

# New SL(HD) interpolators

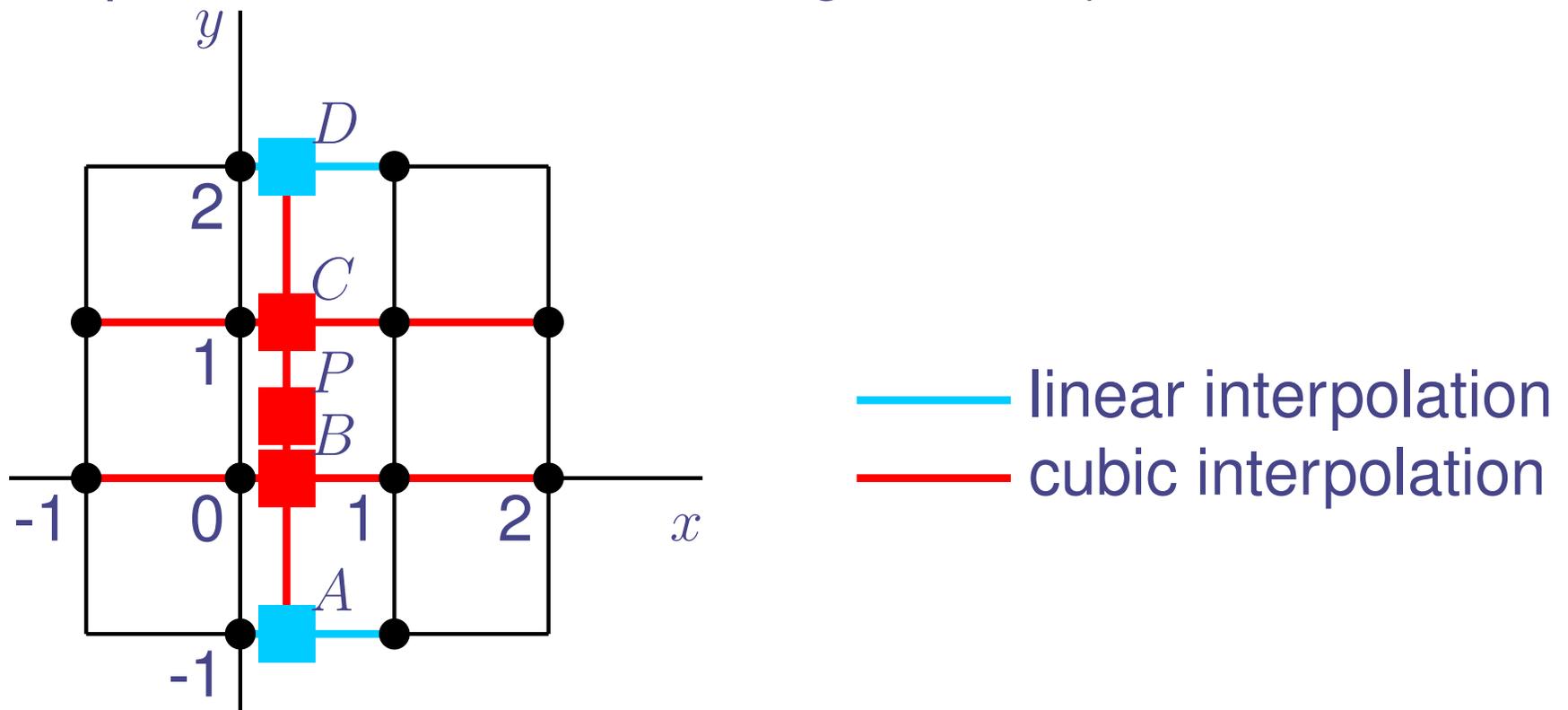
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ONPP / ČHMÚ - LACE

# High order SL interpolation before CY35T1

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- **SLHD** (Semi-Lagrangian Horizontal Diffusion) **interpolator** selectively combining Lagrangian cubic interpolation with a product of linear interpolation and smoother.
- Both previous exist also in **QM** and **QMH** alternatives.

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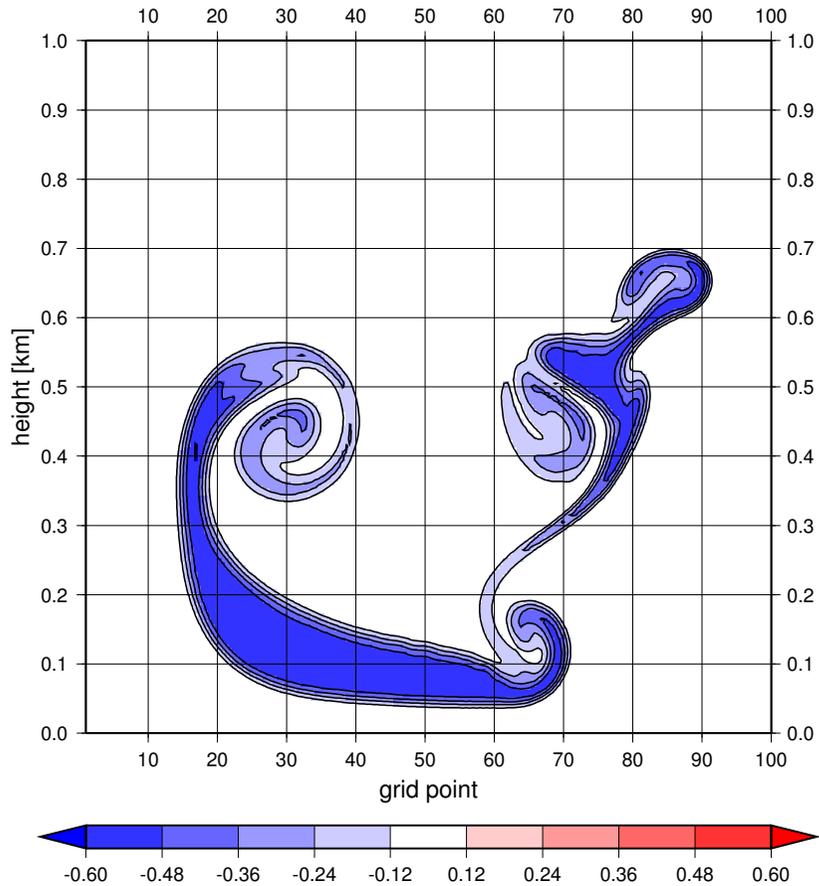
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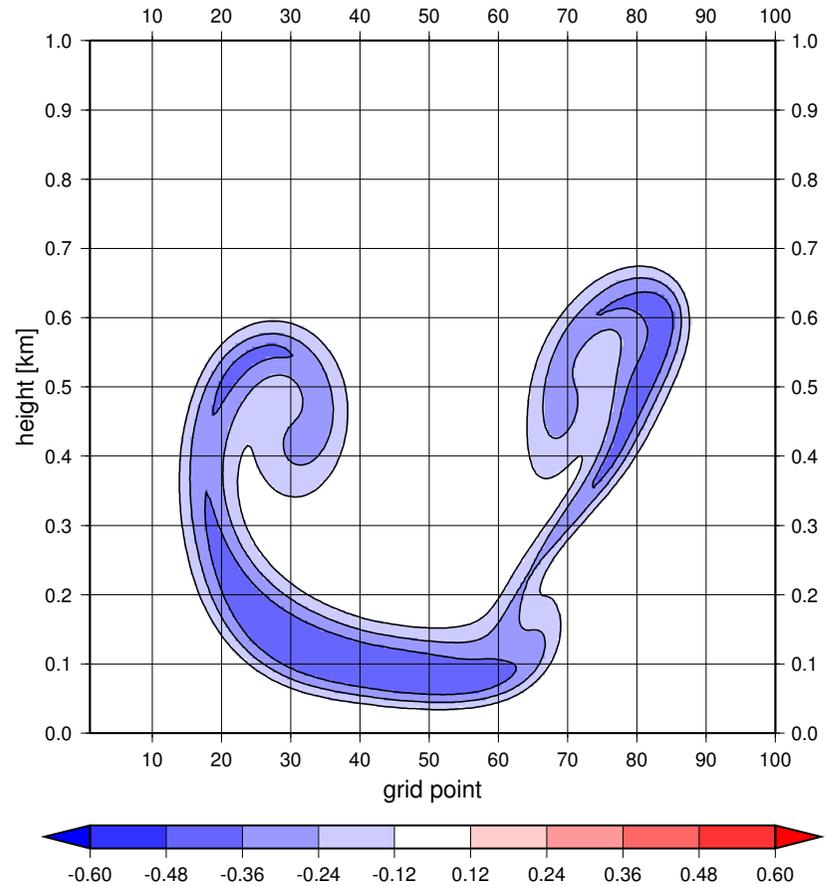
- Attempt to improve SLHD conservative properties by introduction of more accurate (less diffusive) high order interpolator.
- Cubic Lagrange polynomial was replaced with more accurate natural cubic spline (on 4 point stencil).
- It indeed reduced positive MSL pressure bias, but detrimental effect on other fields was observed.
- In order to understand what is going on, detailed examination of semi-Lagrangian interpolators followed.

