

# Properties and benefits of using a hybrid RBF approximation for hyperviscosity stabilisation

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## General stability theory

- General stability of RBF-FD methods
- Global cardinal functions and stability

## Stabilisation methods

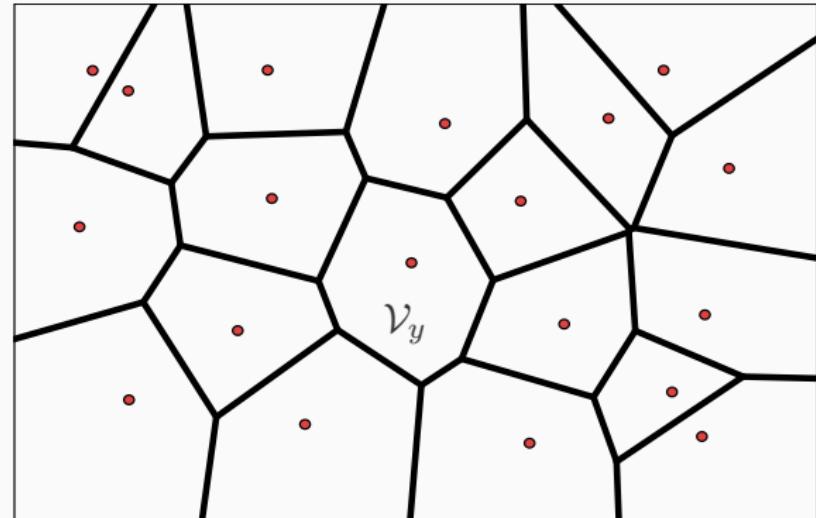
- Hyperviscosity stabilisation
- Computational complexity of the hyperviscosity operator
- Hybrid schemes for computing the operator

- Discretisation in  $Y = \{y_i\}_{i=1}^N$  evaluation/computational nodes
- Approximation  $u_h$  of the differential operator  $\mathcal{L}$  applied to  $u$

$$(\mathcal{L}u_h)(x) = \sum_{i=1}^N \mathcal{L}\Psi_i(x)u_h(y_i) \quad (1)$$

- Local interpolation with PHS  $r^k$  and monomials of order  $m$  for  $x \in \mathcal{V}_y$

$$(\mathcal{L}u_h)(x) = \sum_{i=1}^n \mathcal{L}\psi_i^{(y)}(x)u_h(y_i) \quad (2)$$



**Fig. 1:** Domain discretisation

- Global cardinal functions are piecewise functions -  $\rho(x)$  returns the closest  $y \in Y$

$$\Psi_i(x) = \begin{cases} \psi_j^{\rho(x)}(x), & x_i \in Y_{\rho(x)} \\ 0, & x_i \notin Y_{\rho(x)} \end{cases} \quad (3)$$

- We require the solution  $u_h \in \tilde{V}_h$  in the pointwise sense, but can think of  $u_h$  continuously on the piecewise function space  $V_h(\Omega)$  spanned by  $\Psi_i$ .
- Integration error - cause spurious growth under insufficient oversampling
- **Smoothing error**

