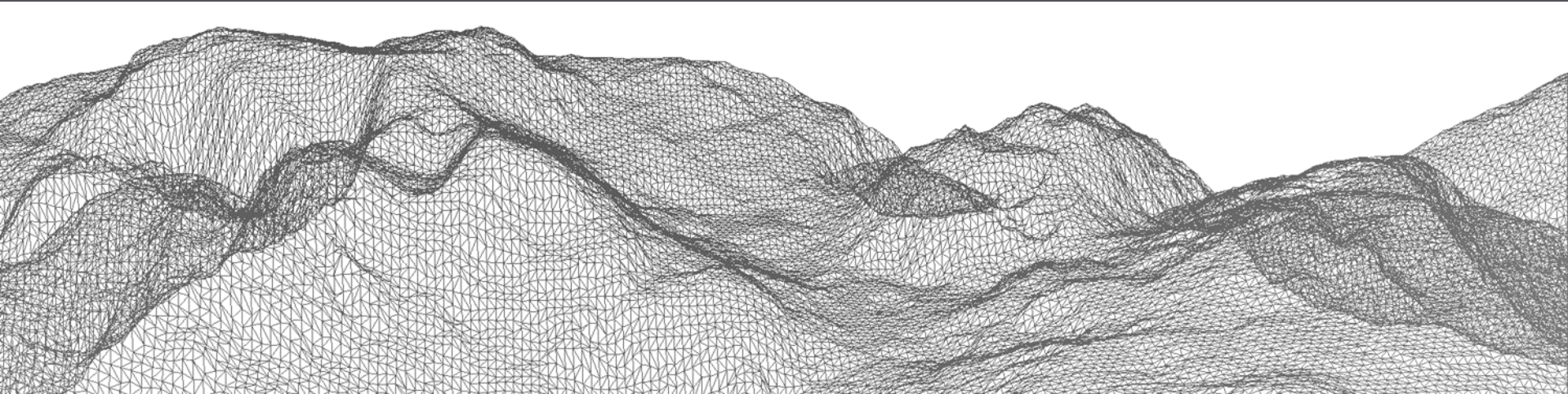


ADVECTION OVER STEEP SLOPES



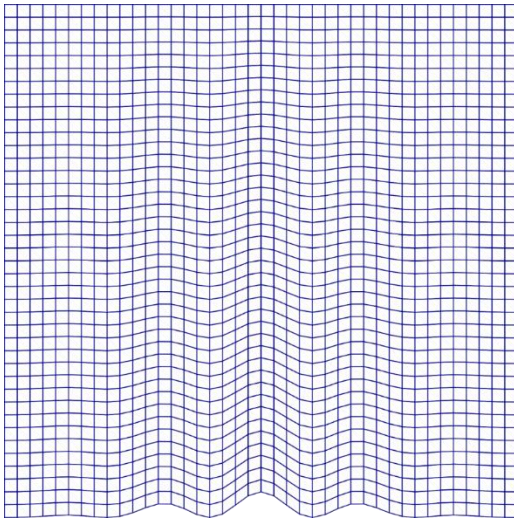
James Shaw @hertzsprung

Hilary Weller @hilaryweller0

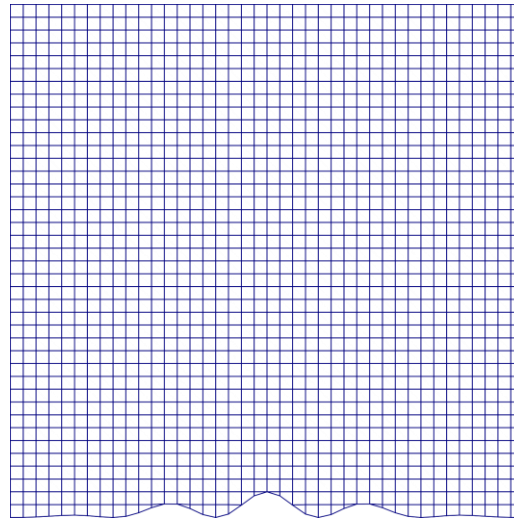
John Methven

Terry Davies

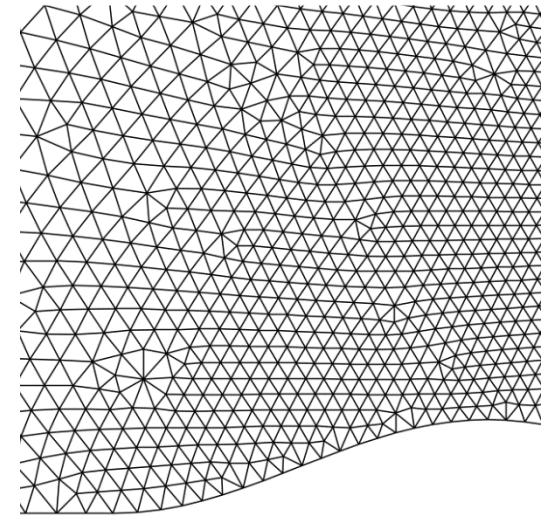
WAYS TO REPRESENT TERRAIN



Terrain following layers



Cut cells

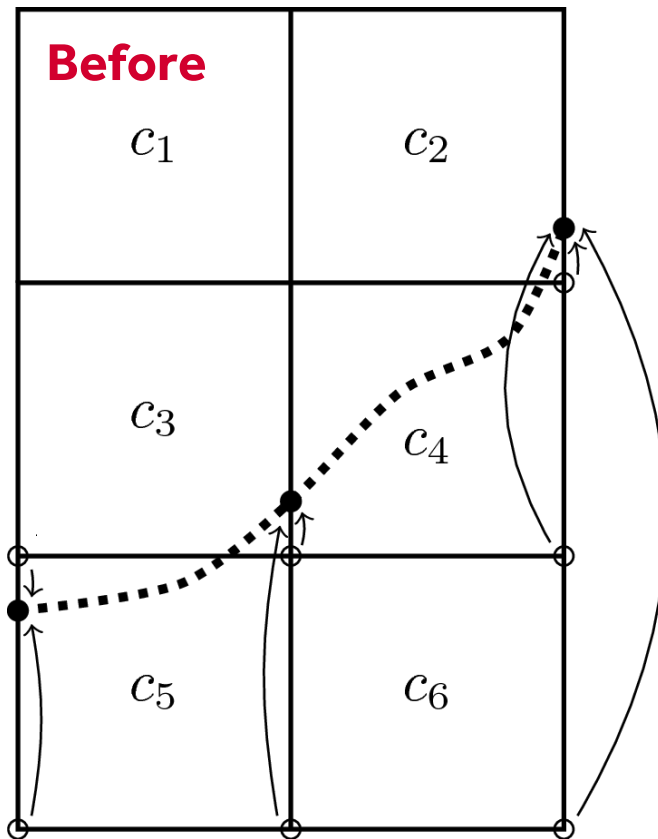


Unstructured

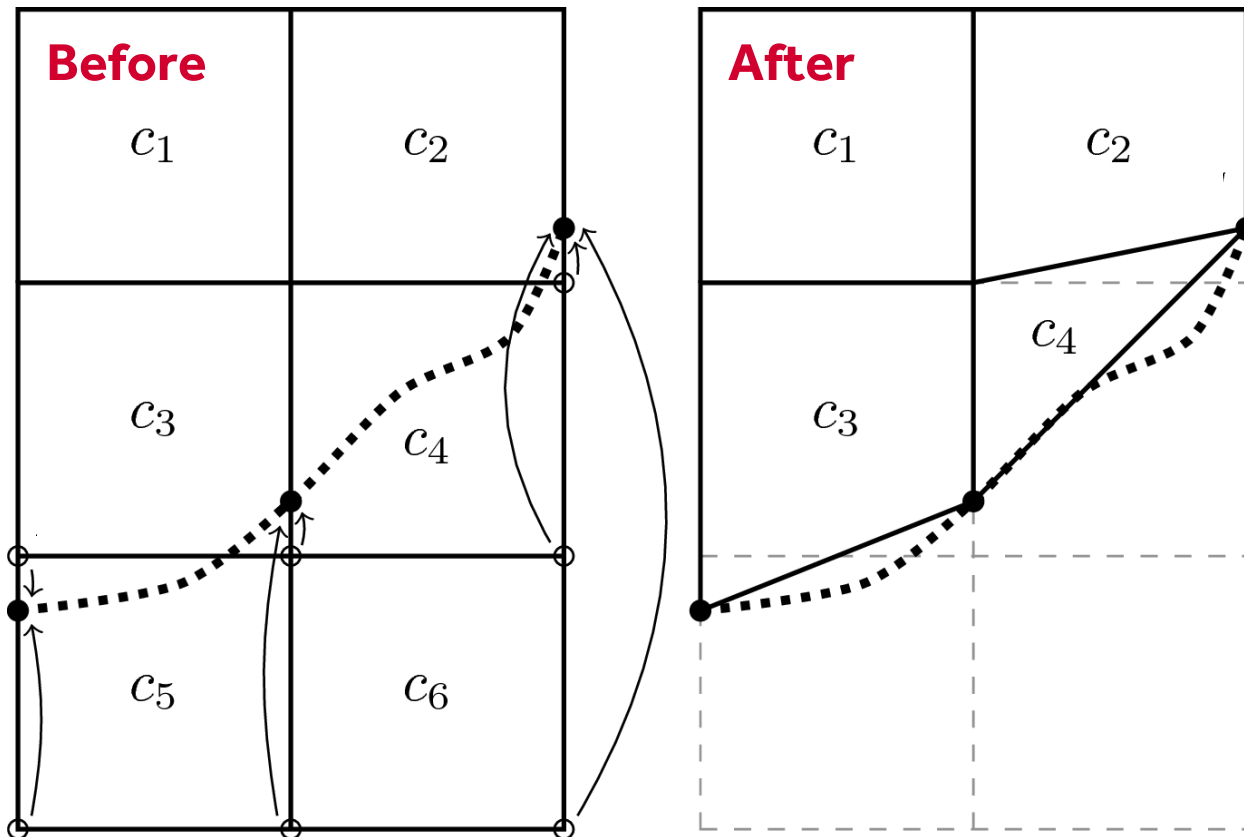
Source: Smolarkiewicz & Szmelter

http://ral.ucar.edu/hap/events/orographic-precip/images/2wed/am/day2-Wed_am_3-Orogunmesh2.ppt

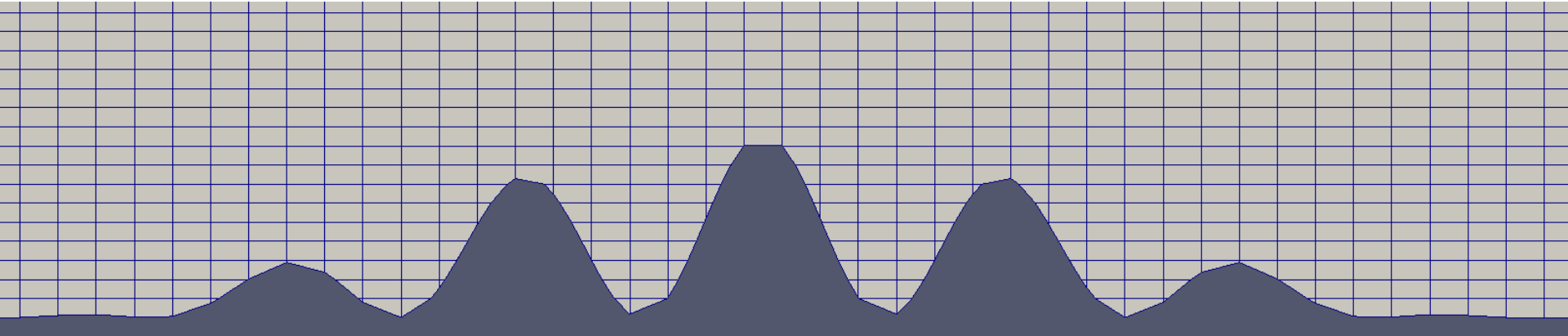
SLANTED CELLS



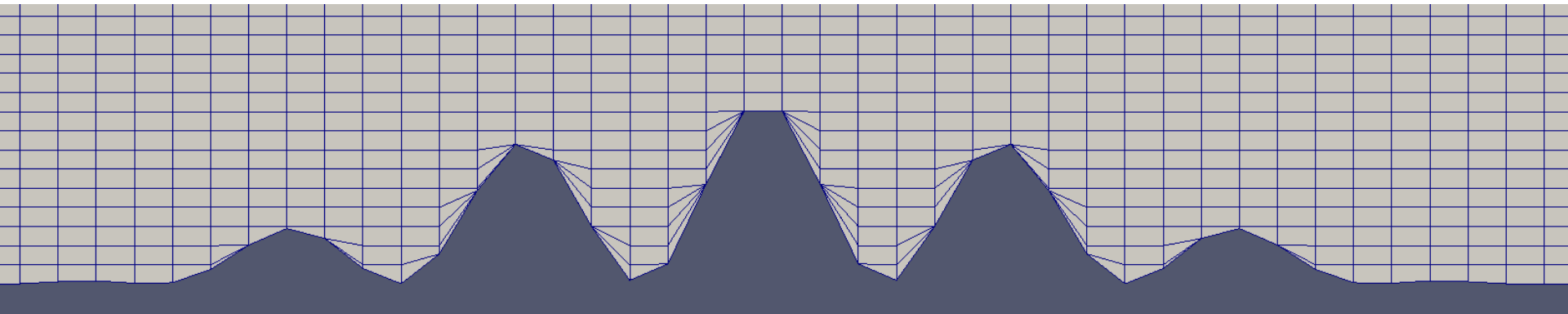
SLANTED CELLS



CUT CELLS



SLANTED CELLS



Source: Shaw & Weller 2016, MWR, [dx.doi.org/10.1175/MWR-D-15-0226.1](https://doi.org/10.1175/MWR-D-15-0226.1)