# Problem with natural cubic spline

cubic Lagrange polynomial  
(reliable reference)



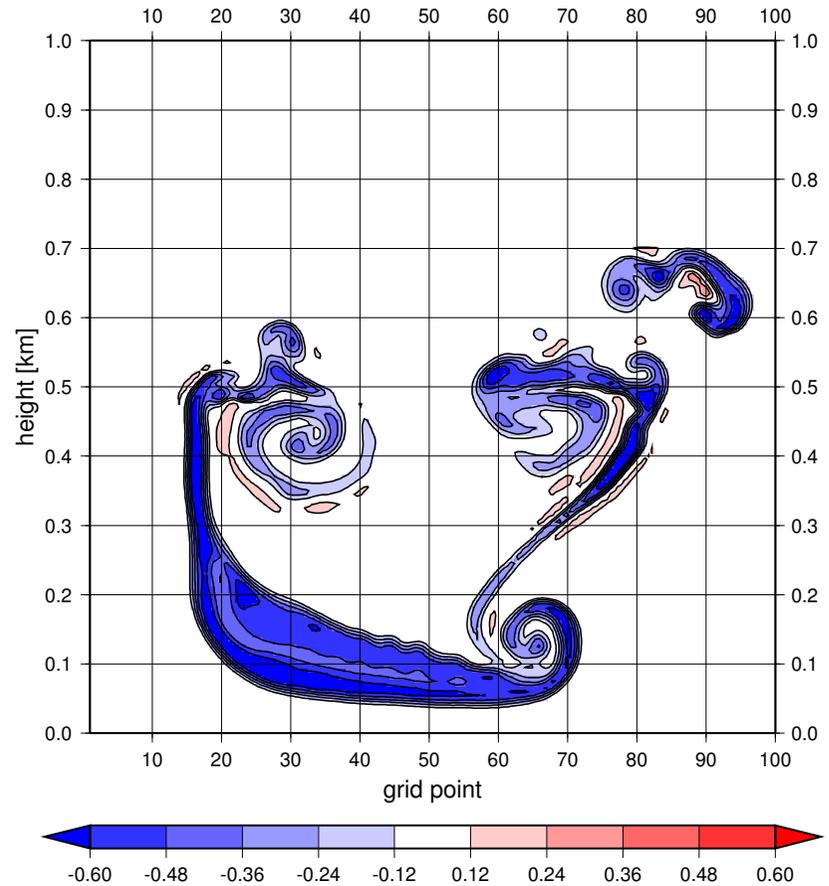
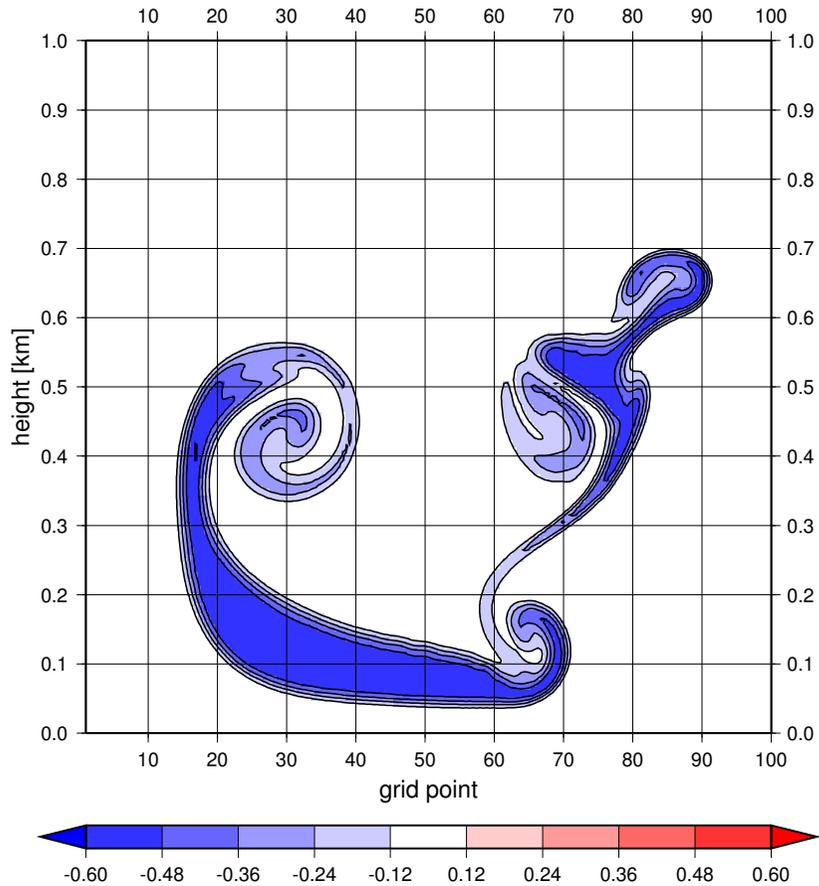
linear interpolator  
(details smoothed out)



