Generalised curvilinear coordinates, vertical discretisations, and moving mesh adaptivity in atmospheric numerical models

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Main topics of the lecture (2h)

Main topics of this lecture:

- Governing PDEs of atmospheric dynamics in generalised curvilinear coordinates
- 2. Vertical coordinates/discretisation in some atmospheric models
- 3. Adaptive (moving) meshes



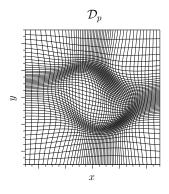
Generalised curvilinear coordinate mappings

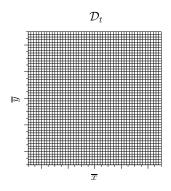
- ...transform governing PDEs to more convenient coordinates for solution
- ...accommodate complex boundaries
- ...apply a variable-resolution mesh
- ...apply dynamic mesh adaptivity



General curvilinear coordinate mappings

$$(\overline{x},\overline{y}) = (E(x,y),D(x,y)): \mathcal{D}_p \to \mathcal{D}_t$$





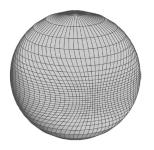


General curvilinear coordinate mappings

General bijective coordinate mapping:

$$(\overline{t},\overline{\mathbf{x}})=(t,\mathcal{F}(t,\mathbf{x})): \mathcal{D}_p o \mathcal{D}_t$$

- \mathcal{D}_p is subdomain of the physical space \mathbf{S}_p with coordinates $(t, \mathbf{x}) \equiv (t, x, y, z)$ and metric tensor g_{kj} where the physical problem is posed. It is convenient to assume the physical system \mathbf{S}_p to be a stationary and orthogonal (e.g. Cartesian, geospherical, spheroidal,..)
- · \mathcal{D}_t is subdomain of transformed computational space \mathbf{S}_t with generalised coordinates $(\overline{t}, \overline{\mathbf{x}}) \equiv (\overline{t}, \overline{x}, \overline{y}, \overline{z})$ and metric tensor \overline{g}_{rs} where the problem is solved





Governing equations in Lagrangian form

Symbolic vector-form of basic adiabatic governing PDEs:

$$\frac{D\mathbf{u}}{Dt} = -c_{\rho}\theta\nabla\pi + \mathbf{g} + \mathbf{M}$$
$$\frac{D\theta}{Dt} = 0$$
$$\frac{D\rho}{Dt} = -\rho\nabla\cdot\mathbf{u}$$

with

$$\mathbf{u} = (u^1, u^2, u^3)$$
, $\mathbf{g} = (0, 0, -g)$



Governing equations in Lagrangian form

Transformed governing PDEs in \mathbf{S}_t (e.g. Clark JCP 1977, Prusa et al. JCP 2003):

$$\begin{split} \frac{du^{j}}{d\overline{t}} &= -c_{p}\theta \, \tilde{G}_{j}^{k} \, \frac{\partial \pi}{\partial \overline{x}^{k}} - g \, \delta_{3}^{j} + M^{j} \qquad j = 1, 2, 3 \\ \frac{d\theta}{d\overline{t}} &= 0 \\ \frac{d\rho}{d\overline{t}} &= -\frac{\rho}{\overline{G}} \left(\frac{\partial \overline{G} \overline{v}^{s^{k}}}{\partial \overline{x}^{k}} \right) \end{split}$$

with

$$\frac{d}{d\overline{t}} = \frac{\partial}{\partial \overline{t}} + \overline{v}^{*k} \frac{\partial}{\partial \overline{x}^{k}} , \qquad \widetilde{G}_{j}^{k} := \sqrt{g^{jj}} \frac{\partial \overline{x}^{k}}{\partial x^{j}} \qquad \overline{G} = |\overline{g}_{jk}|^{1/2}$$

$$\overline{v}^{*j} = \frac{d\overline{x}^{j}}{d\overline{t}} = \overline{v}^{sj} + \frac{\partial \overline{x}^{j}}{\partial t} \qquad \overline{v}^{sj} = \frac{\partial \overline{x}^{j}}{\partial x^{k}} u^{*k} \qquad v^{k} = \sqrt{g_{kk}} u^{*k}$$

ightarrow see e.g. textbook by Zdunkowski and Bott 2003 for fundamentals



Governing equations in Eulerian conservation form

Transformed governing PDEs in S_t :