- Global cardinal functions are discontinuous

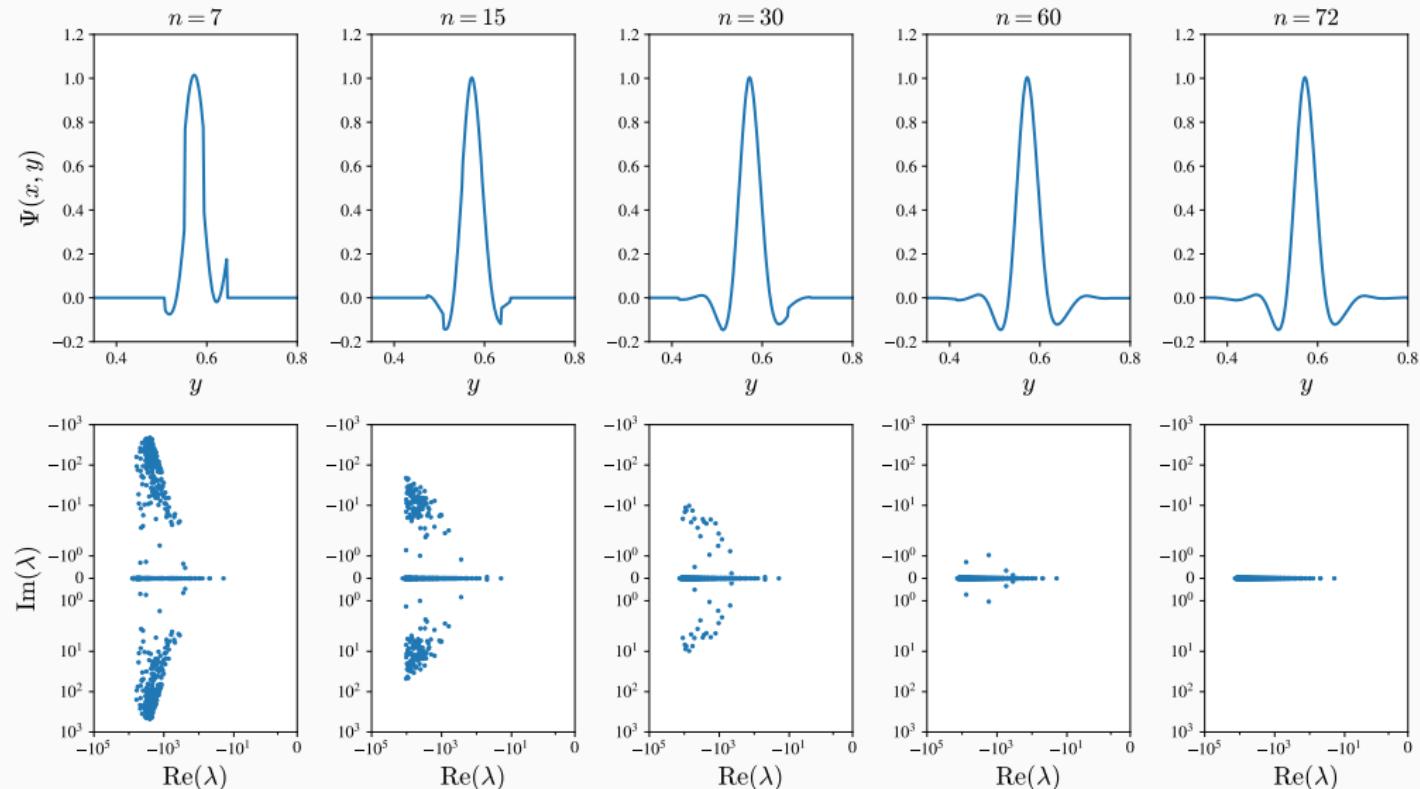
$\iff$  RBF-FD trial space  $V_h$  is a discontinuous piecewise space (*solely piecewise continuous i.e.*  $\Psi_i \in H^{k+1}(\mathcal{V}_y)$ )