# Problem with natural cubic spline

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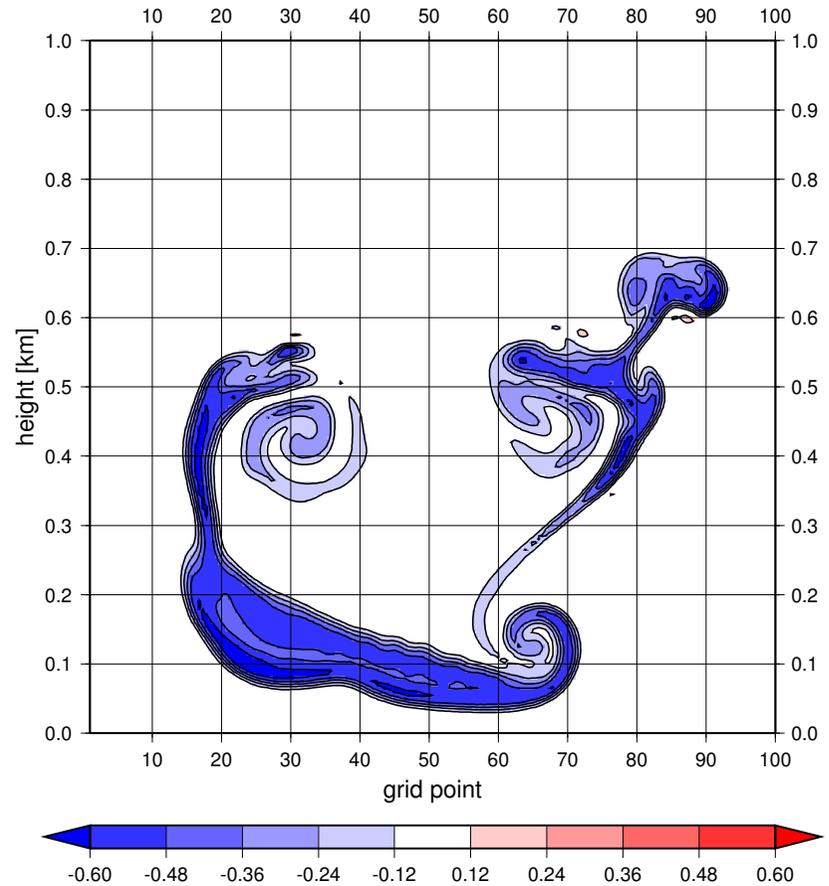
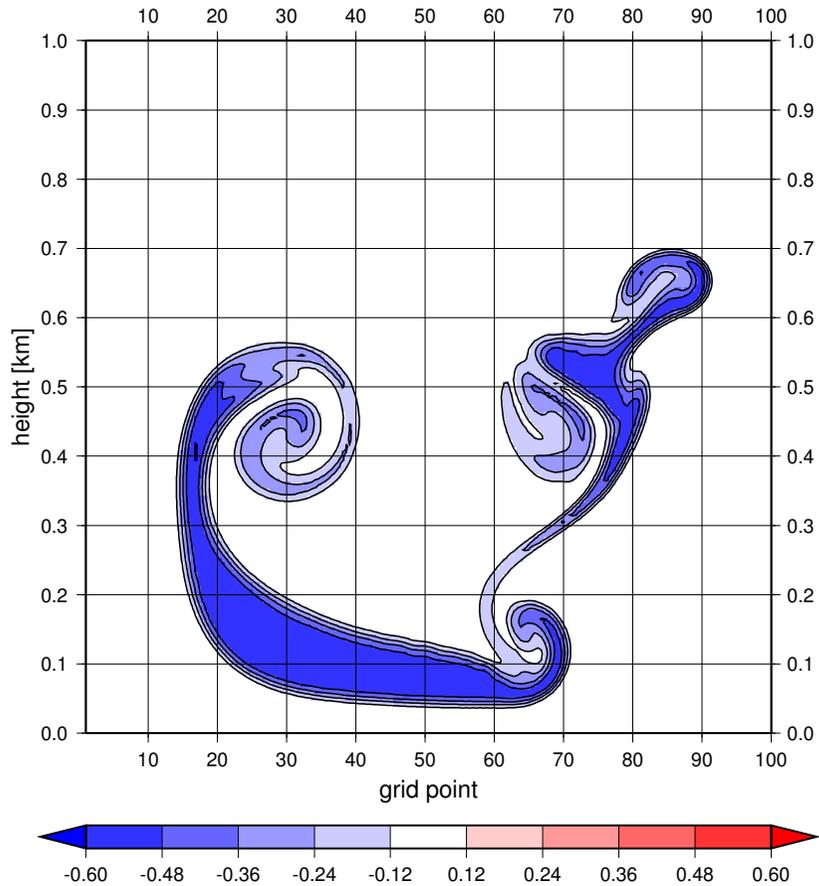
natural cubic spline  
(distortion and overshoots)



# Problem with natural cubic spline

cubic Lagrange polynomial  
(reliable reference)

natural cubic spline, QM version  
(distortion, overshoots cut off)



# Decent 4-point interpolator requirements

- linearity with respect to  $\mathbf{y} = (y_{-1}, y_0, y_1, y_2)$ :

$$F(x, \mathbf{y}) = w_{-1}(x)y_{-1} + w_0(x)y_0 + w_1(x)y_1 + w_2(x)y_2$$

- invariance with respect to horizontal mirroring:

$$F(1 - x, y_2, y_1, y_0, y_{-1}) = F(x, y_{-1}, y_0, y_1, y_2)$$

- invariance with respect to vertical shift:

$$F(x, \mathbf{y} + c) = F(x, \mathbf{y}) + c$$

- reproducing of values  $y_0, y_1$ :

$$F(0, \mathbf{y}) = y_0$$

$$F(1, \mathbf{y}) = y_1$$

- reproducing of linear function  $y = x$ :

$$F(x, -1, 0, 1, 2) = x$$

# Family of cubic 4-point interpolators

- when weights  $w_{-1}, w_0, w_1, w_2$  are constrained to polynomials of degree at most 3, an interpolator  $F$  is restricted to the form:

$$F(x, \mathbf{y}) = u(x)y_{-1} + v(x)y_0 + v(1-x)y_1 + u(1-x)y_2$$

$$u(x) = a_1x + a_2x^2 - (a_1 + a_2)x^3$$

$$v(x) = 1 + (a_2 - 1)x - (3a_1 + 4a_2)x^2 + 3(a_1 + a_2)x^3$$

$$a_1, a_2 \in \mathbb{R}$$

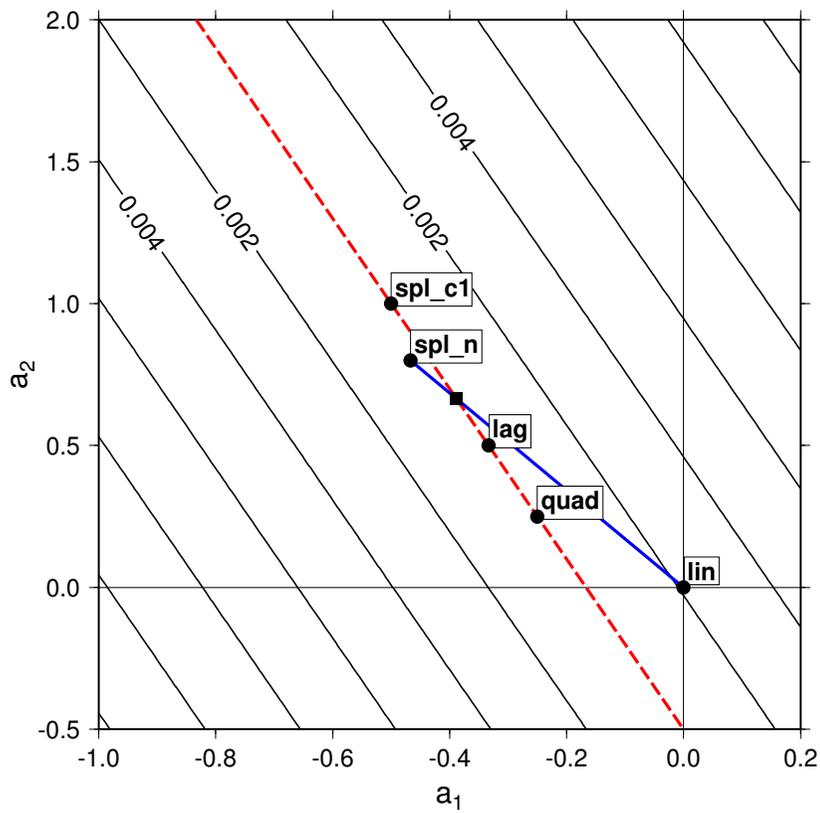
- every decent 4-point cubic interpolator can be represented by a point in the  $(a_1, a_2)$  plane
- requirement that  $F$  reproduces also quadratic function  $y = x^2$  (which implies second order accuracy) defines the straight line:

