### Kinetic Energy Spectra and Model Filters Bill Skamarock NCAR/MMM







(Courtesy of Morris Weisman)

# **Applications?**

Existing and future applications require meso-scale and cloud-scale resolution in a global model.

Why use higher resolution?

- Explicitly simulate convective systems:
  - Capture system evolution (growth, decay, propagation).
  - Resolve moisture redistribution, cloud systems.
  - Remove need for deep convection parameterization (with sufficient resolution  $\Delta x < a$  few km).
- Explicitly simulate gravity waves, wave breaking:
  - Remove the need for gravity-wave drag parameterization.
- Better resolution of external forcing:
  - topography, land-use, etc.

# What is Wrong With Our Existing Global Models?

- They do not scale to 10<sup>4</sup> 10<sup>5</sup> processors. (e.g. lat-long grid models)
- 2. They were not constructed for mesoscale/cloudscale application.

#### **Kinetic Energy Spectra**



#### **Structure Functions: Kurtosis (flatness factor)**



Kurtosis = 3 for a Gaussian PDF

Strong growth of the kurtosis at small scales indicates significant intermittency.



## WRF Decomposed Spectra Spring Experiment 2005 Forecast

$$V = V_{\psi} + V_{\chi} + V_{def}$$

$$V_{\psi} \text{ rotational component}$$

$$V_{\chi} \text{ divergent component}$$

$$V_{def} \text{ deformational component}$$

$$V_{\psi} = k \times \nabla \psi$$

$$V_{\chi} = \nabla \chi$$

$$V_{def} = V - V_{\psi} - V_{\chi}$$

$$\nabla^{2}\psi = \zeta, \quad \zeta = k \cdot \nabla \times V$$

$$\nabla^{2}\chi = D, \quad D = \nabla \cdot V$$

$$10^{0}$$

$$U^{0} = \frac{10^{3}}{10^{4}}$$

$$U^{0} = \frac{10^{4}}{10^{4}}$$

$$U^{0} = \frac{10^{4}}{10$$



Wavelength (km)

# Recap: Atmospheric Dynamics

- 1. KE spectra: Transition from  $k^{-3}$  (large scales) to  $k^{-5/3}$  (meso- and smaller scales).
- 2. Kurtosis: Strong intermittency at meso- and smaller scales.
- 3. Turbulence theory + observed spectrum: Shorter timescale for spinup and predictability.
- 4. Model results (and some observations): KE spectrum is rotational at large scale, divergent at small scales.

# How well do atmospheric models reproduce these statistics?

- 1. Some models do well.
- 2. Some models do not do well.
- 3. For many models, we do not know.

#### Spectra for WRF-ARW BAMEX Forecasts, 5 May – 14 July 2003



#### **Spectral Characteristics and Effective Resolution**

Schematic of some typical atmospheric spectra



#### Spectra for WRF-ARW, -NMM DWFE 7-25 January 2005 forecasts (using 24, 27, 30, 33, 36, 39, 42 and 45 h forecast times)

ARW

NMM



## ECMWF model



(courtesy of Tim Palmer, 2004)

# Where are we?

- Some Eulerian models produce a k<sup>-3</sup> k<sup>-5/3</sup> spectral transition at mesoscale resolutions; effective resolution depends on filtering.
  - How should the filtering change with resolution?
- Other Eulerian models do not produce a clean k<sup>-5/3</sup> spectral transition why?
- Semi-Lagrangian semi-implicit models?
  - At high resolution (dx  $\sim$  km's) the SLSI models show a transition.
  - At mesoscale resolutions (dx >= 10 km): No transition!
     What is causing this behavior in SLSI schemes?

# Filtering in models

- Damping in time-integration schemes
- Filtering in interpolation schemes (SL)
- Dissipation implicit in transport schemes (temporal or spatial)
- Explicit filters

**Spatial filters** 



Horizontal divergence damping

$$\frac{\partial u_i}{\partial t} = \dots + \nu_d \frac{\partial}{\partial x_i} \nabla_h \cdot \mathbf{V}$$

# Eulerian Cores (NMM)

Horizontal divergence damping examples

The current operational NWP model (regional North-American Model), 2005 Winter Forecast Experiment.



(Skamarock and Dempsey 2005)

# Which Model Uses Horizontal Divergence Damping?

Radar reflectivity (080606, 7 pm CST)





#### From C. Jablonowski

Temperature at 850 mbar pressure surface (K)



Temperature at 850 mbar pressure surface (K)



- Example: alternative 3D inertio-gravity wave test with background flow
- Model CAM FV 1°x 1° L20 at day 5.5, lat-lon cross section at 850 hPa
- Numerical stability of CAM FV depends on the resolution- and time step dependent choice of the divergence damping coefficient c

latitude (degrees\_north)

atitude (degrees\_north)

From C. Jablonowski, aquaplanet simulations

Effects of the divergence damping and order of accuracy on the Kinetic Energy spectrum (test 2-0-0)



Blue: PPM, **no** divergence damping

Green: PPM, standard divergence damping

Accumulation of energy at small scales without divergence damping

Model: CAM FV, plot provided by D. Williamson (NCAR)

From C. Jablonowski, aquaplanet simulations

 Without diffusion (here divergence damping): divergent part of the flow responsible for the hook



plots provided by D. Williamson (NCAR)