SLANTED CELLS

- Easy to construct
- Avoid arbitrarily small cells
- Generalise to 3D with arbitrary horizontal meshes

CUBICFIT: AN ADVECTION SCHEME FOR STEEP SLOPES

CUBICFIT: AN ADVECTION SCHEME FOR STEEP SLOPES

- Finite volume
- Eulerian
- Multidimensional cubic approximation
- Method-of-lines with Runge-Kutta timestepping

- No flux correction
- Not monotonic

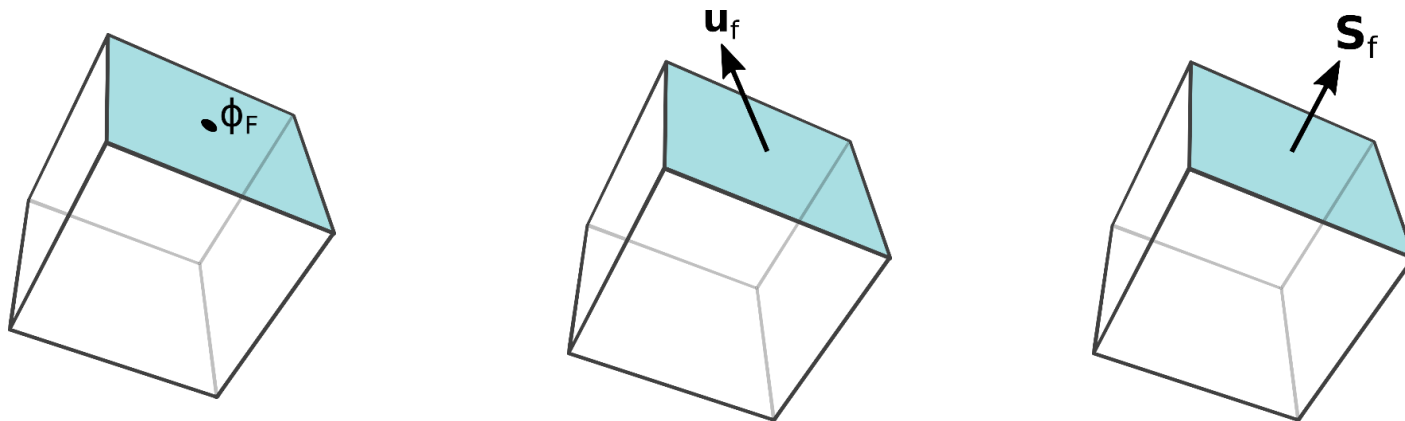
FINITE VOLUME DISCRETISATION

$$\frac{\partial \phi}{\partial t} + \nabla \cdot (\mathbf{u}\phi) = 0$$

FINITE VOLUME DISCRETISATION

$$\frac{\partial \phi}{\partial t} + \nabla \cdot (\mathbf{u}\phi) = 0$$

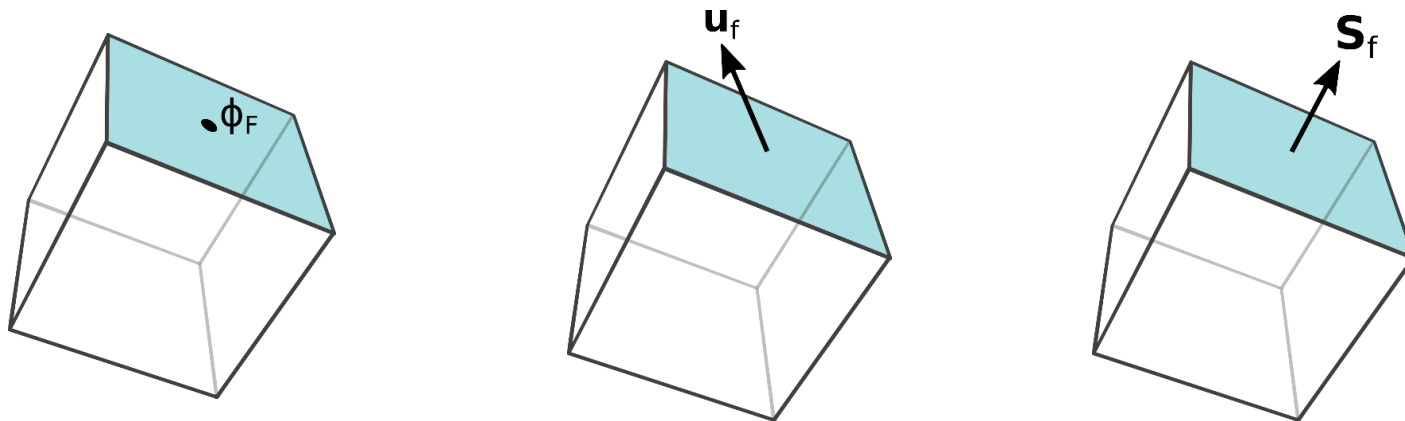
$$\frac{\partial \phi}{\partial t} + \frac{1}{V} \sum_f \phi_F \mathbf{u}_f \cdot \mathbf{S}_f = 0$$



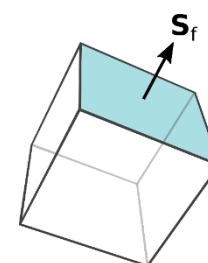
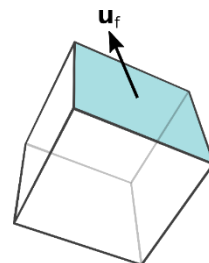
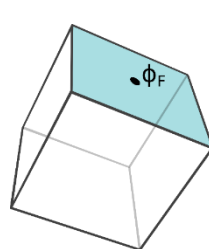
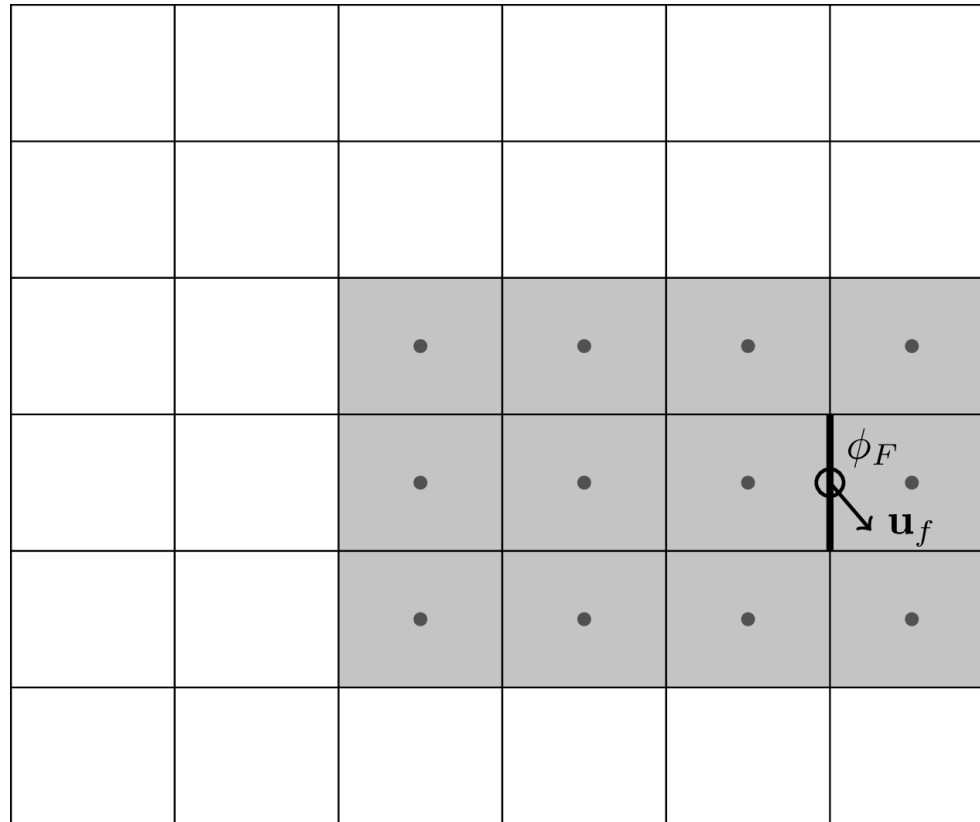
HOW TO ESTIMATE Φ_F ?

$$\frac{\partial \phi}{\partial t} + \nabla \cdot (\mathbf{u}\phi) = 0$$

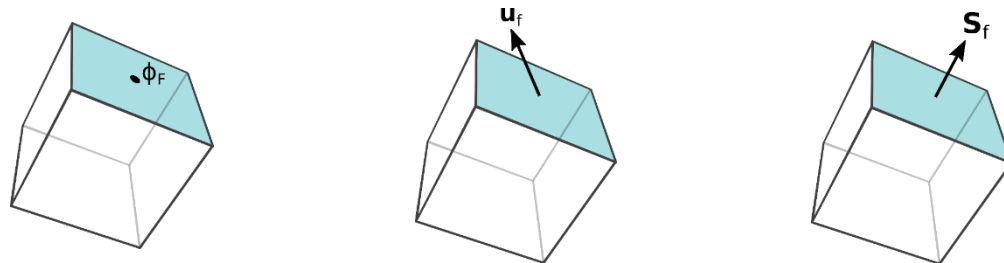
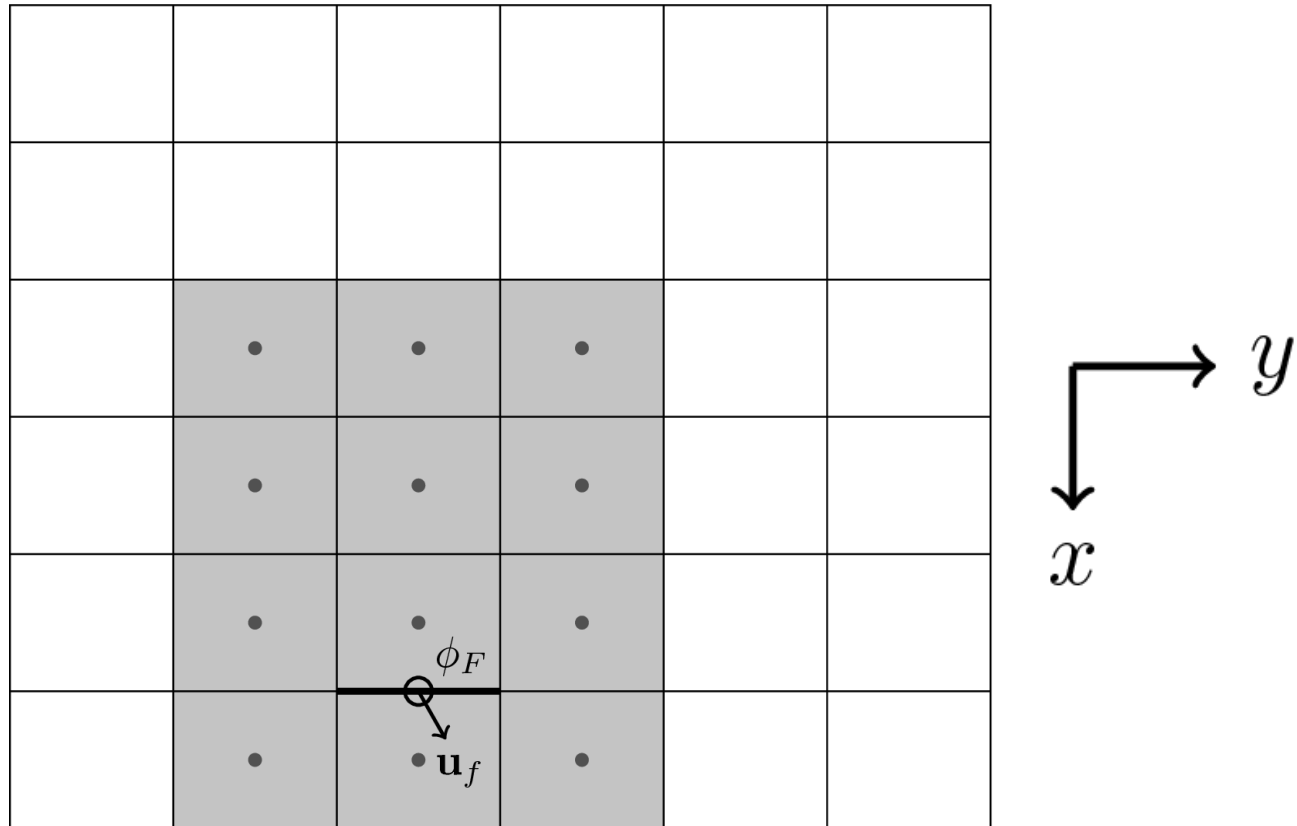
$$\frac{\partial \phi}{\partial t} + \frac{1}{V} \sum_f \Phi_F \mathbf{u}_f \cdot \mathbf{S}_f = 0$$