$$6a_1 + 2a_2 = -1$$

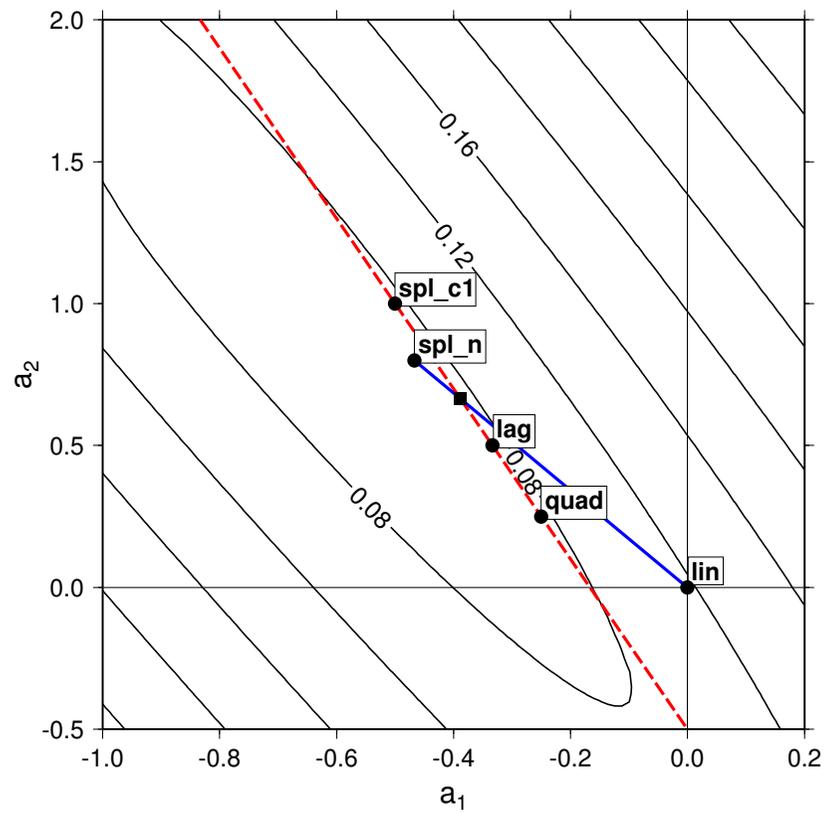
# Accuracy maps

accuracy measured by weighted MAE

weight function  $\exp(-25m/M)$



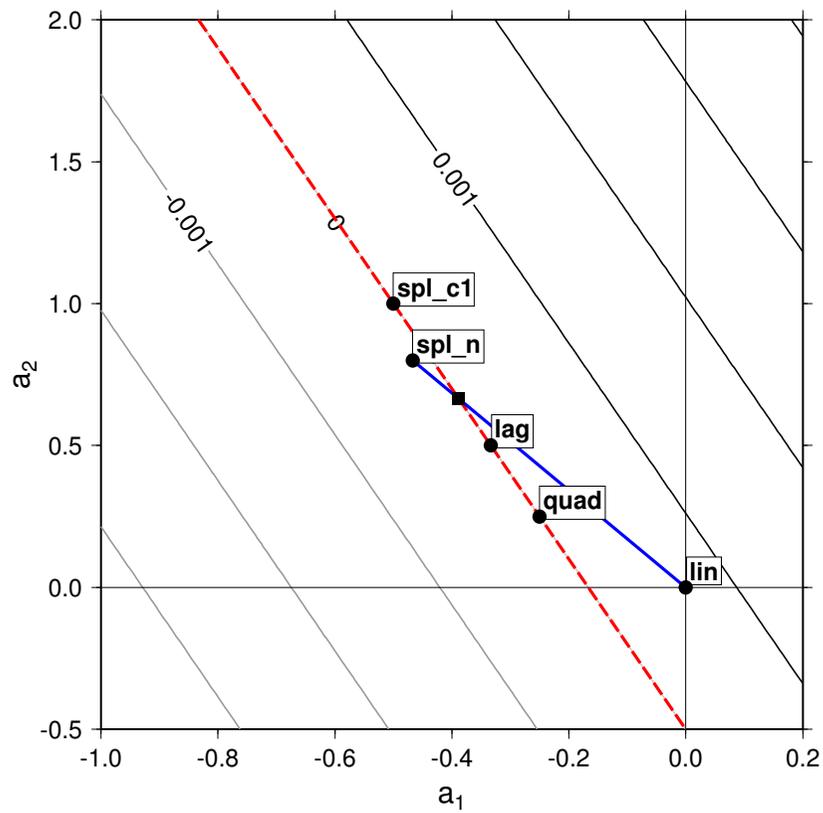
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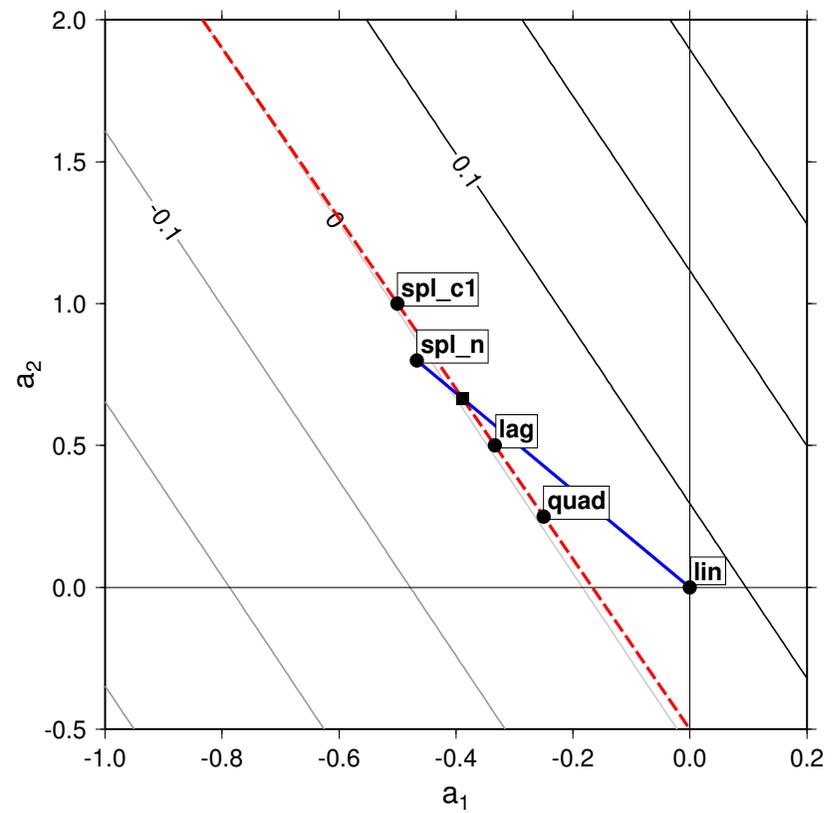
# Diffusivity maps