$$\frac{\partial \rho^* u^j}{\partial \overline{t}} + \overline{\nabla} \cdot \left(\overline{\mathbf{v}}^* \rho^* u^j \right) = -\rho^* c_\rho \theta \, \tilde{G}_j^k \frac{\partial \pi}{\partial \overline{x}^k} - \rho^* \mathbf{g} \, \delta_3^j + \rho^* M^j \qquad j = 1, 2, 3$$

$$\frac{\partial \rho^* \theta}{\partial \overline{t}} + \overline{\nabla} \cdot \left(\overline{\mathbf{v}}^* \rho^* \theta \right) = 0$$

$$\frac{\partial \rho^*}{\partial \overline{t}} + \overline{\nabla} \cdot \left(\overline{\mathbf{v}}^* \rho^* \right) = 0$$

with

$$\overline{\nabla} \equiv \left(\frac{\partial}{\partial \overline{x}}, \frac{\partial}{\partial \overline{y}}, \frac{\partial}{\partial \overline{z}} \right) , \qquad \overline{\mathbf{v}}^* \equiv \left(\overline{\mathbf{v}}^{*1}, \overline{\mathbf{v}}^{*2}, \overline{\mathbf{v}}^{*3} \right) , \qquad \rho^* \equiv \overline{G} \rho$$



Tensor identities

1. Divergence in generalised coordinates:

$$\nabla \cdot \mathbf{A} = \frac{1}{\overline{G}} \frac{\partial}{\partial \overline{x}^k} \left(\overline{G} \, \overline{A}^k \right) - \overline{A}^j \left[\frac{G}{\overline{G}} \frac{\partial}{\partial \overline{x}^k} \left(\overline{\frac{G}{G}} \frac{\partial \overline{x}^k}{\partial x^j} \right) \right]$$

Invariance of divergence uses multi-component geometric conservation law (GCL):

$$\frac{G}{\overline{G}}\frac{\partial}{\partial \overline{x}^k} \left(\frac{\overline{G}}{G} \frac{\partial \overline{x}^k}{\partial x^j} \right) \equiv 0$$

2. Reciprocity of covariant and contravariant base vectors:

$$\overline{\mathbf{q}}^r \cdot \overline{\mathbf{q}}_s = \frac{\partial \overline{x}^r}{\partial x^q} \frac{\partial x^q}{\partial \overline{x}^s} = \delta_s^r$$

ightarrow Discrete model should respect these identities ! (see e.g. Thomas and Lombard 1979, Prusa and Gutowski IJNMF 2006, Kühnlein et al. JCP 2012)

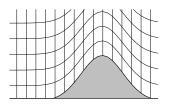


Vertical coordinates in atmospheric models

ightarrow Independent vertical variable ζ

$$(\overline{x},\overline{y},\zeta)=(x,y,\zeta(t,x,y,z))$$

- · height z
- · (hydrostatic) pressure p
- potential temperature θ
- ٠..
- → Terrain-following coordinates
 - + levels do not intersect the earth's surface
 - + specification of the lower boundary condition
 - + uniform vertical mesh spacing near the surface
 - + stretching easily allows higher resolution towards the surface
 - + long time steps
 - (-) potential errors in pressure gradient term
 - (-) mesh quality for steep orography





Terrain-following coordinate of Gal-Chen and Somerville (1975):

$$\overline{z} = \overline{z}(x, y, z) = H \frac{z - h(x, y)}{H - h(x, y)}$$

with inverse mapping

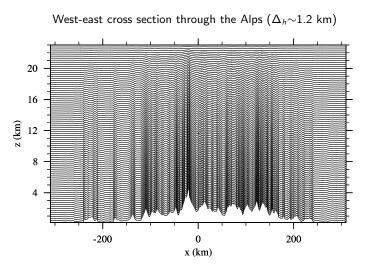
$$z = z(x, y, \overline{z}) = \overline{z} + \left(1 - \frac{\overline{z}}{H}\right)h = \overline{z} + b(\overline{z})h(x, y)$$