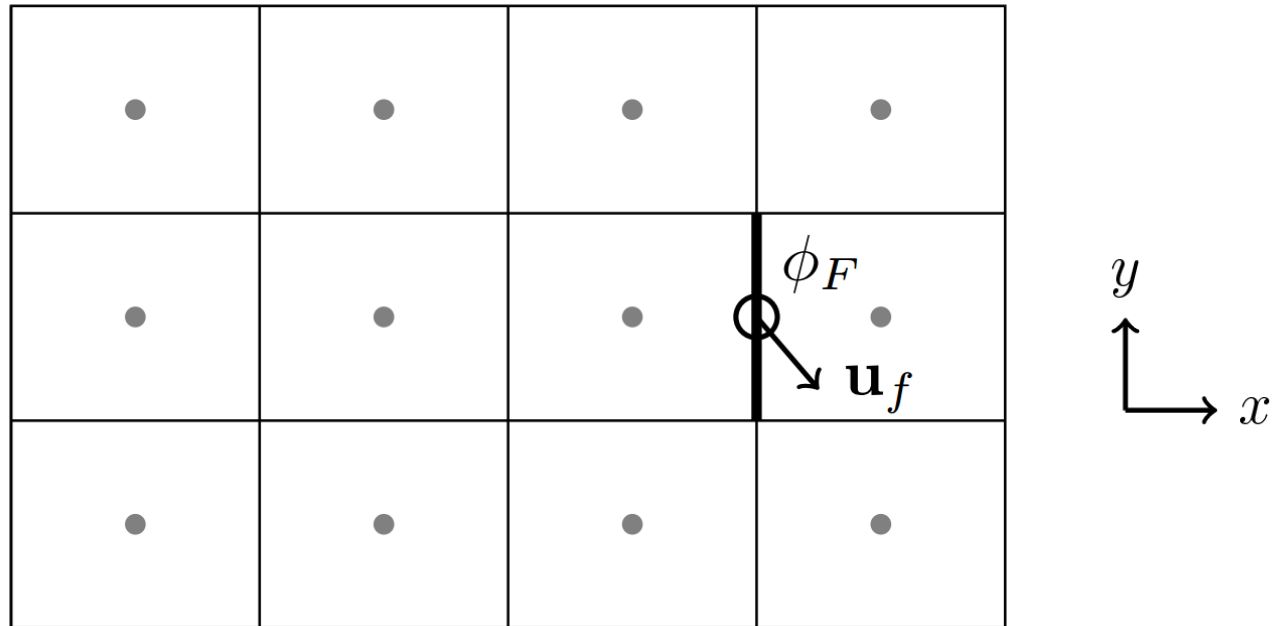
UPWIND-BIASED STENCIL



STENCIL-LOCAL COORDINATES



LEAST SQUARES FIT



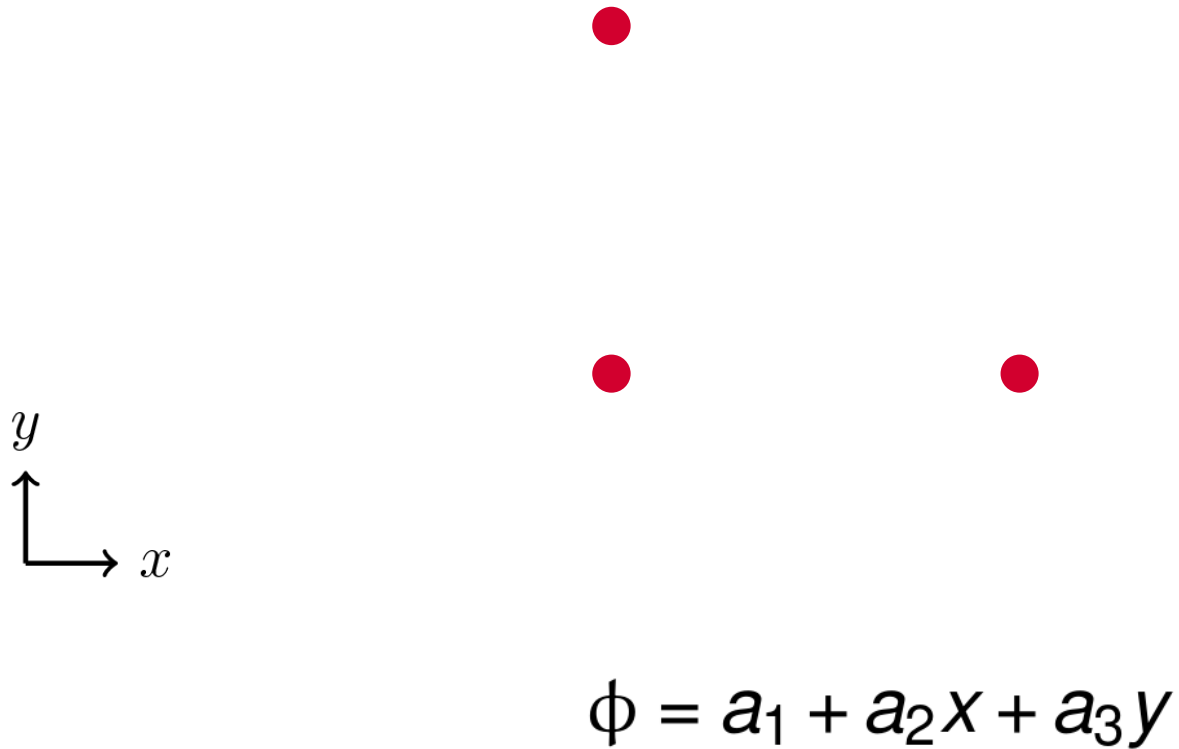
$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$

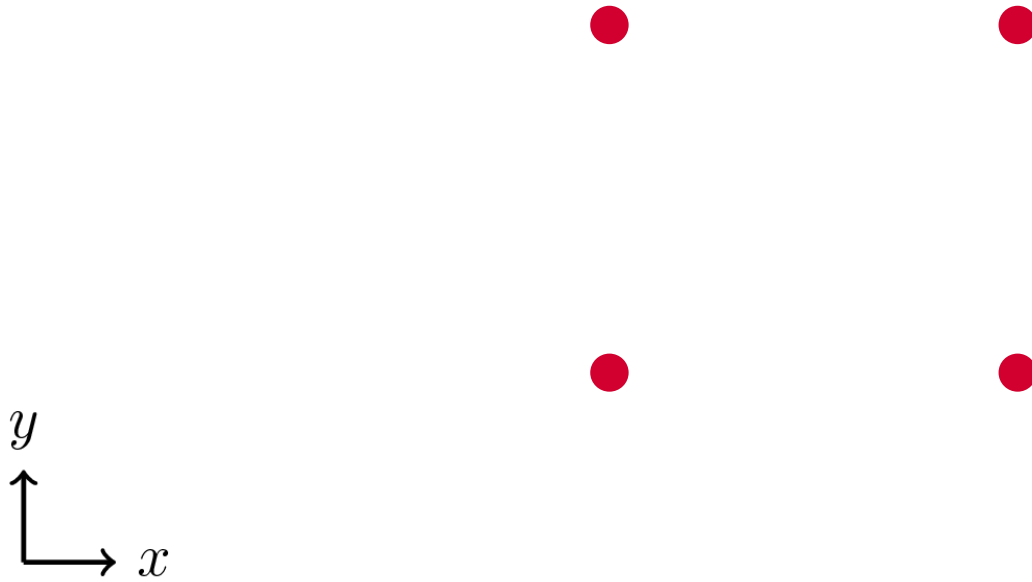
Φ_F IS CHEAP TO COMPUTE

$$\phi_F = a_1 = \begin{bmatrix} w_1 \\ w_2 \\ \vdots \\ w_{12} \end{bmatrix} \cdot \begin{bmatrix} \phi_1 \\ \phi_2 \\ \vdots \\ \phi_{12} \end{bmatrix}$$