dimensionless damping rate

$\lambda = 100\Delta x$



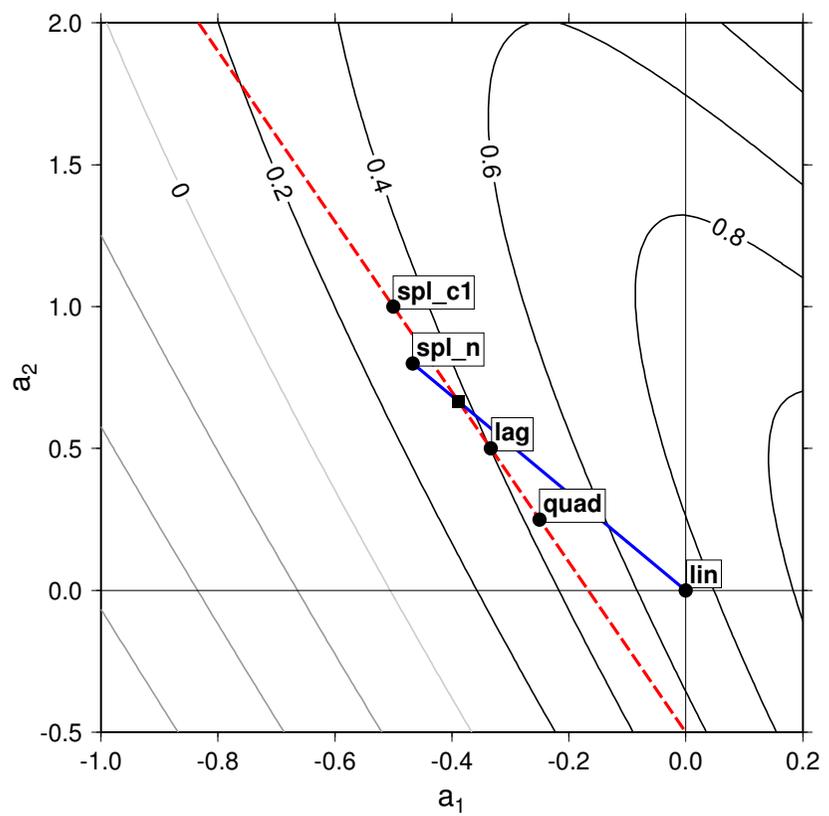
$\lambda = 10\Delta x$



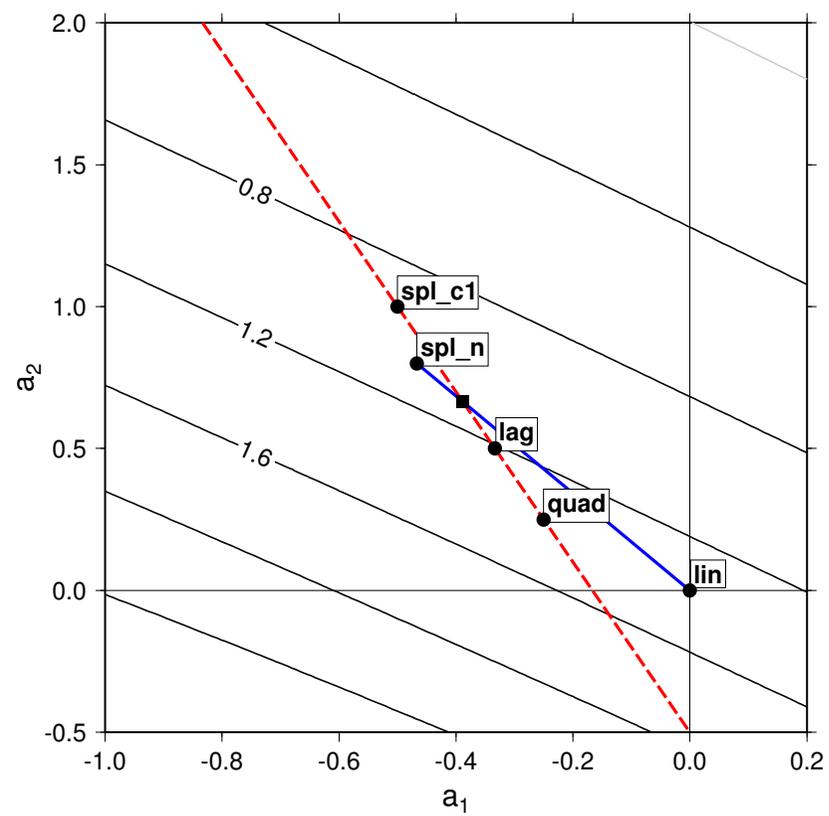
# Diffusivity maps

dimensionless damping rate

$\lambda = 3.0\Delta x$



$\lambda = 2.0\Delta x$



# Model implementation

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- Every interpolator  $F$  can be written as weighted combination of cubic Lagrange polynomial  $F_{lag}$  and quadratic interpolator  $F_{quad}$ :

$$F = (1 - \kappa)F_{lag} + \kappa F_{quad} \quad \kappa \in \mathbb{R}$$

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- Identity of some important inhabitants of  $(a_1, a_2)$  plane:

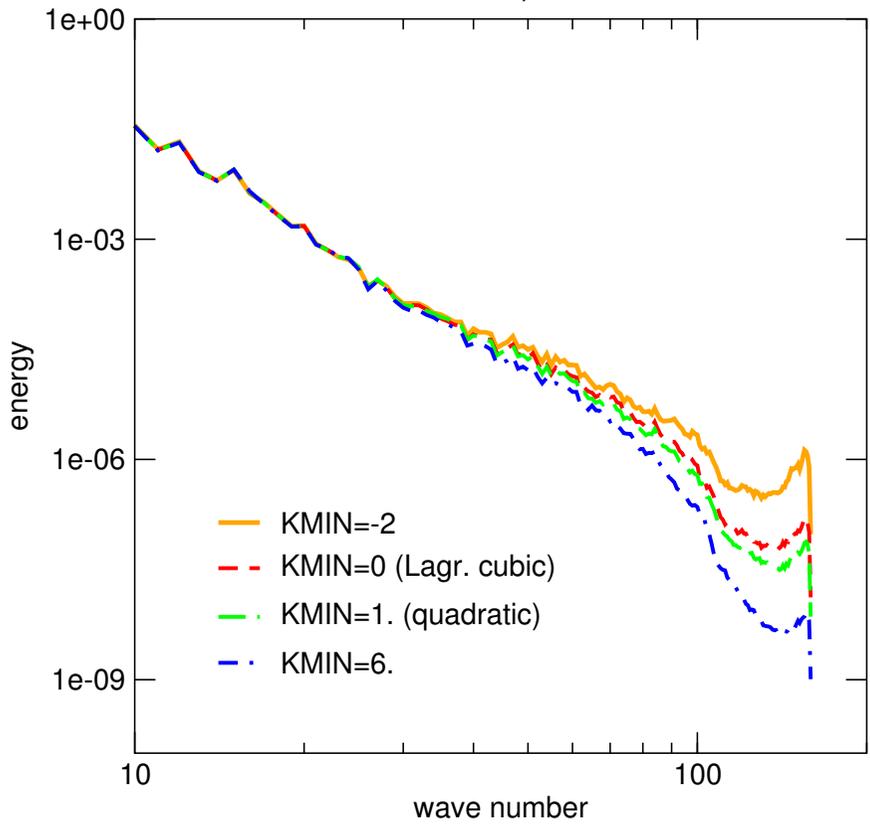
| $a_1$           | $a_2$         | name                      | order of accuracy | parameter $\kappa$ |
|-----------------|---------------|---------------------------|-------------------|--------------------|
| 0               | 0             | linear interpolator       | 1                 | —                  |
| $-\frac{1}{4}$  | $\frac{1}{4}$ | quadratic interpolator    | 2                 | 1                  |
| $-\frac{1}{3}$  | $\frac{1}{2}$ | cubic Lagrange polynomial | 3                 | 0                  |
| $-\frac{1}{2}$  | 1             | quasi-cubic spline        | 2                 | -2                 |
| $-\frac{7}{15}$ | $\frac{4}{5}$ | natural cubic spline      | 1                 | —                  |