H: height of model top

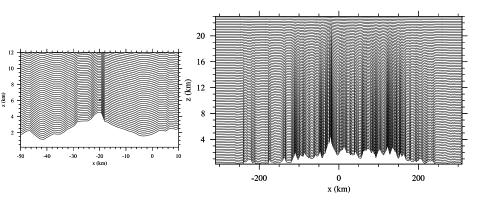
h(x, y): local height of orography

 $b(\overline{z})$: vertical decay function of orography









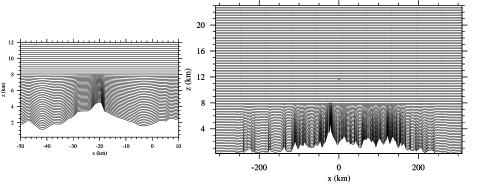


Hybrid specification:

$$z(x, y, \overline{z}) = \overline{z} + b(\overline{z})h(x, y)$$

where

$$b(\overline{z}) = \begin{cases} (1 - \overline{z}/H_r) & : \overline{z} \le H_r \\ 0 & : \overline{z} > H_r \end{cases}$$





Smoothed height-based terrain-following coordinates

Smoothed coordinate – SLEVE (Schär et al. MWR 2002, Leuenberger et al. MWR 2010):

$$z(x, y, \overline{z}) = \overline{z} + b_s h_s(x, y) + b_r h_r(x, y)$$

 h_s : smoothed terrain

 $h_r = h - h_s$: residual containing small-scale variations of terrain

 b_s : vertical decay function for h_s b_r : vertical decay function for h_r

with

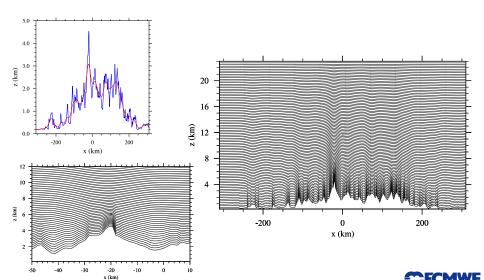
$$b_i(\overline{z}) = \frac{\sinh\left[(H/s_i)^n - (\overline{z}/s_i)^n \right]}{\sinh\left[(H/s_i)^n \right]}$$

 \Rightarrow Faster decay for b_r versus b_s by defining smaller scale-height s_i

See also: Zängl MWR 2003, Klemp MWR 2011



SLEVE coordinate

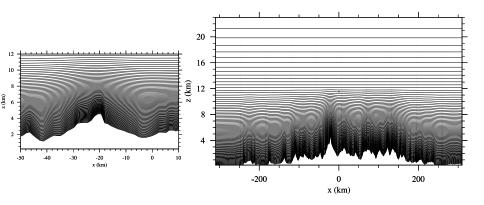




SLEVE coordinate

SLEVE in hybrid setting with vertical stretching:

$$\tilde{z} = C^{-1}(\overline{z}) \rightarrow z = z(x, y, \tilde{z})$$





Pressure-based terrain-following coordinates

Pressure-based terrain-following vertical coordinate η of the form:

$$(\overline{x},\overline{y},\eta)\equiv(x,y,\eta(p,p_s))$$

with $\eta_s = \eta(p_s, p_s) \equiv 1$ $\eta_t = \eta(p_t, p_s) \equiv 0$

p(t, x, y, z): pressure, $p_s(t, x, y)$: surface pressure, p_t : top pressure \rightarrow bijective mapping between p and η for a given p_s .

One example is (Phillips JM 1957 "A coordinate system having some special advantages for numerical forecasting", Mintz 1965)

$$\sigma = \eta = \frac{p - p_t}{p_s - p_t}$$

commonly named as the σ -coordinate.



Hybrid pressure-based terrain-following coordinates

Hybrid σ -p vertical coordinate (Simmons and Burridge MWR 1981) employed in ECMWF's operational IFS model (with $p_t \equiv 0$):

$$p(t, x, y, z) = A(\eta) + B(\eta)p_s(t, x, y)$$

with

$$A(\eta_t) = 0$$
, $B(\eta_t) = 0$, $A(\eta_s) = 0$, $B(\eta_s) = 1$

- \rightarrow terrain-following σ -like levels near the earth's surface with transition to pressure levels in the upper troposphere and stratosphere
 - different approaches to specify A and B coefficients (see e.g. Eckermann MWR 2009)
 - similar in non-hydrostatic models (Laprise MWR 1992, Bubnova et al. MWR 1995)



Hybrid pressure-based terrain-following coordinates

Evolution of hybrid $\sigma-p$ levels of IFS over a 10 day T255/L91 forecast (Zonal section at \sim 60° N)