$\implies$  RBF-FD differentiation matrices may have spurious eigenvalues

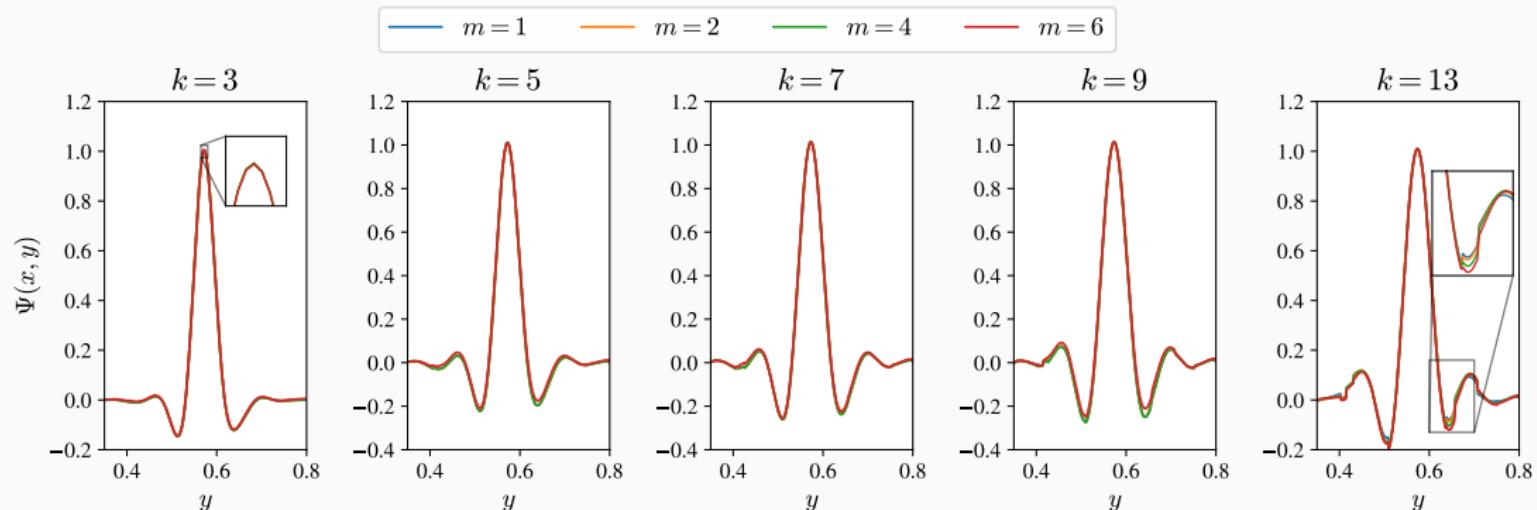


**Fig. 2:** Global cardinal function

# General stability - stencil size



**Fig. 3:** Eigenspectra and global cardinal function  $\Psi^*$  of Laplace operator  $\Delta$

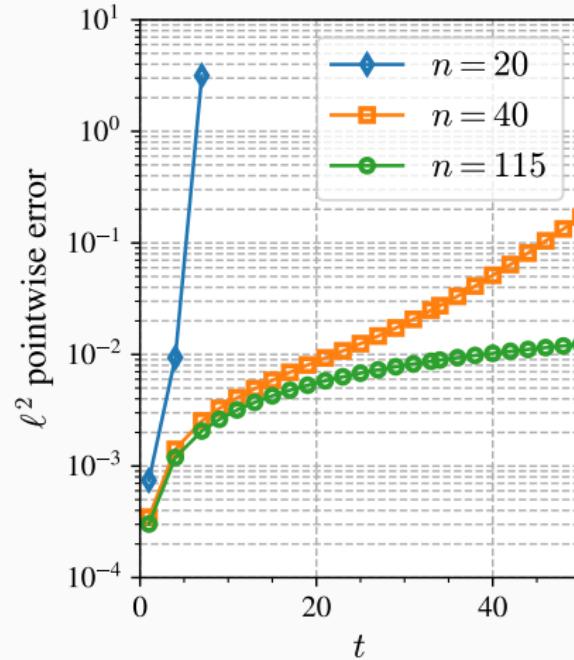
**Fig. 4:** Cardinal functions as a function of order  $k$  and  $m$ 

## Test case: Linear advection

$$\frac{\partial c}{\partial t} + u \cdot \nabla c = 0 \text{ on } \mathbb{T}^2([0, 1])$$