$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$

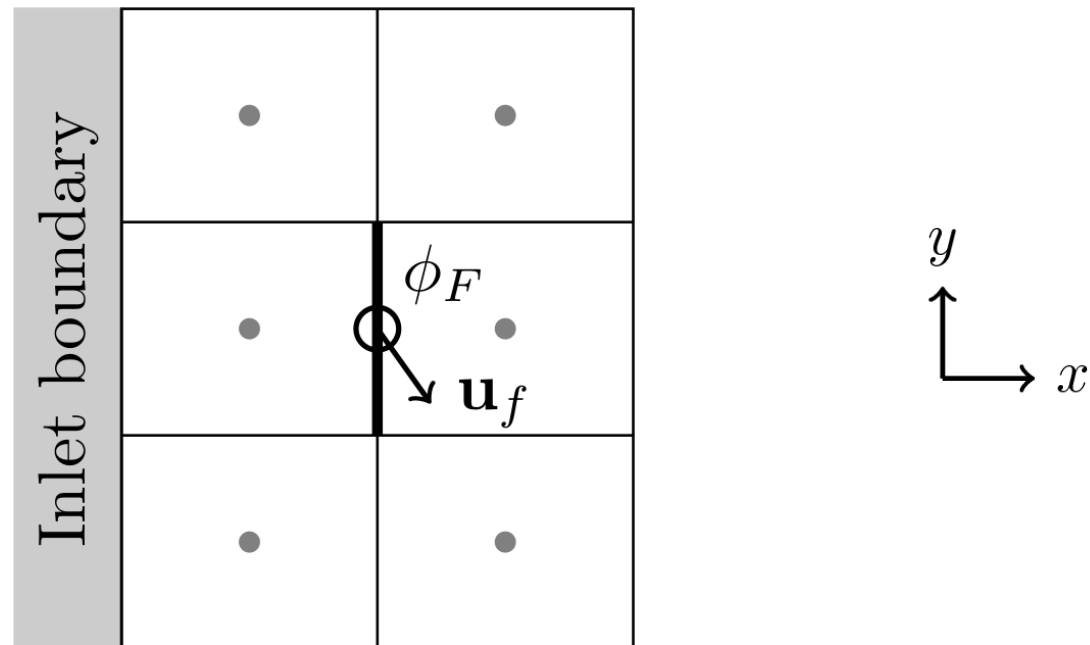
ESTIMATING Φ_F NEAR BOUNDARIES





$$\phi = a_1 + a_2x + a_3y + a_4x^2$$

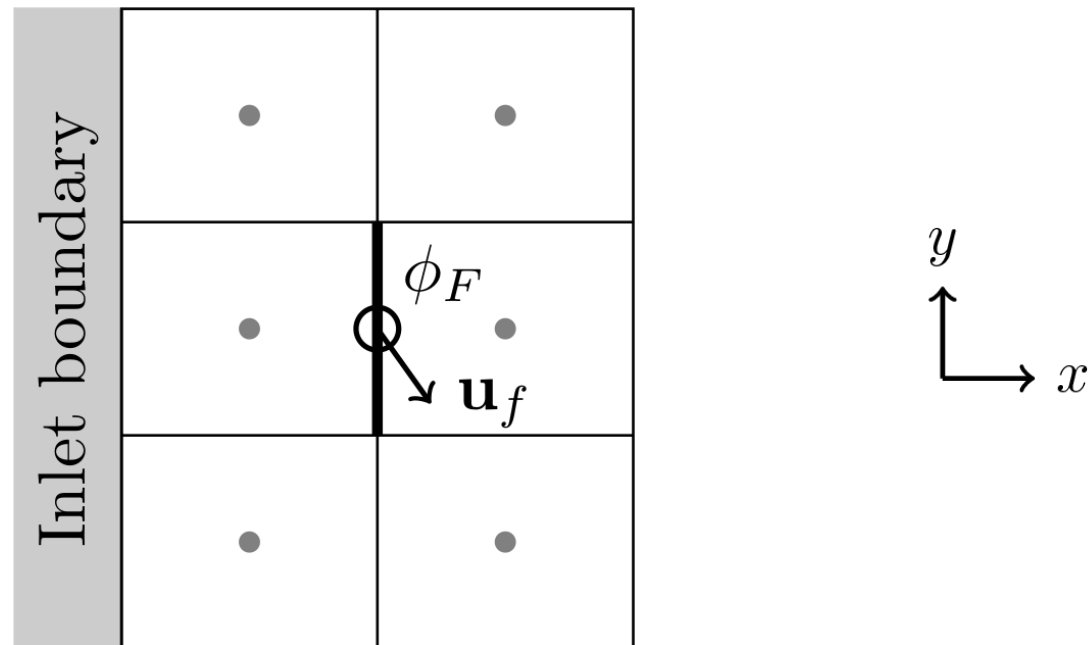
ESTIMATING ϕ_F NEAR BOUNDARIES



$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$

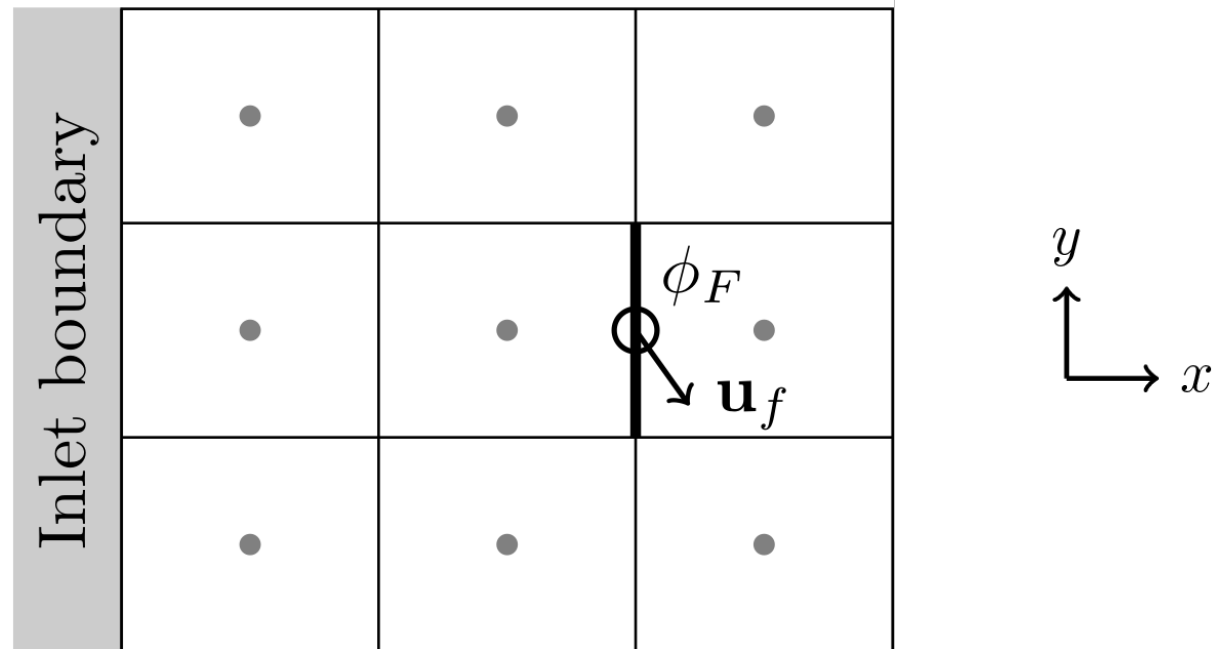
?

ESTIMATING ϕ_F NEAR BOUNDARIES



$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5y^2 + a_6xy^2$$

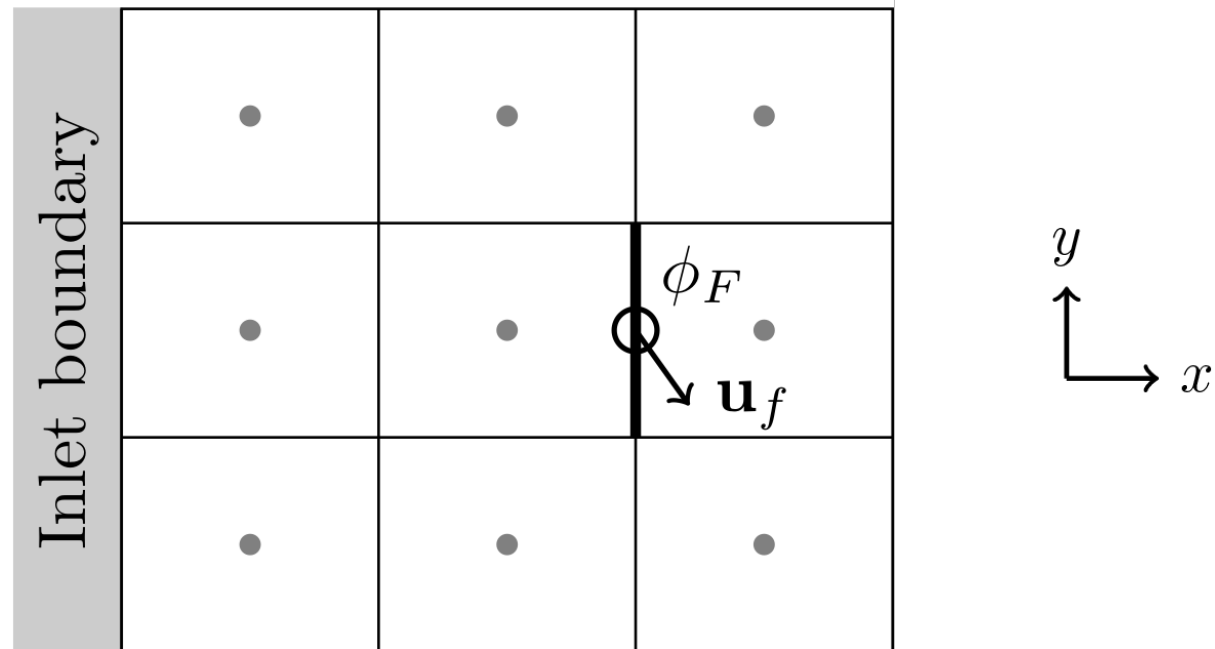
ESTIMATING ϕ_F NEAR BOUNDARIES



$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$

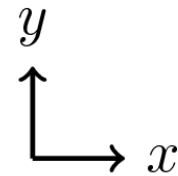
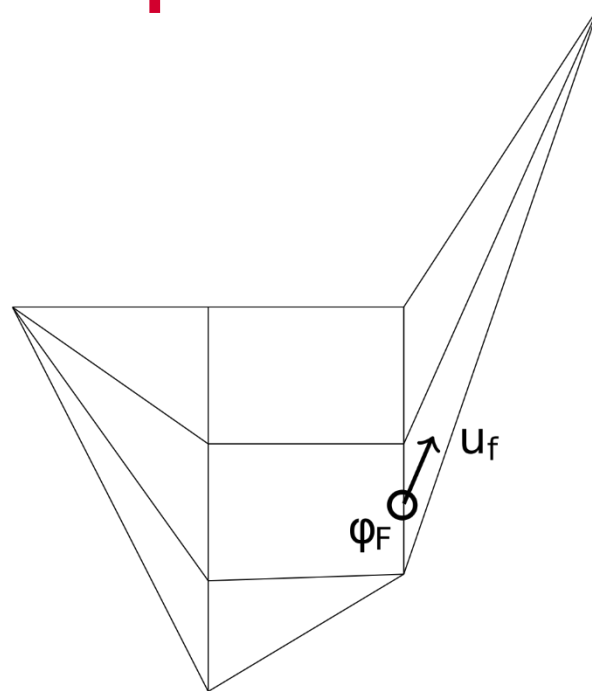
?

ESTIMATING ϕ_F NEAR BOUNDARIES



$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + \cancel{a_7x^3} + a_8x^2y + a_9xy^2$$

ESTIMATING Φ_F NEAR BOUNDARIES



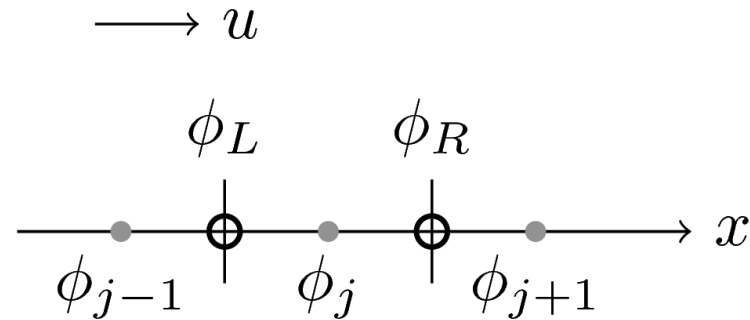
$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$



What is the most suitable polynomial
for a given distribution of points?

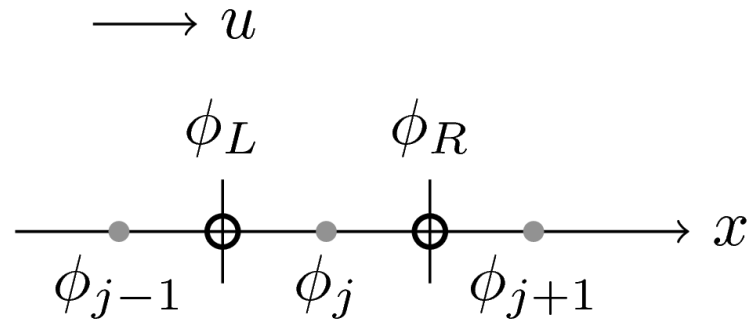
What is the highest degree polynomial that ensures numerically stable advection?