Isentropic vertical coordinates

Potential temperature θ as independent vertical coordinate:

- for inviscid adiabatic flow $D\theta/Dt=0$ isentropes represent material surfaces
- · more accurate representation of vertical transport
- · adaptive vertical mesh spacing proportional to thermal stratification
- · implemented as hybrid terrain-following-heta coordinate
- becomes more complicated for high resolution due to small-scale θ variations
- · regularisation of coordinate required to ensure monotonicity
- \rightarrow see e.g. Hsu and Arakawa, MWR 1990; Konor and Arakawa, MWR 1997; Benjamin et al. MWR 2004; Toy and Randall MWR 2009



Pressure gradient term with terrain-following coordinates

⇒ horizontal pressure gradient

$$-c_{p}\theta\frac{\partial\pi}{\partial x}=-c_{p}\theta\left(\frac{\partial\pi}{\partial\overline{x}}+\frac{\partial\overline{z}}{\partial x}\frac{\partial\pi}{\partial\overline{z}}\right)$$

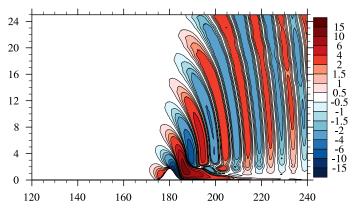
susceptible to errors

- + subtraction of balanced state
- + satisfy tensor identities, consistency of discrete metrics and dynamics (see e.g. Prusa and Gutowski IJNMF 2006; Klemp et al. MWR 2003)
- + boundary conditions (e.g. Smolarkiewicz et al. JCP 2007)
- + smoothed coordinate levels
- + truly horizontal evaluation of horizontal components of the pressure gradient and horizontal diffusion using reconstructed quantities on Cartesian mesh (Zängl MWR 2012, and references therein)
- + see also Lin QJ 1996, Weller and Shahrokhi MWR 2014



Steep orography with a basic terrain-following vertical coordinate

Stratified flow past isolated mountain with FVM (max. slope \sim 37 $^{\circ}$)

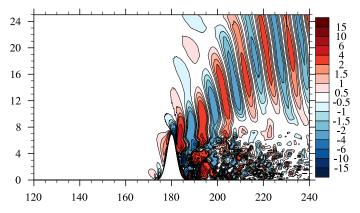


ightarrow Basic terrain-following coordinate, semi-implicit integration of Euler equations (Smolarkiewicz et al. 2014), finite-volume MPDATA scheme (Kühnlein and Smolarkiewicz 2017), no explicit diffusion



Steep orography with a basic terrain-following vertical coordinate

Stratified flow past isolated mountain with FVM (max. slope \sim 71 $^{\circ}$)

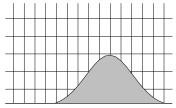


 \rightarrow Basic terrain-following coordinate, semi-implicit integration of Euler equations (Smolarkiewicz et al. 2014), finite-volume MPDATA scheme (Kühnlein and Smolarkiewicz 2017), no explicit diffusion



Other techniques

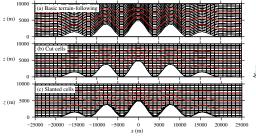
ightarrow Cut-cell method (e.g. Steppeler et al. 2002, Klein et al. 2009, Lock et al. 2012)

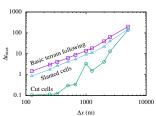




Other techniques

→ Slanted cell approach (Shaw and Weller MWR 2016, Shaw et al. 2017)

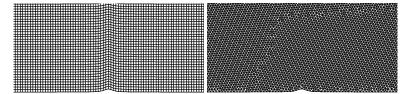






Other techniques

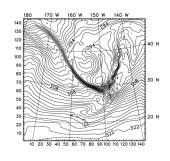
 \rightarrow 3D unstructured mesh discretisation \rightarrow see J. Szmelter's lecture





Multiscale atmospheric flows



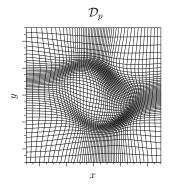


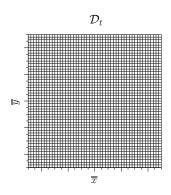


- → Extremely different local scales in atmospheric flows
- ightarrow Standard approach in atmospheric solvers of uniform mesh not optimal
- ightarrow Variable mesh applying locally finer/coarser spacing more efficient
- $\,\rightarrow\,$ Solution-adaptive mesh is able to conform to flow evolution



$$(\overline{x},\overline{y}) = (E(t,x,y),D(t,x,y)): \mathcal{D}_p \to \mathcal{D}_t$$