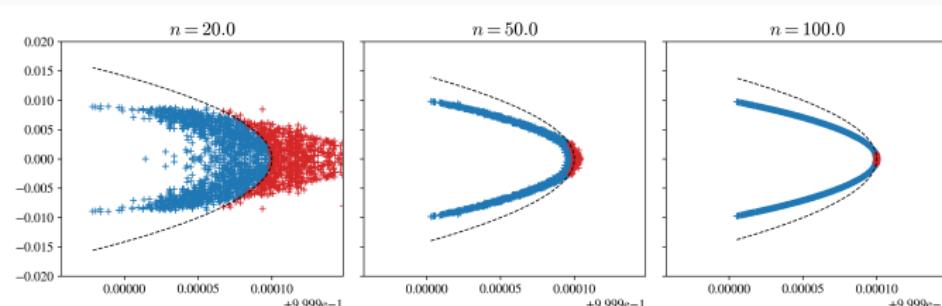
$$c(x, 0) = e^{-\frac{\|x - c\|^2}{2R^2}}$$

- Initially  $c(x, 0) \in C^\infty(\Omega)$ , however, for every  $t > 0$  we only have  $c_h(x, t) \in V_h(\Omega) \subset L^2(\Omega)$ , due to the projection onto  $V_h(\Omega)$ .
- Errors are multiplying under time stepping, particularly on the boundary of Voronoi regions, effectively also in the pointwise space.

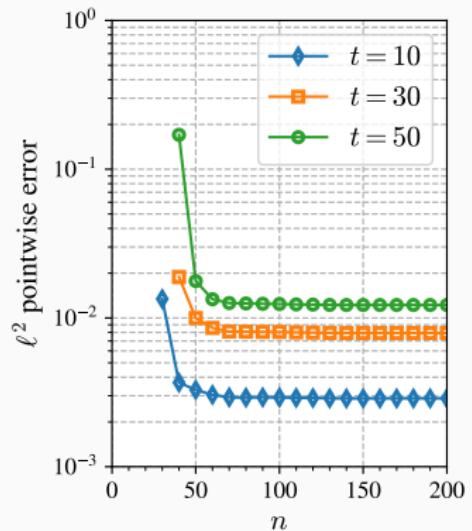
Fig. 5: Error as a function of time  $t$

# Problem?

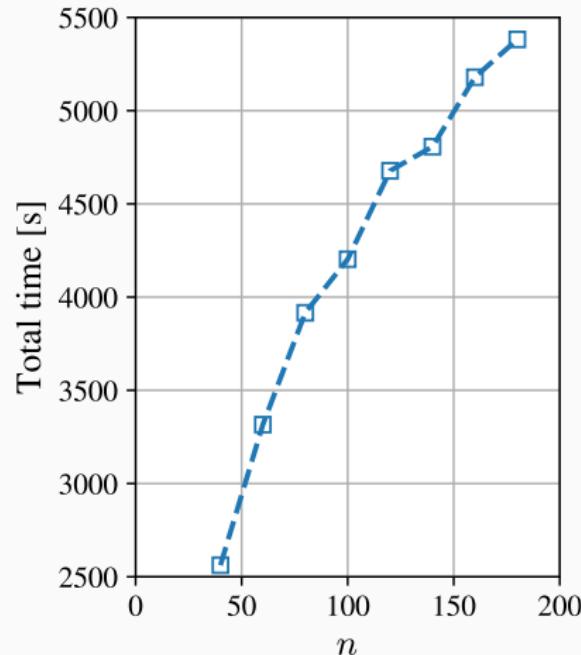
- As our  $n \rightarrow N$  the jumps in cardinal functions are becoming smaller. Moreover, we have  $V_h^{(n)} \subset H^{k+1}(\Omega)$  when  $n = N$ .