#### From C. Jablonowski

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Divergence operators:

$$\nabla \cdot V = \delta_x \overline{\overline{u}}^{\overline{x}y} + \delta_y \overline{\overline{v}}^{\overline{x}y} \qquad \nabla \cdot V = \delta_x \overline{u}^x + \delta_y \overline{v}^y \qquad \nabla \cdot V = \delta_x u + \delta_y v \\ \overline{\overline{\delta_x u}}^{\overline{x}y} + \overline{\overline{\delta_y v}}^{\overline{x}y} \qquad \overline{\delta_x u}^x + \overline{\delta_y v}^y \\ \overline{\overline{\delta_x u} + \delta_y v}^{\overline{x}y}$$

#### Semi-Lagrangian models Consider the 1D linear shallow-water equations...

**Continuous equations** 

01

linearize 
$$\rightarrow$$
 U = U + u(x,t)  $\frac{du}{dt} + g\frac{\partial h}{\partial x} = 0$   
H = H + h(x,t)  $\frac{dh}{dt} + H\frac{\partial u}{\partial x} = 0$ 

**SLSI** discretization

$$u^{t+\Delta t} = \left(u^t - \frac{1-\epsilon}{2}\Delta tg\delta_x h\right) \Big|_d^t - \left(\frac{1+\epsilon}{2}g\delta_x h\right) \Big|^{t+\Delta t}$$
$$h^{t+\Delta t} = \left(h^t - \frac{1-\epsilon}{2}\Delta tH\delta_x u\right) \Big|_d^t - \left(\frac{1+\epsilon}{2}H\delta_x u\right) \Big|^{t+\Delta t}$$

### SLSI Amplification Factor (Gravel et al, MWR 1993)

$$\frac{E}{\rho} = \frac{1 - \gamma_3 (1 - \epsilon^2) \pm 2\gamma_3^{1/2}}{1 + \gamma_3 (1 + \epsilon)^2}$$

where

E is the amplification factor

 $\rho$  is the response function for the SL advection

 $\gamma_3 = gHK^2 \left(\frac{\Delta t}{2}\right)^2$ 

 $|\rho| \leq 1 \text{ and } 0 \leq \epsilon \leq 1 \rightarrow \text{absolutely stable}$ 

for stability,  $0.1 \le \epsilon \le 0.2$  in NWP models

#### **Time-steps and Courant Numbers**

Damping arises from temporal off-centering and SL advection

Typical Eulerian model Adv. Courant numbers 0 < |Cr| < .2 (>90%)

Typical SLSI model Adv. Courant numbers 0 < |Cr| < 1 (>90%)



Velocity distribution from 22 January DWFE CONUS WRF forecast.



# Damping in SLSI schemes

Consider a gravity wave...

10 km grid, 60 s RK3 timestep 60 s SLSI timestep C dt/dx = 0.1 (C=16.67 m/s) 80 km wavelength 300 min eddy turnover time Cubic SL interpolation

Result: Using an Eulerian timestep, damping in SLSI models arises almost entirely from the interpolation in the SL advection.



# Damping in SLSI schemes

Consider a gravity wave...

10 km grid, 300 s SL timestep C dt/dx = 0.5 (SLSI) (C=16.6667 m/s) 80 km wavelength 300 min eddy turnover time Cubic SL interpolation

Result: Using a typical SLSI timestep, damping in SLSI models arises primarily from the semiimplicit time-step off-centering



## ECMWF model



(courtesy of Tim Palmer, 2004)

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Eulerian and SLSI schemes:

• Horizontal divergence damping inappropriate for meso/cloud scales.

#### SLSI schemes:

- Difficulties resolving spectral transition at mesoscale resolutions.
   Eulerian timesteps significant damping from interpolations (SL)
   SL timesteps significant damping from time-off-centering (SI)
- Alternatives?

#### Eulerian schemes:

- More flexibility for "tuning" dissipation.
  - RK3, Leapfrog time-split schemes generally resolve mesoscale transition.
- Need tuning (additional dissipation) at cloud-permitting scales.

#### Mesoscale-Cloudscale Energetics:

• What is the character of the turbulence? (how do we parameterize it?)

## Kinetic Energy Spectra and Model Filters

- Filters affect a model's ability to reproduce observed energetics.
- Large-scale and meso/cloud-scale energetics are fundamentally different.
- Global applications are moving to meso- and cloud- scale.



# Filtering in Atmospheric Models

increasing length/time scales	scale	<u>grid length (dx)</u>	explicit filters Weak/No theoretical basis	Implicit filters Weak/No theoretical basis
climate │ ↓ nwp ↓ (global)	synoptic	dx > 50 - 100 km	n <sup>th</sup> order spatial filters Smagorinsky (viscosity ~ deformation)	horz. divergence damping, temporal filtering, damping adv. schemes
	mesoscale hydrostatic	dx < 50 - 100 km	n <sup>th</sup> order spatial filters Smagorinsky (viscosity ~ deformation)	(SL, FCT, WENO, other upwind schemes)
	nonhydrostati cloud-scale	c dx < 5 - 10 km dx > 200 m	n <sup>th</sup> order spatial filters Smagorinsky (viscosity ~ deformation) LES-type subgrid mixing	temporal filtering,
	LES	dx < 200 m dx > cm's	LES subgrid mixing model	(SL, FCT, WENO, other upwind schemes)
decreasing length/time	DNS	dx ~ cm's or less	Full Navier-Stokes, No approximations.	Do some of these schemes adequately mimic LES models?
scales	V		Strong theoretical basis	