 \rightarrow moving mesh or r-adaptive technique (see Budd et al. AN 2009 for comprehensive discussion)

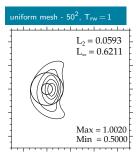


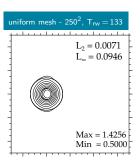
Scalar advection experiment

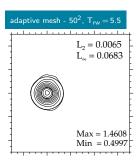
Time-dependent deformational shear flow (Blossey and Durran, JCP 2008) using advection scheme MPDATA (Smolarkiewicz IJNMF 2006) with moving meshes (Kühnlein et al. JCP 2012):



Scalar advection experiment







 \rightarrow T $_{rw}$ is relative wall clock time to uniform mesh run with 50^2 mesh cells (leftmost panel)



MMPDEs (Huang JCP 2001) govern time-dependent mapping (here 2D) from computational to physical space:

$$P(\mathbf{x}_h, M) \frac{\partial \mathbf{x}_h}{\partial \overline{t}} = \sum_{i,j=1,2} D_{ij}(\mathbf{x}_h, M) \frac{\partial^2 \mathbf{x}_h}{\partial \overline{x}^i \partial \overline{x}^j} + \sum_{i=1,2} C_i(\mathbf{x}_h, M) \frac{\partial \mathbf{x}_h}{\partial \overline{x}^i}$$

with coefficients

$$\begin{split} D_{ij}(\mathbf{x}_h, M) &= \nabla_h \, \overline{\mathbf{x}}^i \cdot M^{-1} \, \nabla_h \, \overline{\mathbf{x}}^j \ , \qquad \qquad C_i(\mathbf{x}_h, M) = -\nabla_h \, \overline{\mathbf{x}}^i \cdot \left(\sum_{k=1,2} \frac{\partial M^{-1}}{\partial \overline{\mathbf{x}}^k} \nabla_h \, \overline{\mathbf{x}}^k \right) \ , \\ P(\mathbf{x}_h, M) &= \mathcal{T} \, \sqrt{(D_{11})^2 + (D_{22})^2 + (C_1)^2 + (C_2)^2} \end{split}$$

MMPDEs are derived from variational principles as a minimiser of mapping functional

$$\mathcal{I}[\overline{\mathbf{x}}] = \frac{1}{2} \int_{\mathcal{D}_{\mathbf{g}}} \sum_{k=1}^{2} (\nabla \overline{\mathbf{x}}^{k})^{T} M^{-1} \nabla \overline{\mathbf{x}}^{k} d\mathbf{x}$$



One-dimensional stationary view on the MMPDE:

$$\mathcal{I}[\overline{x}] = \frac{1}{2} \int_{\mathcal{D}_p} \frac{1}{m} \left(\frac{\partial \overline{x}}{\partial x} \right)^2 dx$$

with Euler-Lagrange equation

$$\frac{\partial}{\partial \overline{x}} \left(m(x) \frac{\partial x}{\partial \overline{x}} \right) = 0 + BCs$$

 $\mathit{m}(x): \mathbf{S}_{\mathit{p}}
ightarrow \mathbb{R}^{+}$ is monitor function to control local mesh spacing



Number of grid increments: N = 20

• Example:

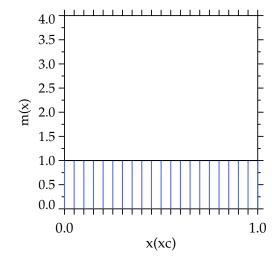
$$x(0) = 0, x(1) = 1$$

 $\overline{x}(0) = 0, \overline{x}(1) = 1$

$$m(x) = 1$$

$$\frac{\partial}{\partial \overline{x}} \left(m(x) \frac{\partial x}{\partial \overline{x}} \right) = 0$$

$$\Rightarrow \quad x = x(\overline{x})$$



Number of grid increments: N = 20

• Example:

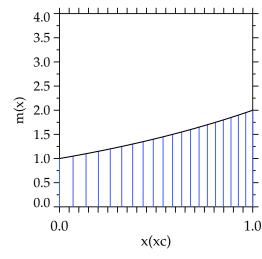
$$x(0) = 0, \ x(1) = 1$$

 $\overline{x}(0) = 0, \ \overline{x}(1) = 1$

$$m(x) = \exp(x \ln 2)$$

$$\frac{\partial}{\partial \overline{x}} \left(m(x) \frac{\partial x}{\partial \overline{x}} \right) = 0$$

$$\Rightarrow \quad x = x(\overline{x})$$



• Example:

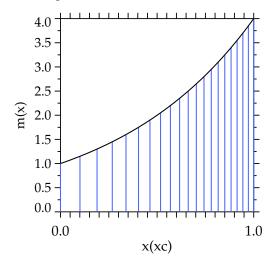
$$x(0) = 0, x(1) = 1$$

 $\overline{x}(0) = 0, \overline{x}(1) = 1$
 $m(x) = \exp(x \ln 4)$

$$\frac{\partial}{\partial \overline{x}} \left(m(x) \frac{\partial x}{\partial \overline{x}} \right) = 0$$

$$\Rightarrow \quad x = x(\overline{x})$$

Number of grid increments: N = 20



Moving mesh PDEs

 \rightarrow Monitor function M (2×2 matrix in 2D):

$$M = Iq$$

with scalar weighting function

$$q(t, \mathbf{x}_h) = 1 + rac{eta}{1-eta} rac{\Phi}{\langle \Phi
angle_h} \; ,$$
 I is identity matrix

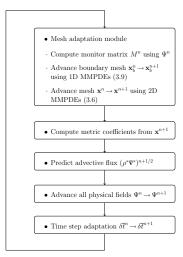
- $\rightarrow \Phi$ is mesh refinement indicator; $\langle \Phi \rangle_h$ denotes its horizontal average
- ightarrow 0 \leq eta < 1 controls strength of adaptation
- ightarrow q is filtered to obtain good quality mesh
- \rightarrow boundary conditions of 2D MMPDEs are either of Dirichlet-type for \mathbf{x}_h found by means of 1D MMPDEs

$$p(s,\mu)\frac{\partial s}{\partial \overline{t}} = \mu \frac{\partial^2 s}{\partial \overline{s}^2} + \frac{\partial \mu}{\partial \overline{s}} \frac{\partial s}{\partial \overline{s}}$$

along boundary segments or are assumed periodic, depending on BC of the model



Adaptive moving mesh solver



· In framework of two-time-level flow solver EULAG (Prusa et al. CF 2008, Kühnlein et al. JCP 2012)



Adaptive simulation of convective bubble

Combining the soundproof and compressible PDE solver (Smolarkiewicz et al. JCP 2014) with adaptive moving meshes:

$$(\overline{x},\overline{z})=(E(t,x,z),D(t,x,z)): \mathcal{D}_p\to\mathcal{D}_t$$

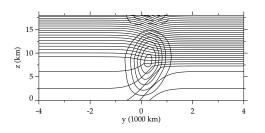
Durran SI

compressible SI



- ightarrow zonally-periodic channel 10000 km imes 8000 km imes 18 km
- → baroclinically unstable jet flow (Bush and Peltier, JAS 1994)
- \rightarrow perturb initial state by local θ -anomaly at tropopause
- \rightarrow integrate for 12 days
- \rightarrow Coordinate mapping:

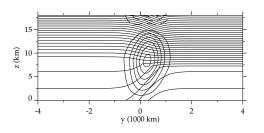
$$(\overline{x}, \overline{y}, \overline{z}) = (E(t, x, y), D(t, x, y), C(t, x, y, z)) : \mathcal{D}_p \to \mathcal{D}_t$$





- ightarrow zonally-periodic channel 10000 km imes 8000 km imes 18 km
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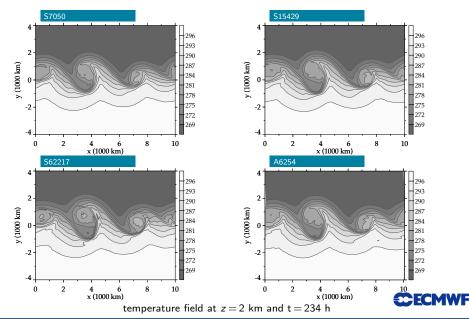
$$(\overline{x},\overline{y},\overline{z}) = (\underline{E}(t,x,y),\underline{D}(t,x,y),C(t,x,y,z)): \mathcal{D}_p \to \mathcal{D}_t$$