**Fig. 6:** Eigenspectrum as a function of stencil size  $n$



**Fig. 7:** Error as a function of stencil size  $n$



- **Undesirable:** Larger stencil sizes
- **Standard stabilisation:** Hyperviscosity stabilisation scheme
- **For hyperbolic equations:** Specialized jump penalty scheme

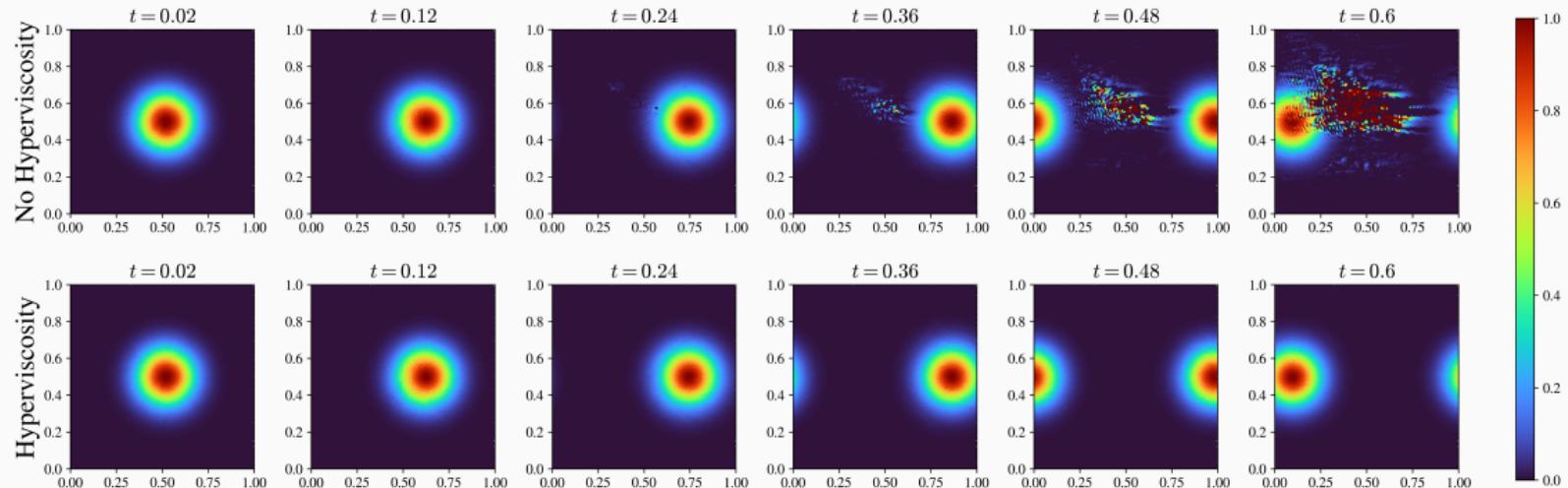
**Fig. 8:** Time for solving  $10^5$  iterations as a function of stencil size  $n$

## Example: Linear advection

$$\frac{\partial c}{\partial t} + u \cdot \nabla c = \gamma \Delta^\alpha c \quad \gamma = (-1)^{\alpha+1} 2^{-2\alpha} h^{2\alpha}$$

- To smoothen the discontinuities caused by uneven local interpolation a high-order laplacian operator  $\gamma \Delta^\alpha$  is added to the scheme
- The operator targets higher-order Fourier modes
- For first-order accuracy one requires  $m = 2\alpha$
- **Problem:** Approximation of high-order derivatives requires large stencil sizes!

# Hyperviscosity stabilisation



**Fig. 9:** Comparison of the scalar field  $c$  under stabilisation and no stabilisation.

## Different approximation schemes

$$\frac{\partial c}{\partial t} + u \cdot \nabla c = \gamma \tilde{\Delta}^\alpha c$$

- Do we really need to have a first-order accurate operator?
- The constant  $\gamma$  is  $\mathcal{O}(h^{2\alpha})$
- We do not require a high precision of the operator, rather, that it targets high-order Fourier modes and the rest is controlled with  $\gamma$
- To lower the stencil size, we can undersample the monomial term for approximating  $\tilde{\Delta}^\alpha$
- **Cons:** unintended lower-order Fourier mode damping

