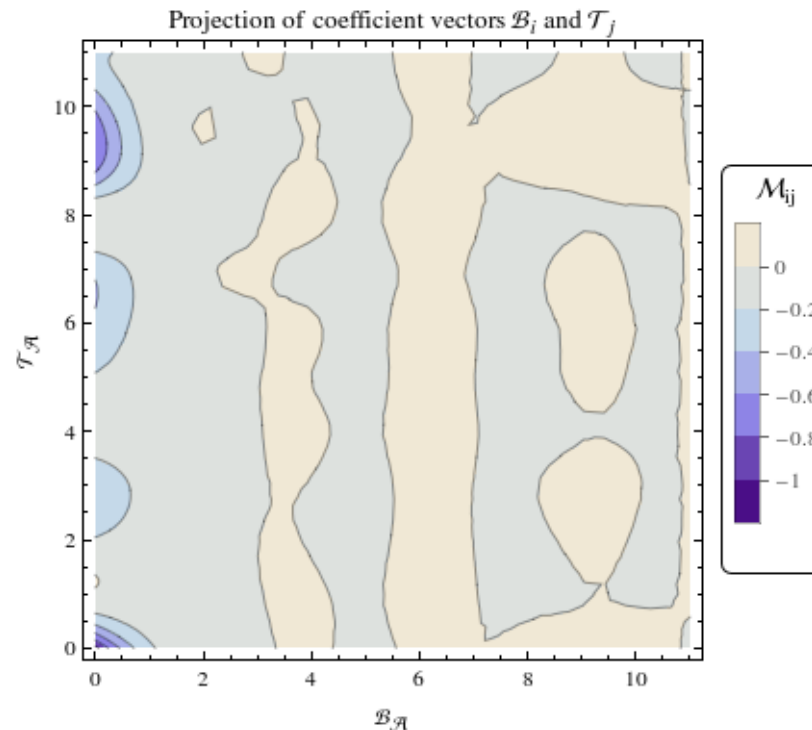
- 1 Calculate projection coefficients μ of all input waveforms $\tilde{h} \in \mathbb{R}^m$ in:

$$\mu(\tilde{h}) := B^T \tilde{h} \in \mathbb{R}^m$$

Collect projection coefficients μ in matrices M_A and M_Φ (for all input waveforms):

$$M_{ji} = \mu_j(\tau_i) = (B^T T)_{ji} \in \mathbb{R}^{k \times n}.$$

It has been proved that $M = B^T T = \Sigma U^T$ is full rank for basis $B = V$.



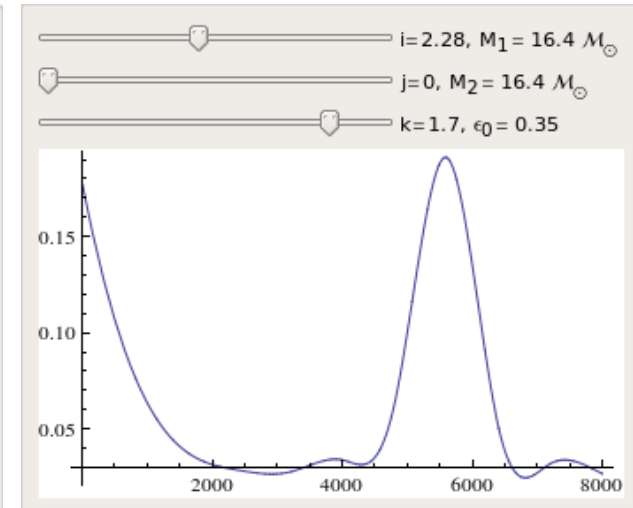
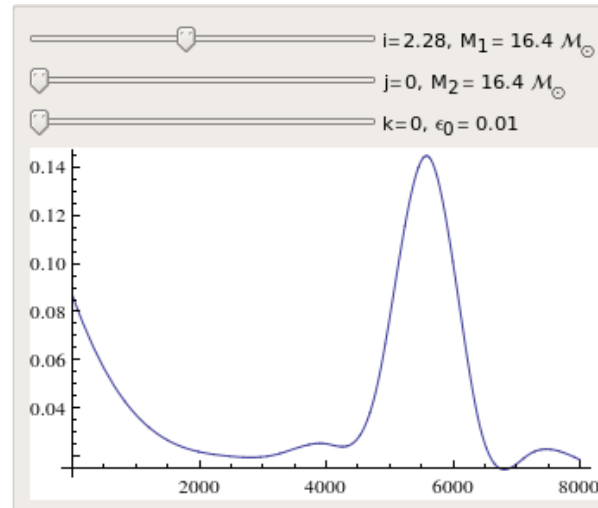
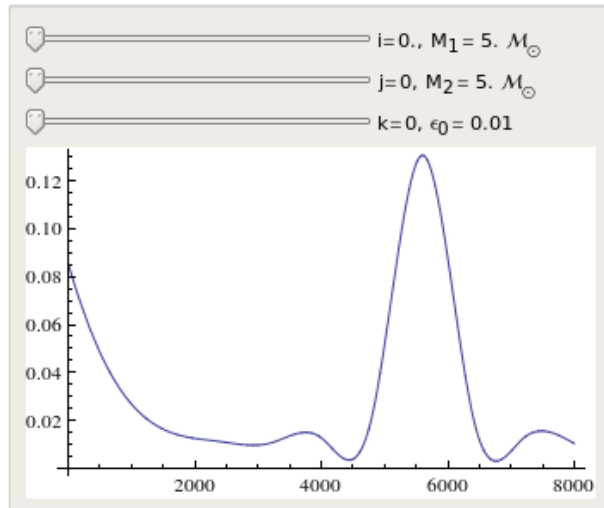
'Recipe'

Blueprint for building reduced order models

- 2 Unpack from M and interpolate the projection coefficients over the parameter space using tensor product spline interpolation $I_{\otimes}[M]$ where $I[M](M_1, M_2, \varepsilon) \in \mathbb{R}^k$.
- 3 Interpolate the amplitude normalization factors over the parameter space, i.e. restore the original order of magnitudes.

V. Assemble the frequency domain surrogate model:

$$\tilde{h}_m(q, \varepsilon; M; f) := A_0(q, \varepsilon, M) I_f [\mathcal{B}_{\mathcal{A}} \cdot I_{\otimes}[\mathcal{M}_{\mathcal{A}}](q, \varepsilon)] \exp \{i I_f [\mathcal{B}_{\Phi} \cdot I_{\otimes}[\mathcal{M}_{\Phi}](q, \varepsilon)]\}$$



Thank you for your kind attention!

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