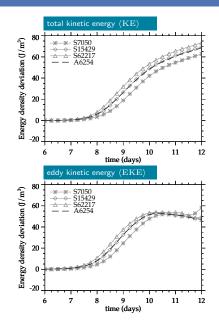


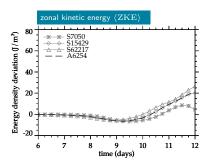
(Kühnlein et al. JCP 2012)





Domain-averaged kinetic energetics with integration time







Sensitivity to mesh refinement indicator

Simulation	Refinement indicator $\Phi(t, x, y)$	$\varepsilon_{ m \langle KE angle}$	$\varepsilon_{ m \langle ZKE angle}$	$\varepsilon_{\langle \mathrm{EKE} \rangle}$
S7050	-	6.43	4.99	4.84
S15429	-	2.58	1.66	1.90
A6254a	$\frac{1}{H} \int_0^H \ \nabla_h \theta \ dz$	2.82	1.67	1.80
A6254b	$\ \nabla_h \theta(z=600 \text{ m})\ $	3.75	2.64	2.28
A6254c	$\ \nabla_h \theta(z=3000 \text{ m})\ $	2.91	1.57	1.92
A6254d	$\ \nabla_h \theta(z = 5100 \text{ m})\ $	2.98	2.43	1.98
A6254e	$\frac{1}{H} \int_0^H \ \nabla \times \mathbf{v} \ dz$	2.90	2.10	1.83
A6254f	$\frac{1}{H} \int_0^H PV dz$	3.81	2.31	2.45
A6254g	PV(z = 5100 m)	4.65	2.48	2.97
A6254h	PV(z = 9000 m)	4.22	2.62	2.64
A6254i	$\frac{1}{H} \int_0^H \ \nabla_h PV \ dz$	3.82	2.36	2.65
A6254j	$\frac{1}{H} \int_0^H PV dz$, $\frac{1}{H} \int_0^H \ \nabla_h PV\ dz$	3.84	2.27	2.52
A6254k	$\frac{1}{H} \int_0^H EPV dz$	10.77	5.43	8.57
A6254I	EPV(z = 5100 m)	9.50	4.60	7.56
		1		

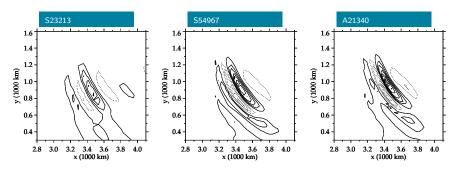
$$\mathcal{E}_{\vartheta} = \left(\frac{1}{N_o} \sum_{i=1}^{N_o} \left(\vartheta_i - \vartheta_i^R\right)^2\right)^{1/2} \qquad \forall \quad \vartheta = \left\langle \text{KE} \right\rangle \,, \left\langle \text{ZKE} \right\rangle \,, \left\langle \text{EKE} \right\rangle$$

- $\rightarrow \vartheta^{R}$ is high-resolution reference simulation S62217 with static uniform mesh
- \rightarrow $N_o = 48$ is number of 6-hourly model outputs over integration period of 12 days



Multiscale performance

 \rightarrow Representation of internal gravity waves occurring in response to imbalances in the evolving baroclinic wave flow:

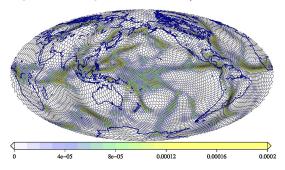


vertical velocity field at z = 12 km and t = 246 h



Adaptive moving meshes on the sphere

→ Mesh generation using optimal transport (Weller et al. JCP 2016):





Adaptive moving meshes

Adaptive moving meshes:

- + efficient way of employing mesh adaptivity
- + keeps grid/data structure
- less flexible than h- or hr-adaptive techniques
- → Mesh refinement criteria ?
- → Subgrid-scale parameterisations ?
- $\rightarrow \dots$
- Behrens, "Adaptive atmospheric modeling", Springer 2006
- Weller et al. BAMS 2010
- \Rightarrow Workshop on moving and adaptive meshes for global atmospheric modelling,
- 3-5 Sep 2018, University of Reading