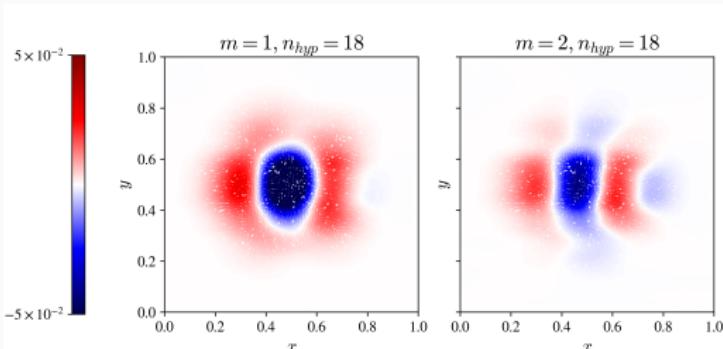
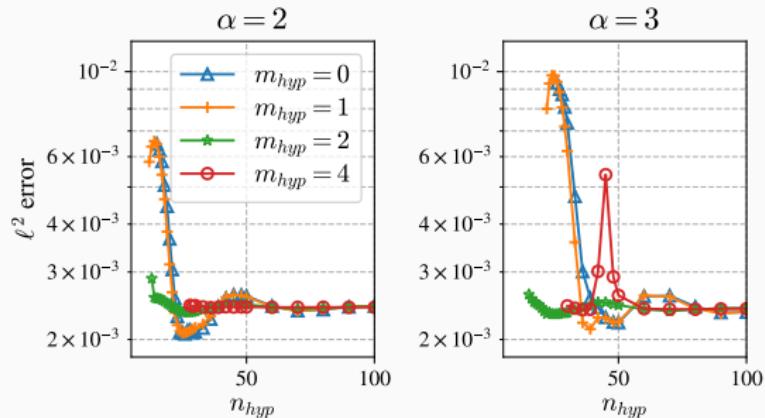
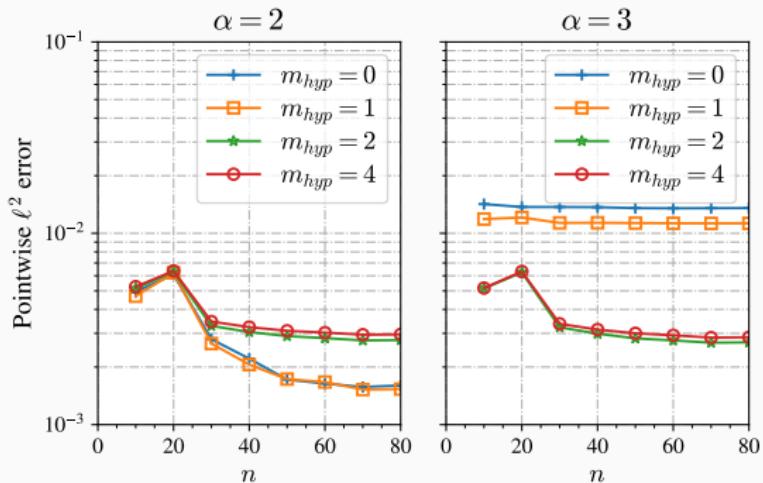