VON NEUMANN STABILITY



$$\frac{\partial \phi_j^{(n)}}{\partial t} = -u \frac{\phi_R - \phi_L}{\Delta x}$$

VON NEUMANN STABILITY

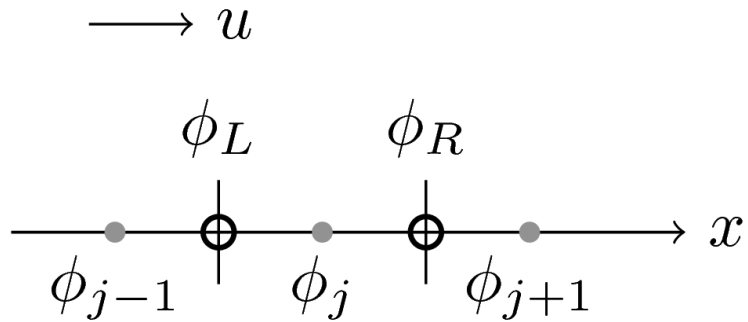


$$\frac{\partial \phi_j^{(n)}}{\partial t} = -u \frac{\phi_R - \phi_L}{\Delta x}$$

$$\phi_L = w_u \phi_{j-1} + w_d \phi_j$$

$$\phi_R = w_u \phi_j + w_d \phi_{j+1}$$

VON NEUMANN STABILITY

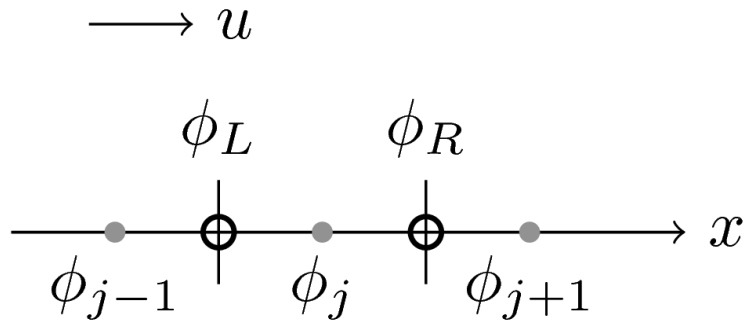


$$\phi_L = W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_u \phi_j + W_d \phi_{j+1}$$

- Assume perfect timestepping

VON NEUMANN STABILITY

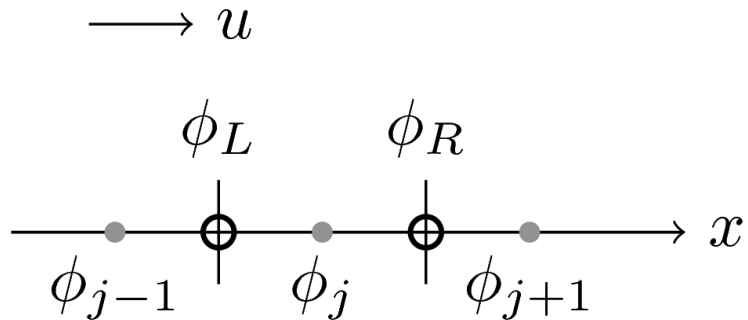


$$\phi_L = W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_u \phi_j + W_d \phi_{j+1}$$

- Assume perfect timestepping
- Assume wave-like solution $\phi_j^{(n)} = A^n e^{ijk\Delta x}$

VON NEUMANN STABILITY

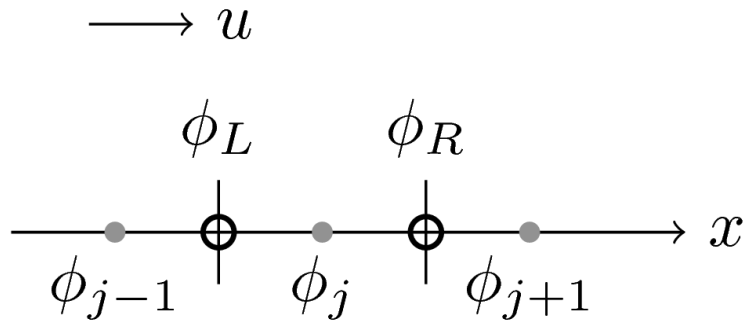


$$\phi_L = W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_u \phi_j + W_d \phi_{j+1}$$

- Assume perfect timestepping
- Assume wave-like solution $\phi_j^{(n)} = A^n e^{ijk\Delta x}$
- Introduce constraints:
 - $|A| \leq 1$

VON NEUMANN STABILITY

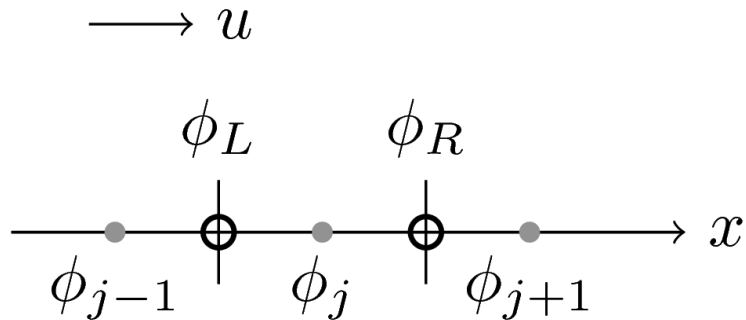


$$\phi_L = W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_u \phi_j + W_d \phi_{j+1}$$

- Assume perfect timestepping
- Assume wave-like solution $\phi_j^{(n)} = A^n e^{ijk\Delta x}$
- Introduce constraints:
 - $|A| \leq 1$
 - $\arg(A) < 0$ for $Co > 0$

VON NEUMANN STABILITY



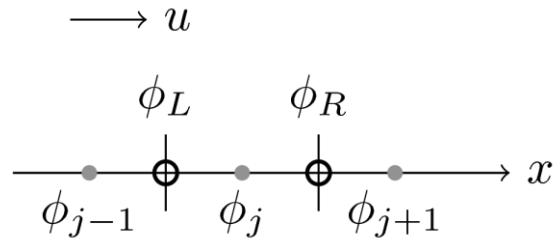
$$\phi_L = W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_u \phi_j + W_d \phi_{j+1}$$

- Assume perfect timestepping
- Assume wave-like solution $\phi_j^{(n)} = A^n e^{ijk\Delta x}$
- Introduce constraints:
 - $|A| \leq 1$
 - $\arg(A) < 0$ for $Co > 0$
 - No more damping than first-order upwind ($w_u=1, w_d=0$)

VON NEUMANN STABILITY

2-point approximation

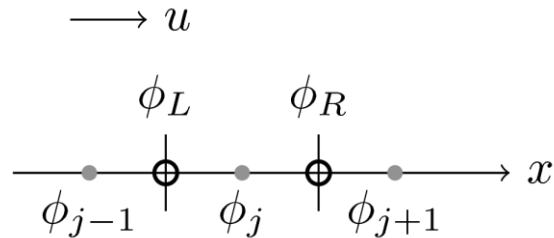


$$\phi_L = w_u \phi_{j-1} + w_d \phi_j$$

$$\phi_R = w_u \phi_j + w_d \phi_{j+1}$$

VON NEUMANN STABILITY

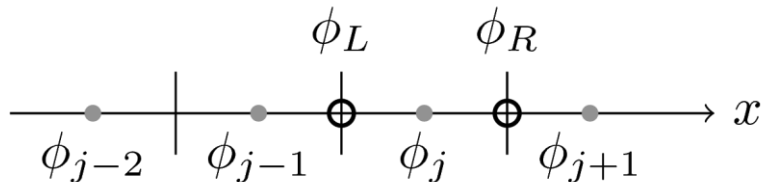
2-point approximation



$$\phi_L = W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_u \phi_j + W_d \phi_{j+1}$$

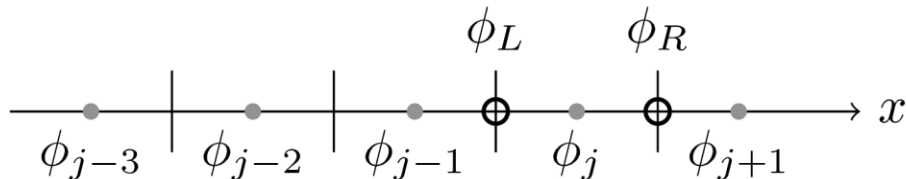
3-point approximation



$$\phi_L = W_{uu} \phi_{j-2} + W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_{uu} \phi_{j-1} + W_u \phi_j + W_d \phi_{j+1}$$

4-point approximation



$$\phi_L = W_{uuu} \phi_{j-3} + W_{uu} \phi_{j-2} + W_u \phi_{j-1} + W_d \phi_j$$

$$\phi_R = W_{uuu} \phi_{j-2} + W_{uu} \phi_{j-1} + W_u \phi_j + W_d \phi_{j+1}$$

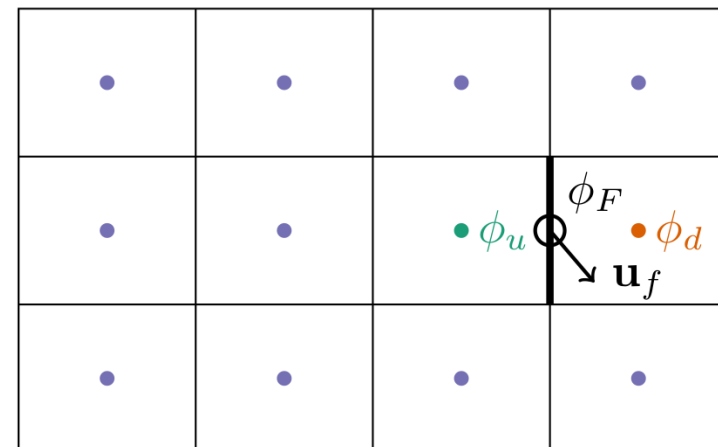
VON NEUMANN STABILITY

$$0.5 \leq w_u \leq 1$$

$$0 \leq w_d \leq 0.5$$

$$w_u - w_d \geq \max_{p \in P} (|w_p|)$$

$$\phi_F = \begin{bmatrix} w_u \\ w_d \\ w_3 \\ \vdots \\ w_{12} \end{bmatrix} \cdot \begin{bmatrix} \phi_u \\ \phi_d \\ \phi_3 \\ \vdots \\ \phi_{12} \end{bmatrix}$$



POLYNOMIAL FIT ALGORITHM

1. Generate candidate polynomials
2. Test each candidate against von Neumann stability criteria
3. Choose the best candidate that satisfies the criteria

$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$

$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y$$

$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8xy^2$$

$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^2y + a_8xy^2$$

⋮

$$\phi = a_1 + a_2x + a_3y$$

$$\phi = a_1 + a_2x + a_3x^2$$

$$\phi = a_1 + a_2y + a_3y^2$$

$$\phi = a_1 + a_2x$$

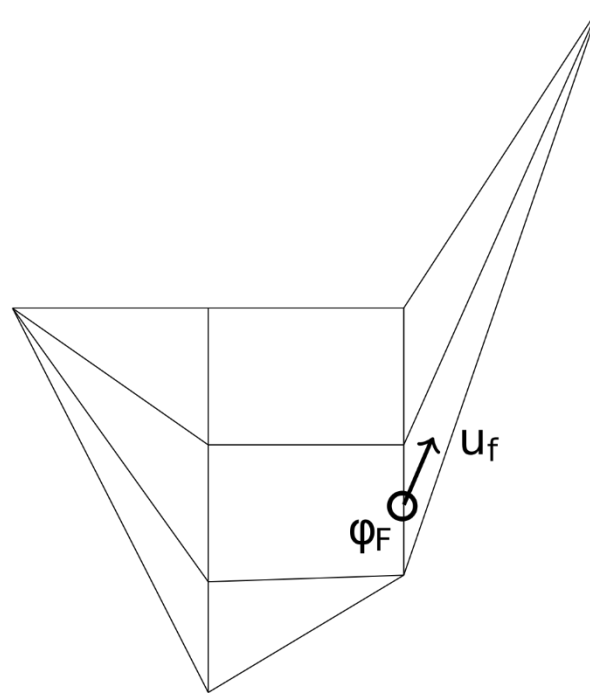
$$\phi = a_1 + a_2y$$

$$0.5 \leq w_u \leq 1$$

$$0 \leq w_d \leq 0.5$$

$$w_u - w_d \geq \max_{p \in P} (|w_p|)$$

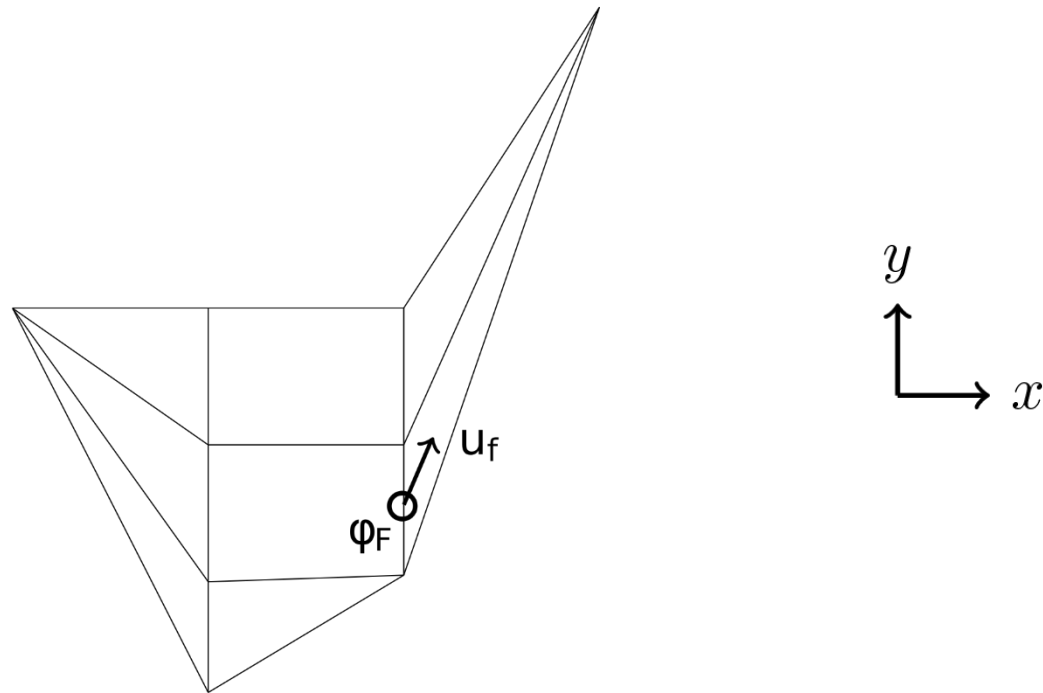
ESTIMATING Φ_F NEAR BOUNDARIES



$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2 + a_6y^2 + a_7x^3 + a_8x^2y + a_9xy^2$$