# Impact to KE spectra

## 3h adiabatic forecast

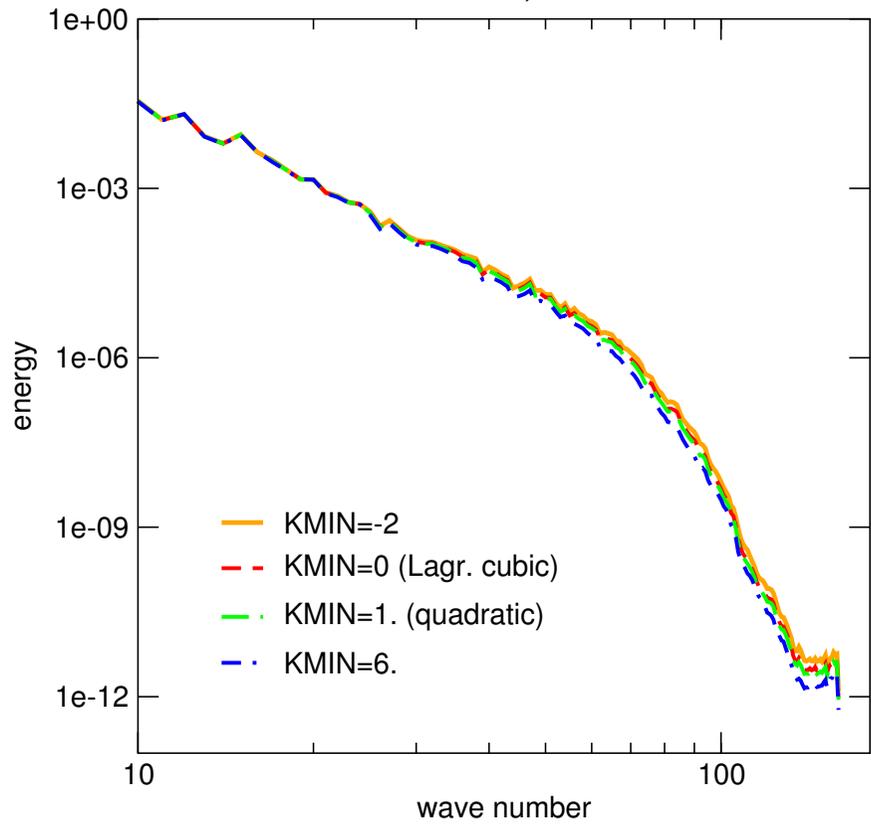
kinetic energy spectra

35th level, no HD



kinetic energy spectra

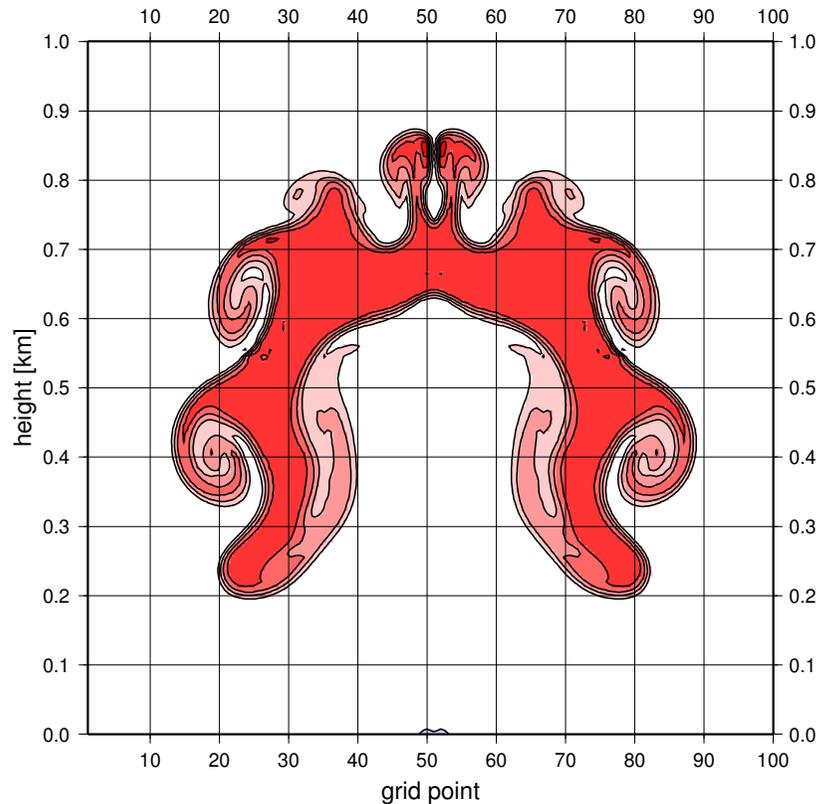
35th level, lin HD



# Damping properties of new interpolators (1)

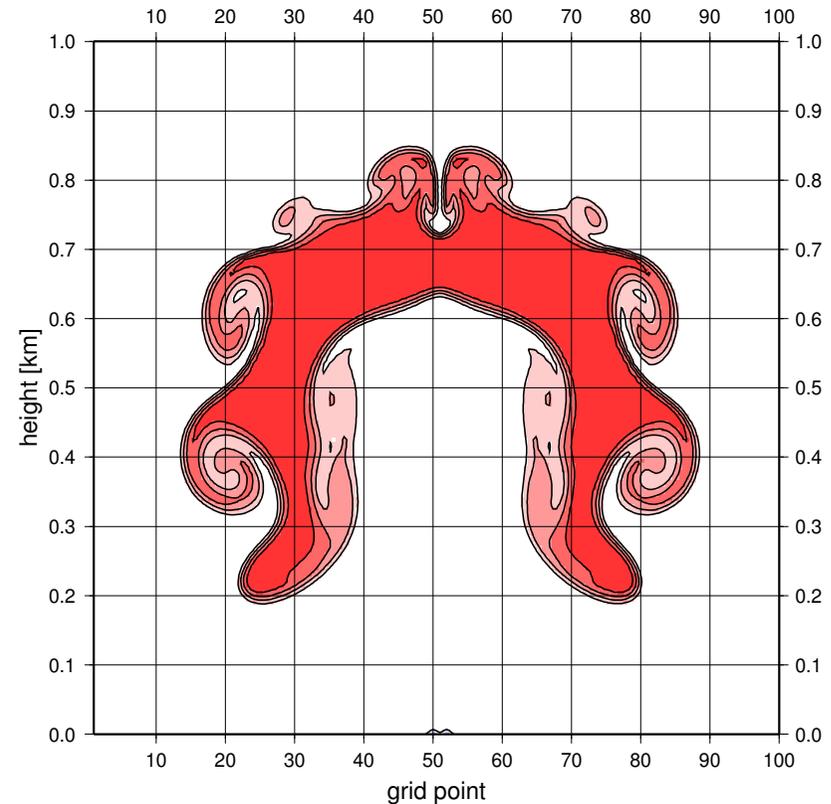
quasi-cubic spline

$$(\kappa = -2)$$



cubic Lagrange polynomial

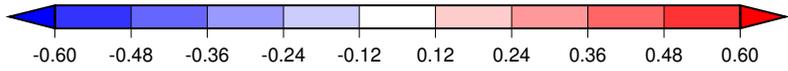
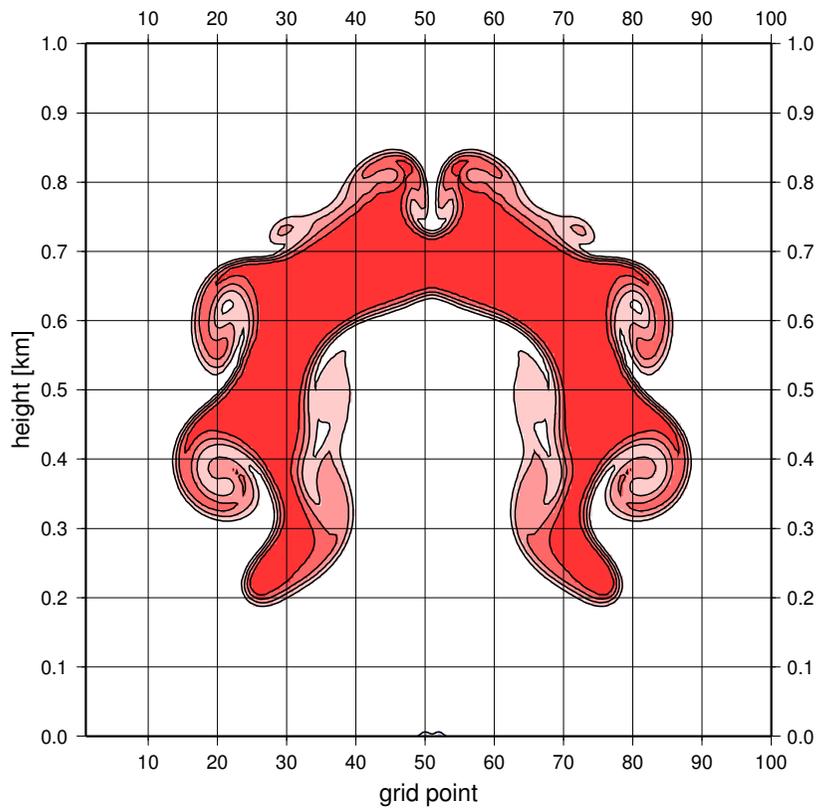
$$(\kappa = 0)$$