Fig. 10: Error as of hyperviscosity stencil size  $n_{hyp}$

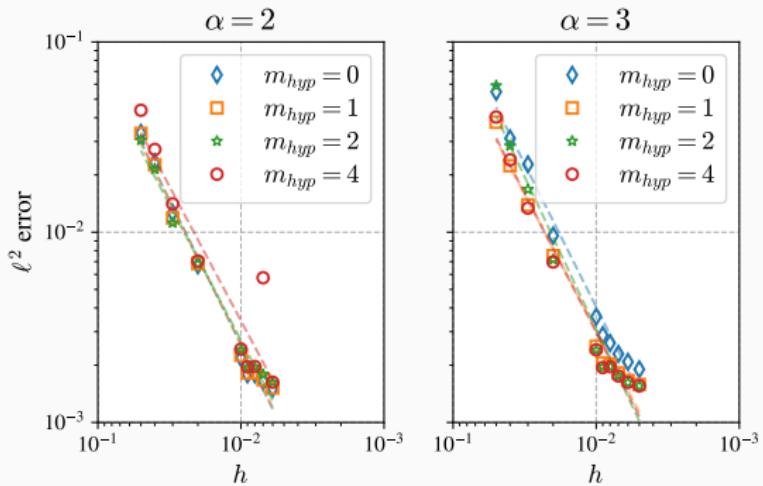
## Results: Monomial order



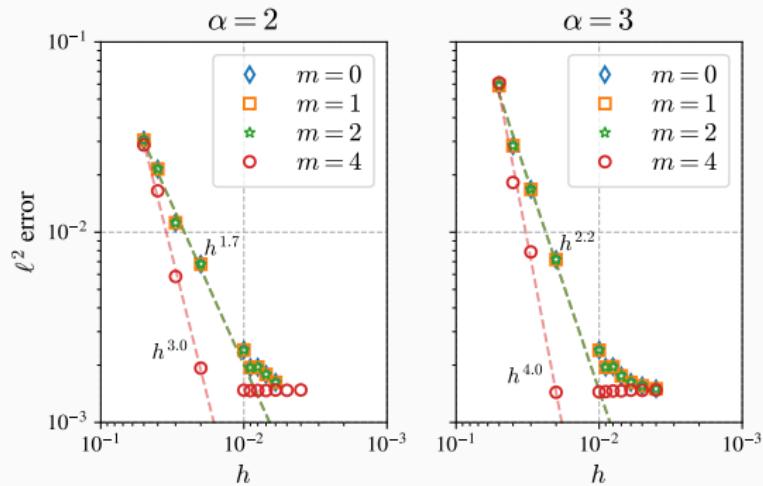
**Fig. 11:** Error as a function of stencil size  $n$  at  
 $n_{hyp} = 35$

- **Interesting:** We can violate the local interpolation system unisolvency criteria  $m = \lfloor \frac{k}{2} \rfloor - 1$  and stencil size recommendation.
- Under different severely undersampled monomials the error for approximating the operator is larger
- Different  $\gamma$  is required depending on the selection of the monomial term

# Results: Monomial order convergence



**Fig. 12:** Error as a function of  $h$  with  
 $m = 2, n_{hyp} = 35$ .



**Fig. 13:** Error as a function of  $h$  with  
 $m_{hyp} = 2, n_{hyp} = 35$

- Can we use other RBF based methods to compute the operator with a smaller stencil size?
  - Consider a local WLS approximation
    - The approach didn't work, since the shape parameter was difficult to select. The resulting approximation also caused low-order damping.

$$u_h(x) = \sum_{i=1}^m \varphi_i^{(y)}(x) u_h(y_i) \quad (4)$$

where  $m < n$  and  $\varphi_i$  are Gaussian RBFs.

### Presented:

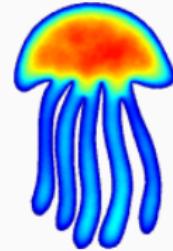
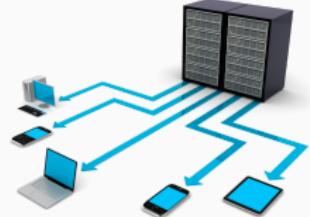
- General stability depends on the stencil size
- Stabilisation via hyperviscosity also requires large stencil size
- The monomial augmentation of the RBF-FD scheme for hyperviscosity can be undersampled

### Future work & discussion

- The constant  $\gamma$  is hard to select and depends on the approximation order
- The order of the hyperviscosity prodigiously affects the overall error, which is not expected

# Thank you for your attention!

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- When approximating the higher-order operator, there are huge round-off errors, since our weights  $w$  are  $\mathcal{O}(h^{2\alpha})$