ESTIMATING Φ_F NEAR BOUNDARIES



$$\phi = a_1 + a_2x + a_3y + a_4xy + a_5x^2$$

NUMERICAL EXPERIMENTS

1. Schär horizontal advection over orography
2. “Slug” advection over orography

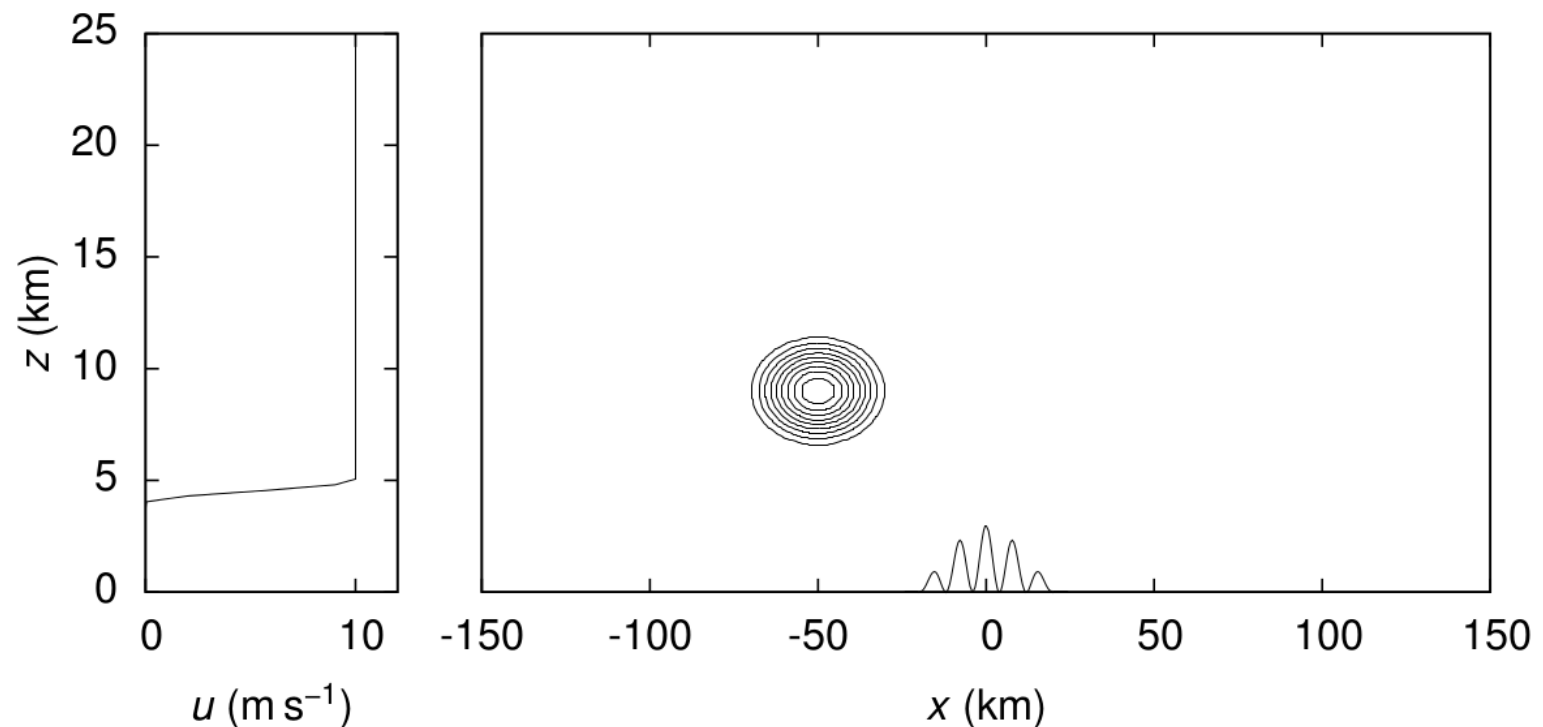
NUMERICAL EXPERIMENTS

1. Schär horizontal advection over orography
2. “Slug” advection over orography

Compare

- cubicFit
- linearUpwind

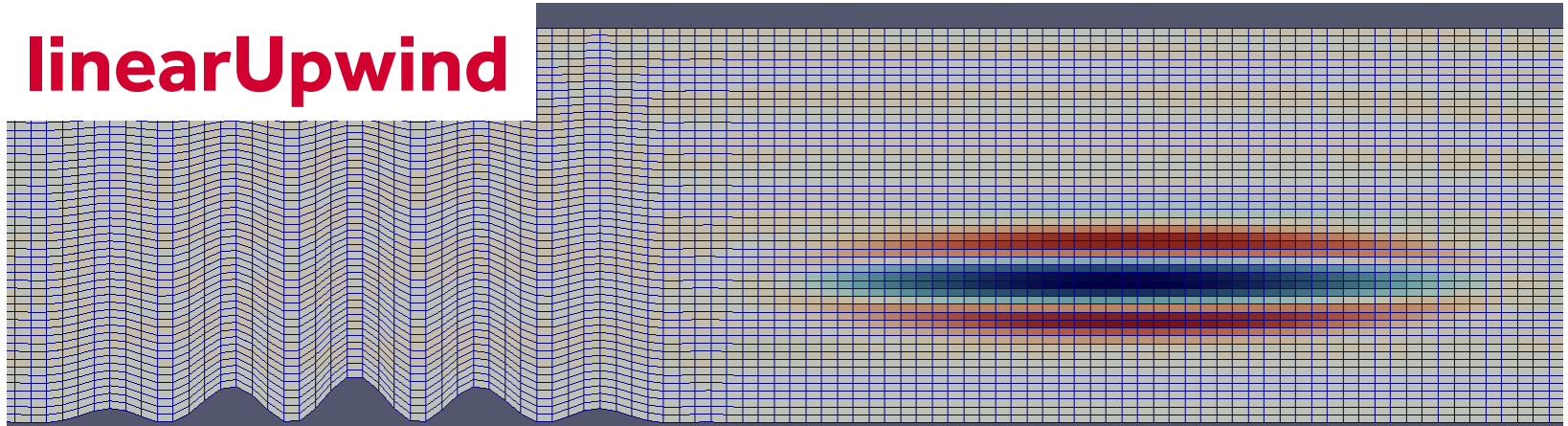
SCHÄR HORIZONTAL ADVECTION



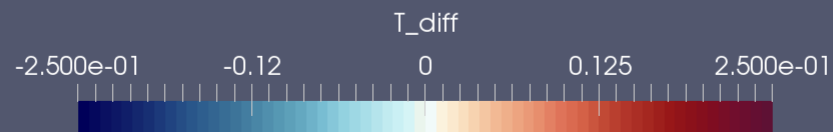
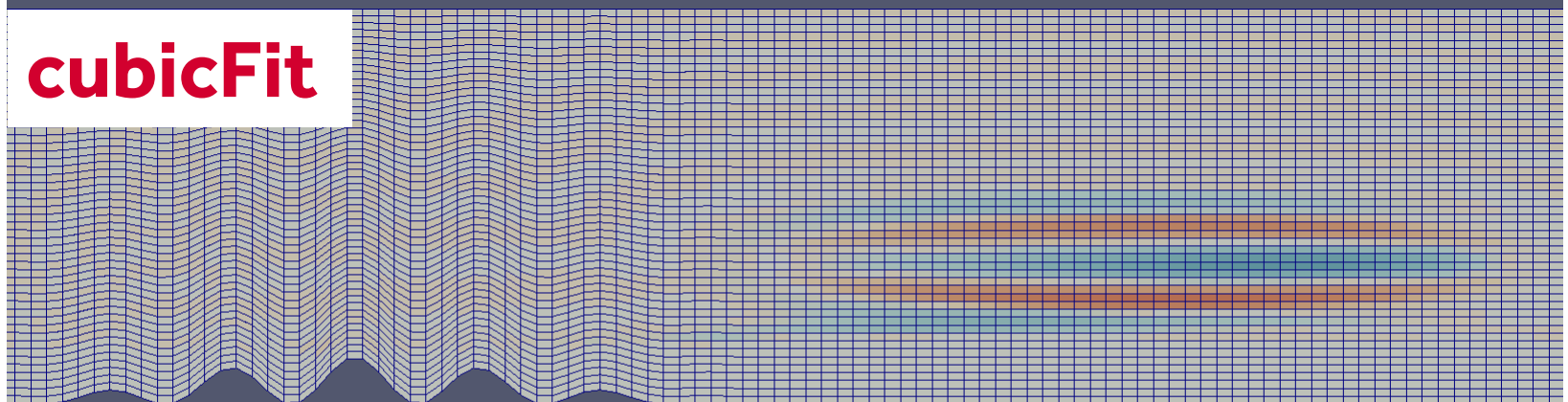
Horizontal wind profile, surface terrain profile and initial tracer
Adapted from Schär et al. 2002, MWR