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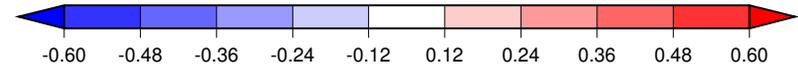
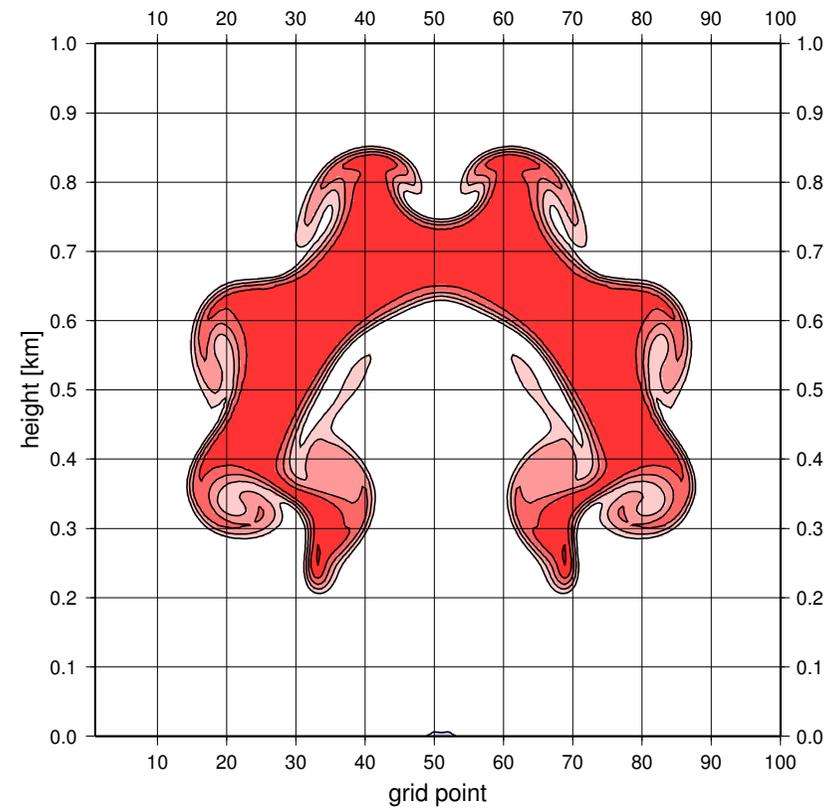
quadratic interpolator

( $\kappa = 1$ )



strongly diffusive second order

accurate interpolator ( $\kappa = 6$ )



# SLHD bonus – Laplacian smoother

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- Finite difference formula for second order derivative at inner nodes and prescribing it to be zero at outer nodes gives:

$$S(\mathbf{y}) = \begin{pmatrix} 1 & 0 & 0 & 0 \\ \varepsilon & 1 - 2\varepsilon & \varepsilon & 0 \\ 0 & \varepsilon & 1 - 2\varepsilon & \varepsilon \\ 0 & 0 & 0 & 1 \end{pmatrix} \cdot \begin{pmatrix} y_{-1} \\ y_0 \\ y_1 \\ y_2 \end{pmatrix}$$

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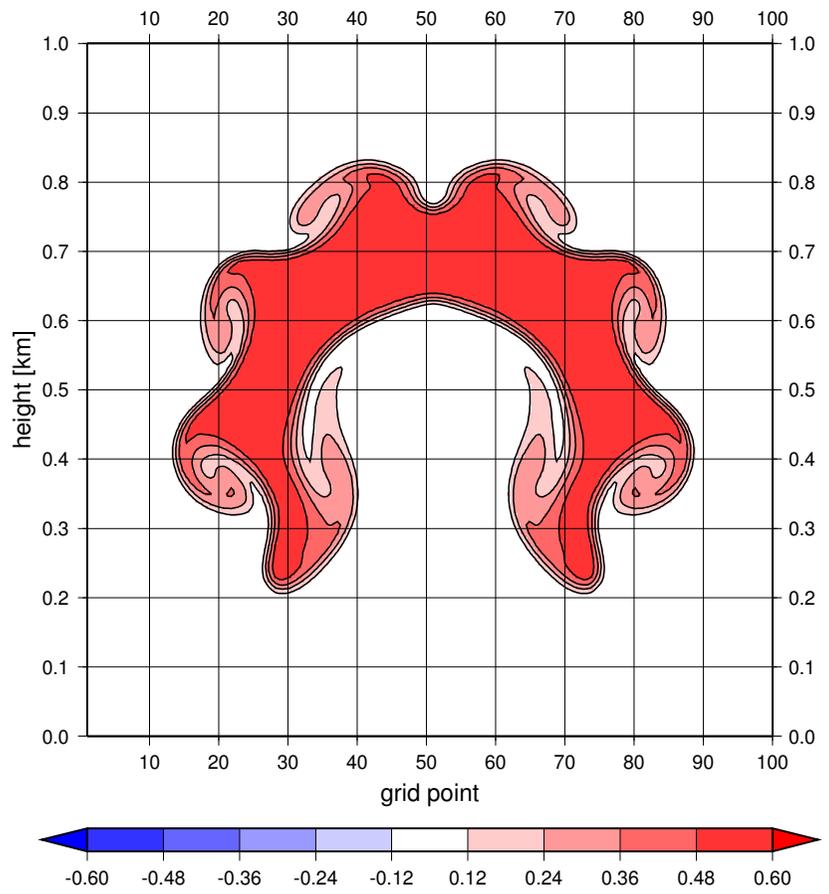
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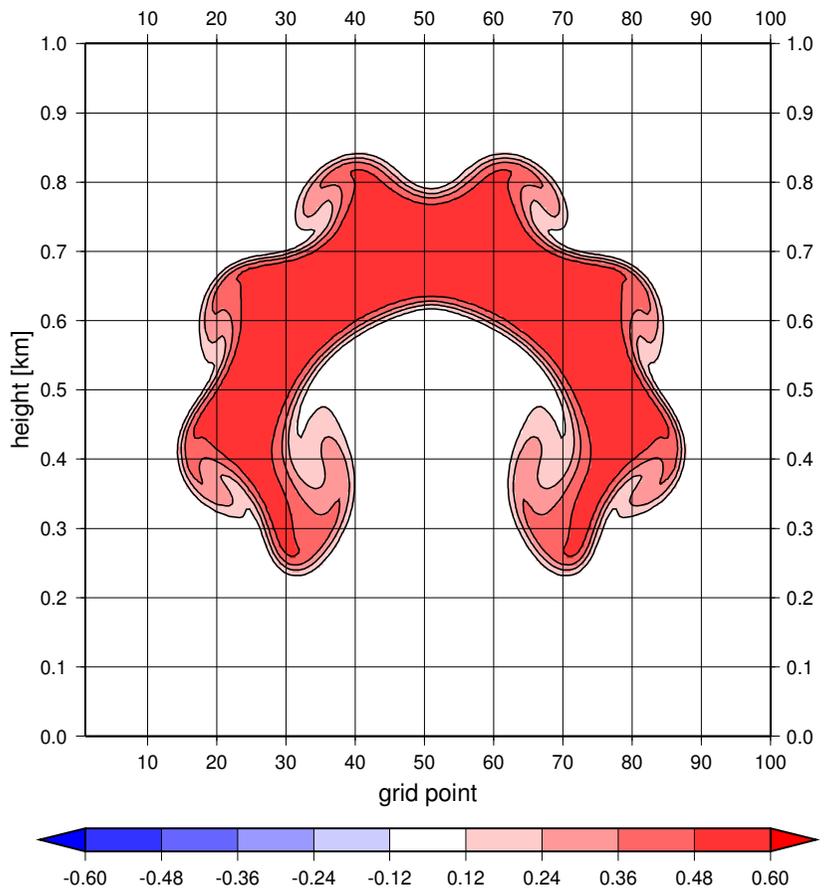
- Explicitly treated diffusion  $\Rightarrow$  safety limit on smoother strength  $\varepsilon$ . Model implementation distinguishes between  $\varepsilon_H$  and  $\varepsilon_V$ .

# Damping properties of new interpolators (2)

cubic Lagr. polynomial with smoother, ( $\kappa = 0, \varepsilon = 0.01$ )

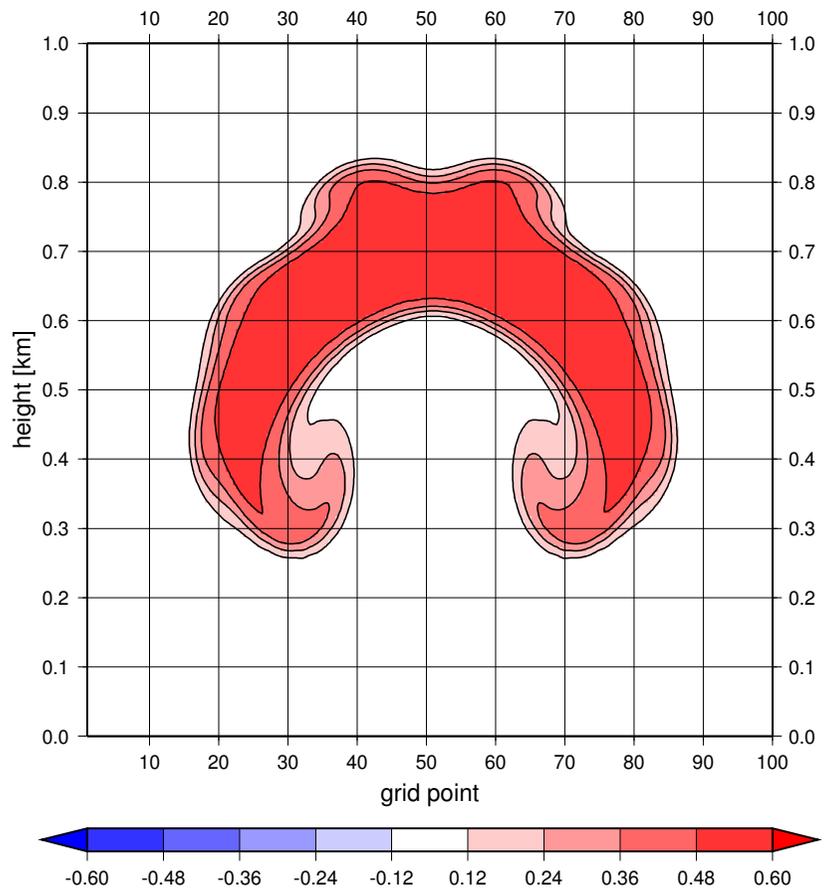


cubic Lagr. polynomial with smoother, ( $\kappa = 0, \varepsilon = 0.02$ )

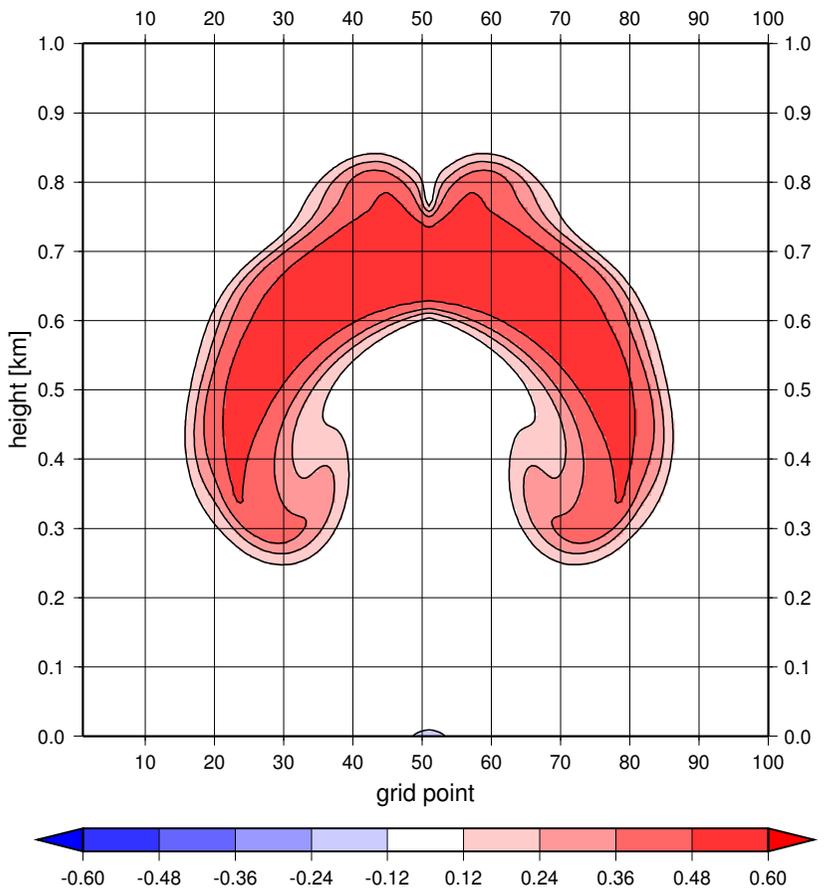


# Damping properties of new interpolators (2)

cubic Lagr. polynomial with smoother, ( $\kappa = 0, \varepsilon = 0.04$ )



linear interpolator



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- Lagrangian cubic (default, `SLHDKMIN=0.`)
- General second order accurate interpolation (`SLHDKMIN ∈ ⟨−2., 6.⟩`)
- Two interpolator sets, controlled by `SLHDKMIN` and `SLHDKMAX` (`SLHDKMIN ≤ SLHDKMAX`),
  - `LSLHD_STATIC=.true.`
  - Prognostic quantities belonging to the “`SLHDKMAX`” group are selected by activating appropriate `LSLHD` key.
  - Additionally, for the second group the Laplacian smoother can be activated. (Specific case: `SLHDKMIN = SLHDKMAX!`)

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- Emulation of the “old” SLHD within the new data-flow.  
(LSLHD\_OLD=.true., SLHDKMIN, SLHDEPSH, SLHDEPSV;  
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**accurate** (SLHDKMIN  $\leq$  SLHDKMAX, SLHDEPSH,  
SLHDEPSV)
- Laplacian smoother only as the specific case when  
SLHDKMIN = SLHDKMAX. (Beware of the stability for  
SLHDEPSV!)

# Namelist parameters

## Keys

- LSLHD\_[x] - Keys to activate SLHD for GMV [x]
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## Tuning parameters

- SLHDKMIN - property of the basic interpolator  
(Optimum seems to be around 0.!) **(Optimum seems to be around 0.!)**
- SLHDKMAX - property of the maximum diffusive limit  
(Optimum between 6.-10.)
- SLHDEPSH - horizontal Laplacian smoother
- SLHDEPSV - vertical Laplacian smoother

# Experience from the real atmosphere

Based on ALADIN/CE (LACE domain,  $\Delta x=9$  km) simulations

- Decreasing of `SLHDKMIN` leads to:
  - general improvement of wind speed and MSL pressure (conservation of mass)
  - other dynamics variables are improved in upper troposphere (above 500 hPa) and above 100 hPa
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  - detrimental effects in PBL and lower stratosphere
- Decreased `SLHDKMIN` needs to be compensated by increased **horizontal and vertical diffusion!**
- `SLHDEPSH` significantly influences KE spectra, weak effect to model scores; `SLHDEPSV` nearly no effect to KE spectra, strong impact to scores and mass conservation

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- Natural entry point to real 3D turbulence.