BASIC TERRAIN FOLLOWING

linearUpwind



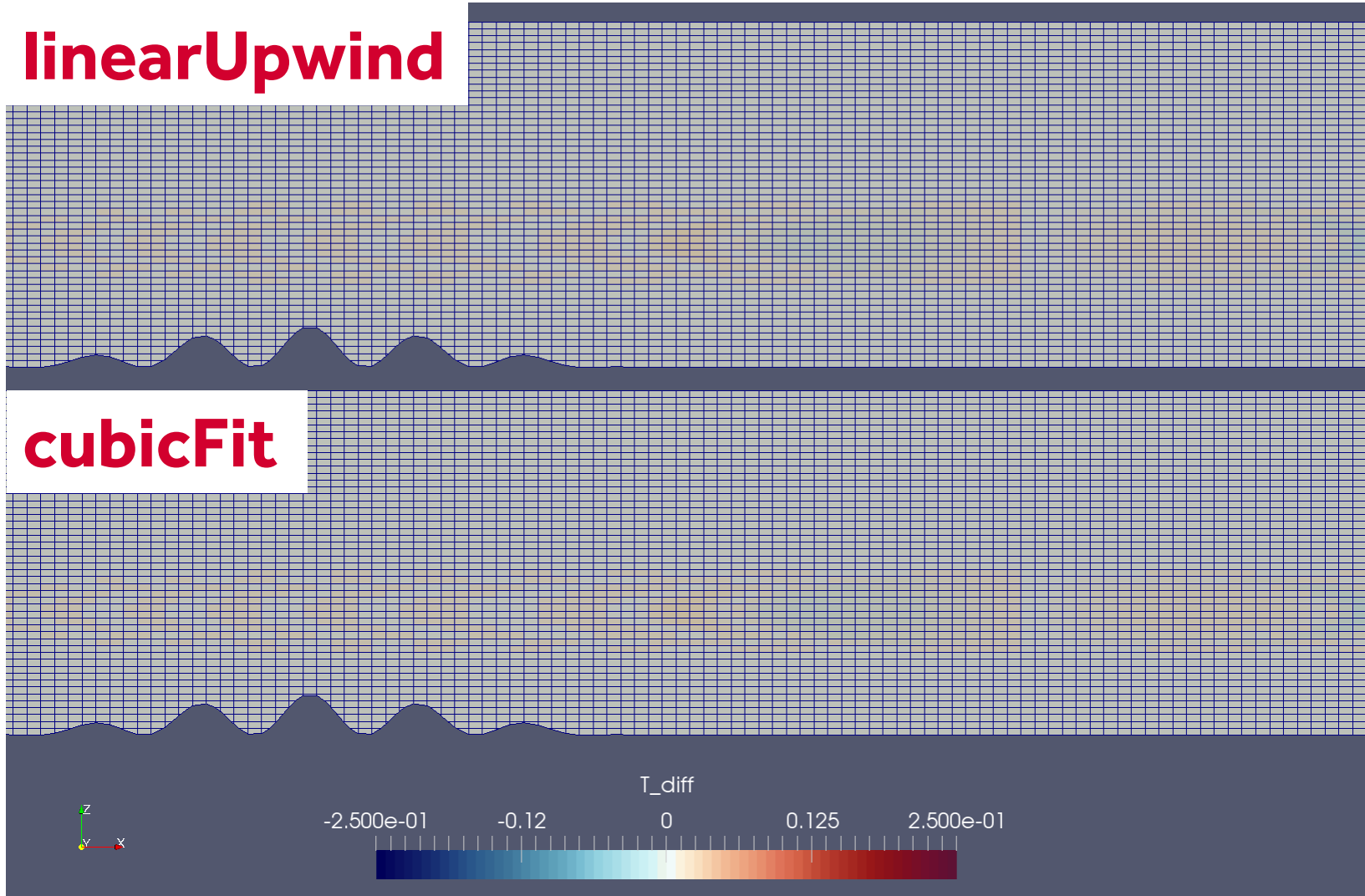
cubicFit



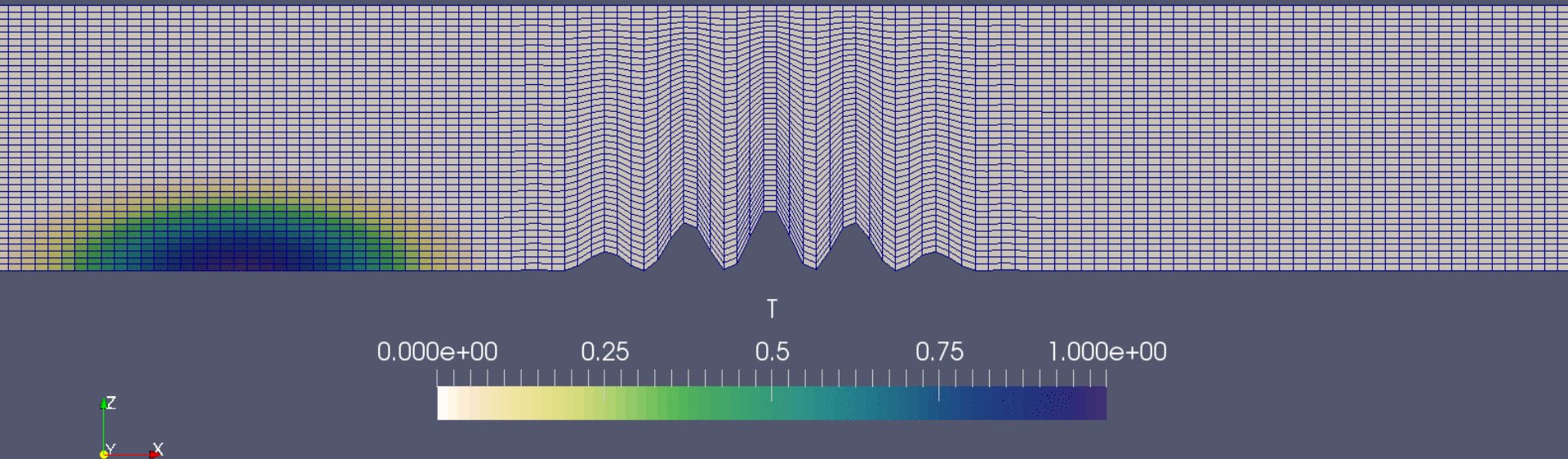
CUT CELLS

linearUpwind

cubicFit

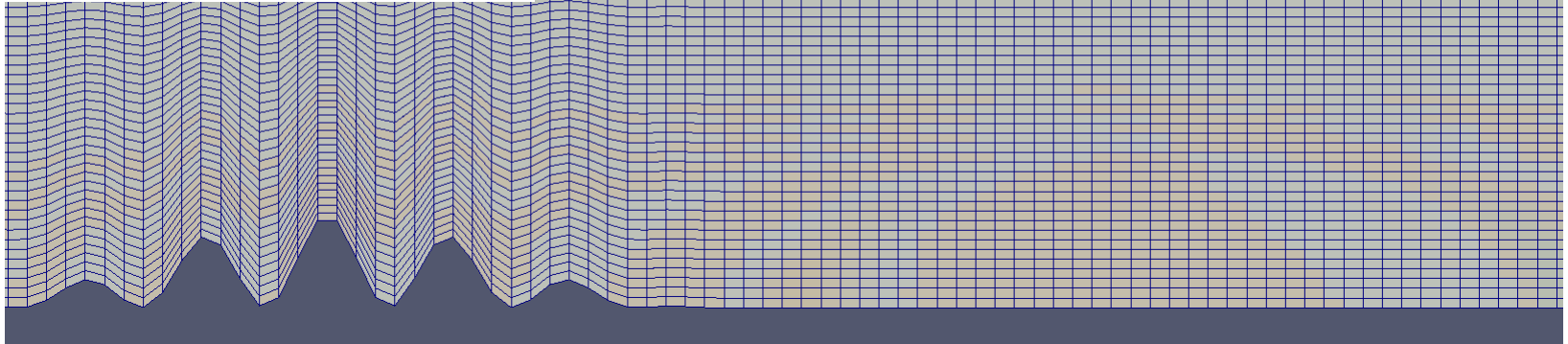


“SLUG” ADVECTION TEST

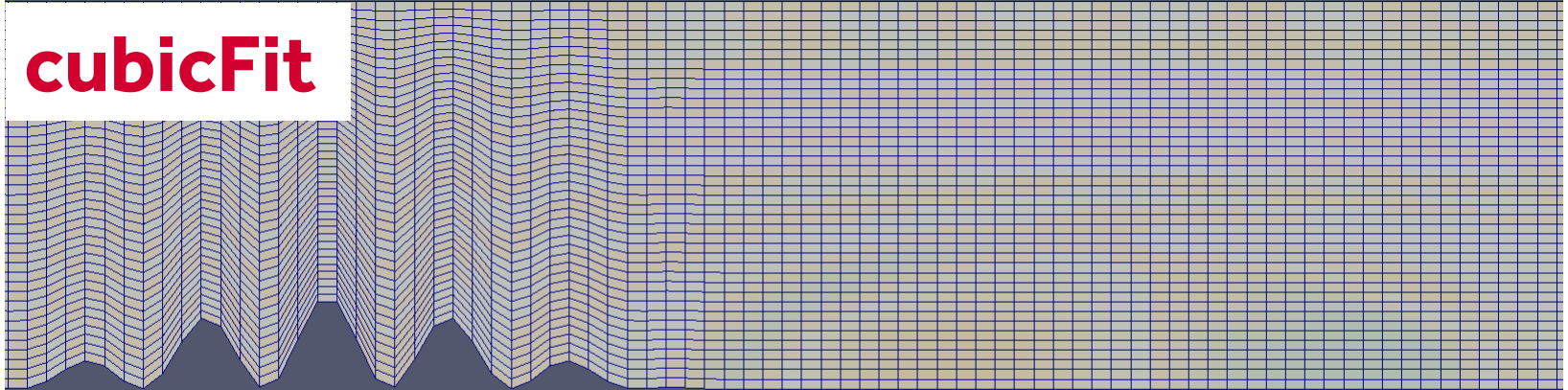


BASIC TERRAIN FOLLOWING

linearUpwind



cubicFit



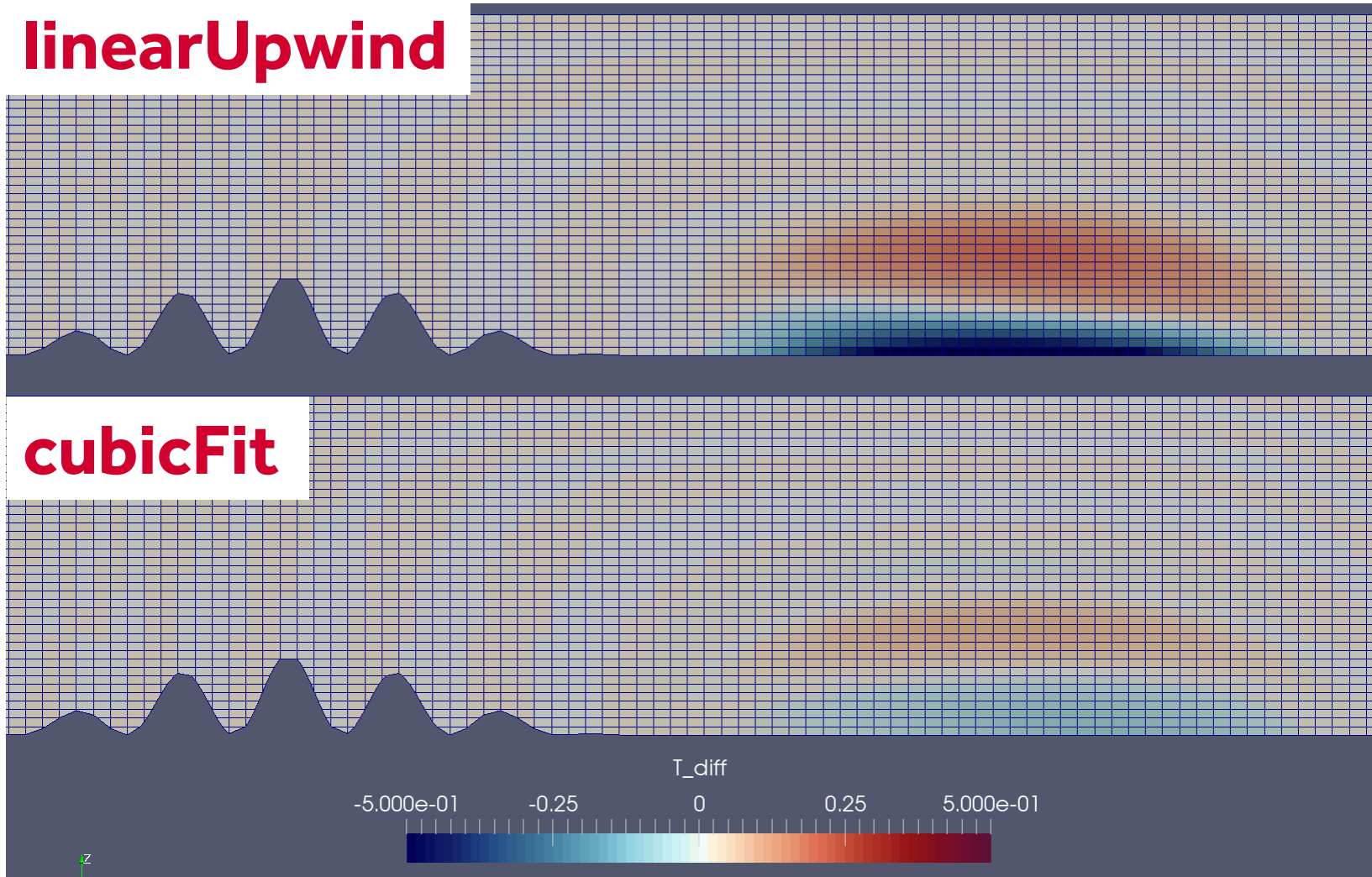
T_diff
-5.000e-01 -0.25 0 0.25 5.000e-01



z

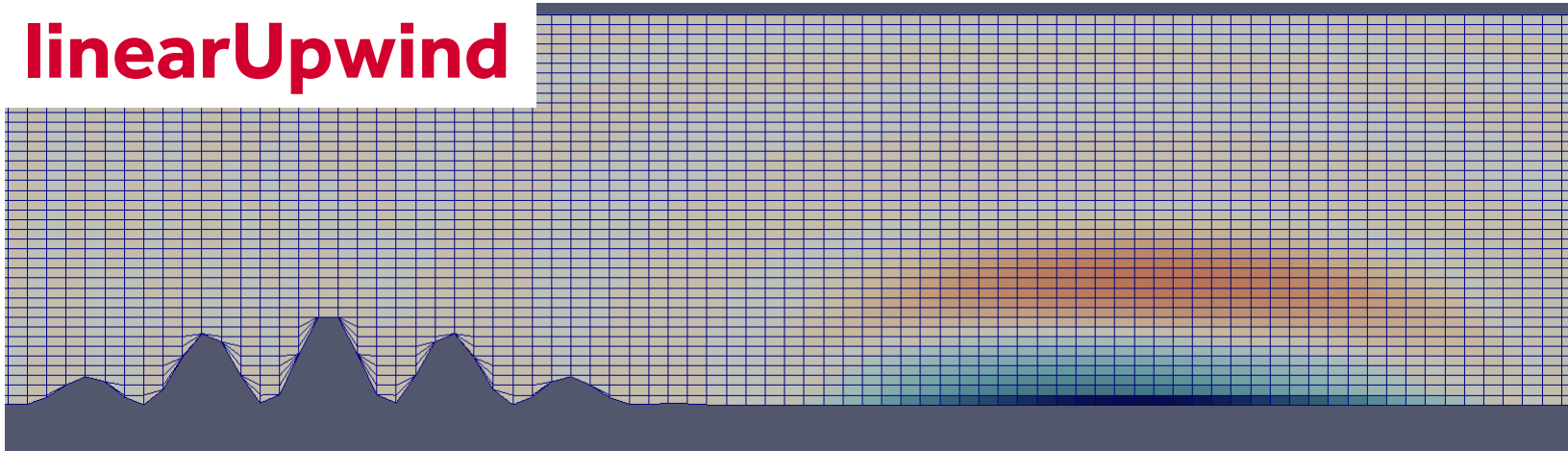
CUT CELLS

linearUpwind

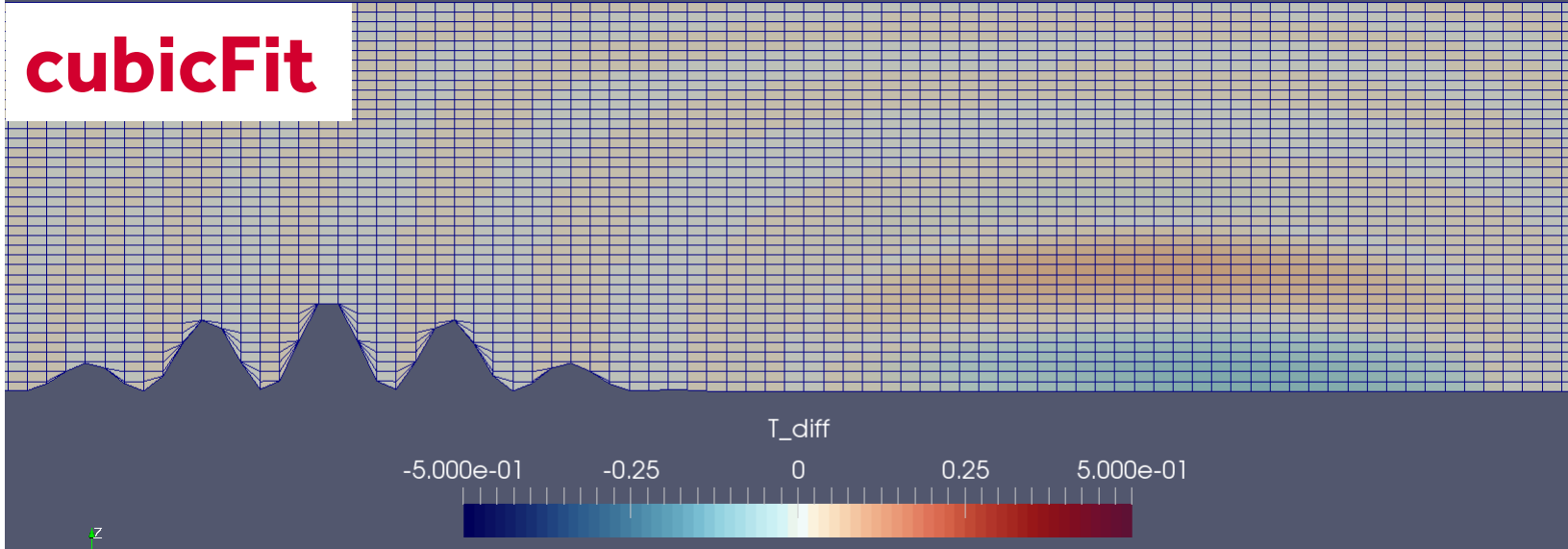


SLANTED CELLS

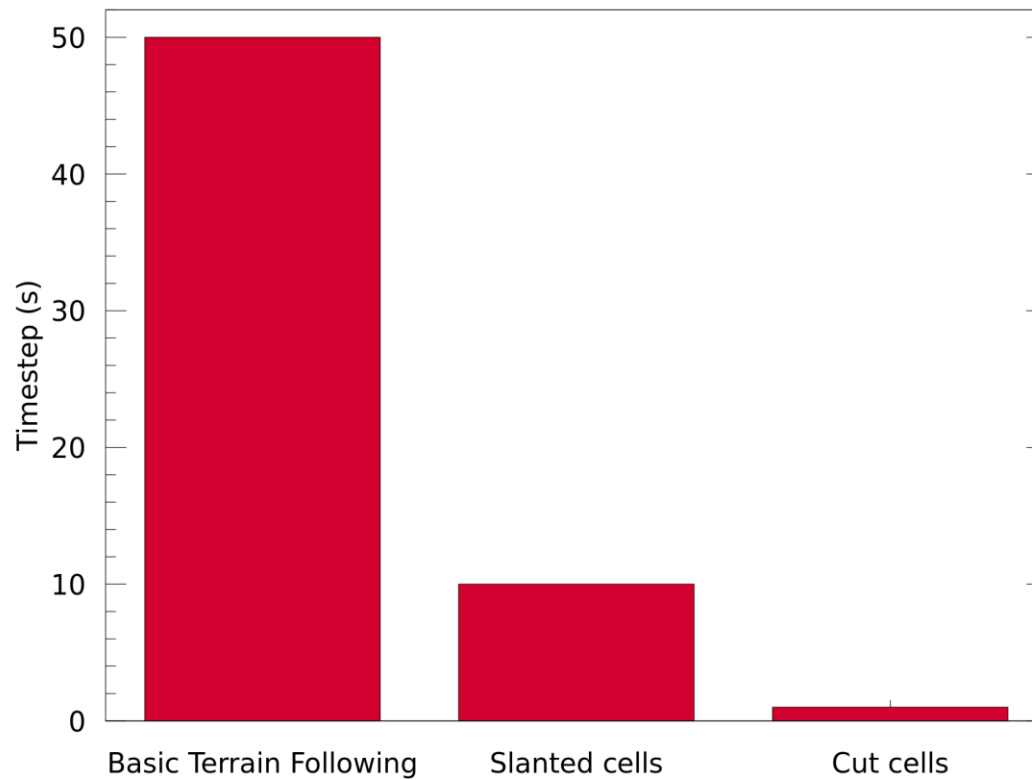
linearUpwind



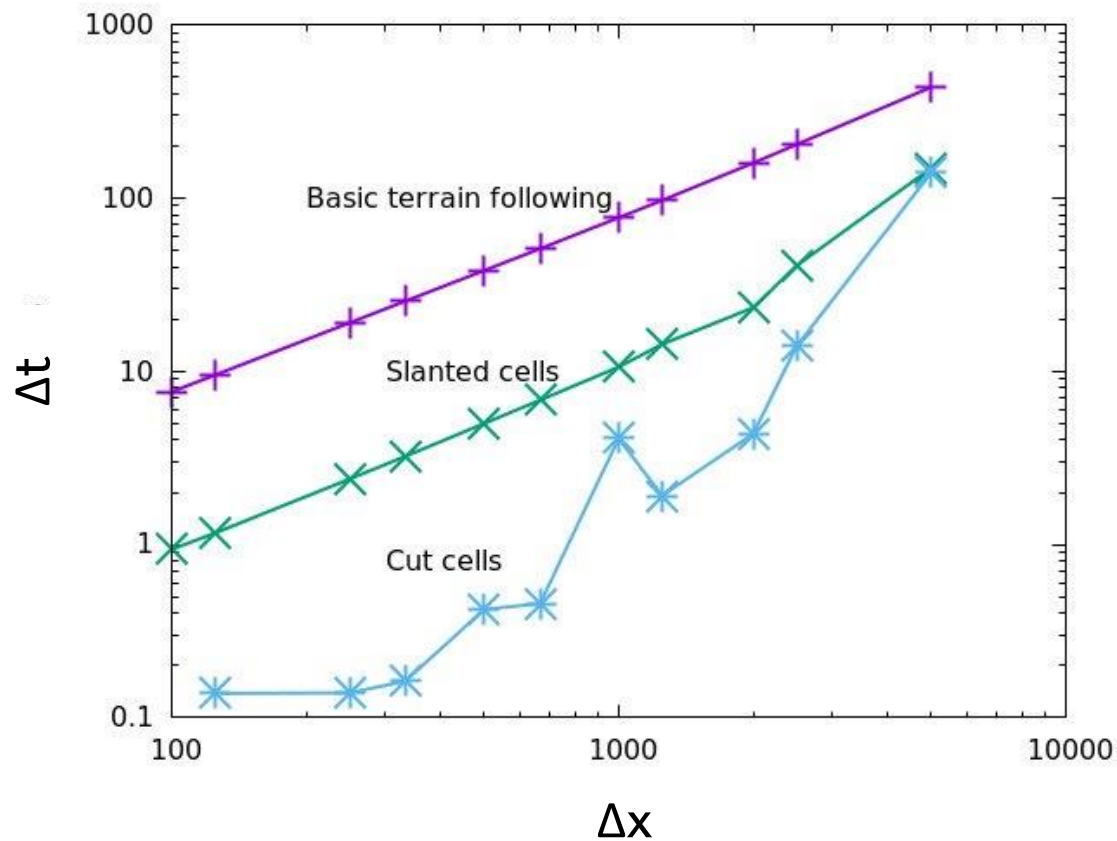
cubicFit



“SLUG” ADVECTION TIMESTEPS



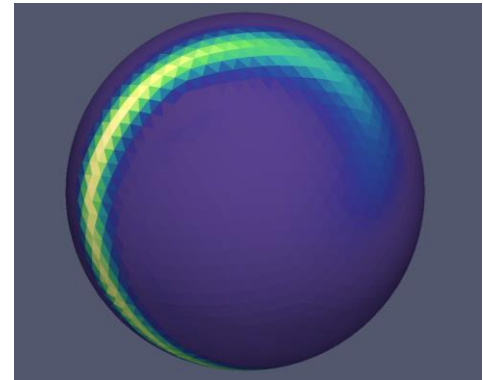
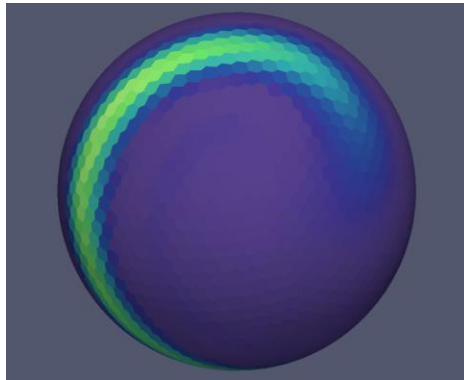
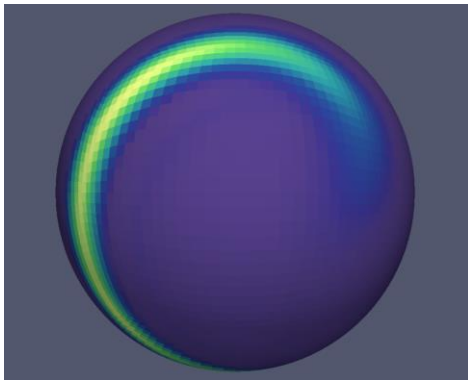
MAXIMUM TIMESTEPS



CONCLUSIONS

- cubicFit is cheap to compute (dot product of two vectors)
- cubicFit is suitable for many types of mesh
- Maximum timesteps on slanted cells scale predictably with mesh spacing

FUTURE WORK



Contact me: [@hertzsprung](https://twitter.com/hertzsprung) or js102@zepler.net

Slides and additional resources: goo.gl/jLR7vW

