

*Spatially localized analysis of  
dynamically adaptive spectral-  
element simulations*

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*Turbulent theory and modeling, IMAGE Theme for 2008,*



# Atmospheric vortices contain significant multiscale nonlinear interactions



Figure 1. Left: space-shuttle STS-66 photograph of cloud formations due to von Kármán vortices near Heard Island, 1994/11 (NASA Science Photo Library E120/457). Right: same, chromatically adjusted to suppress some non-vortical features, and annotated to show a scale  $\approx 20\text{km}$ , (anti-)cyclonic vortex centers + (-) and approximate hyperbolic points (x).



# Spectral method: some cons

(thanks to M. Taylor)

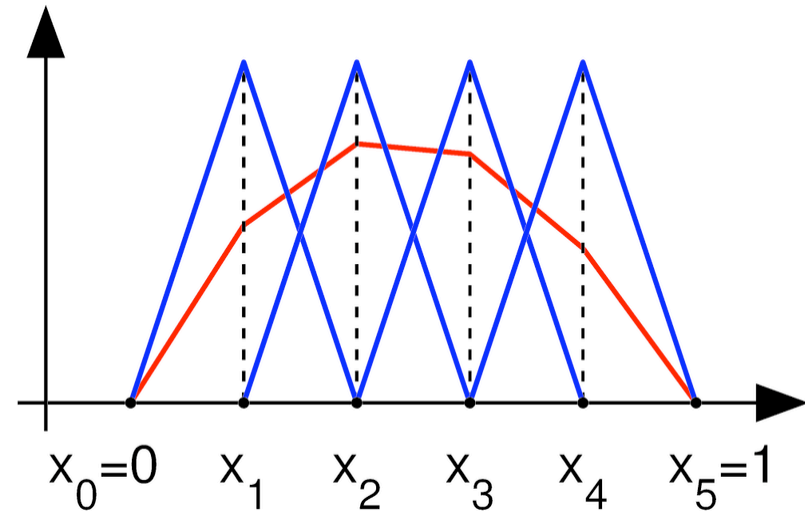
Spectral methods are excellent, except:

- Nonlinear terms must be computed in physical space.
- An fFt costs  $\mathcal{O}[M \log M]$ , but other geometries require transforms costing  $\mathcal{O}[M^2]$  for each coordinate.
- Transforms require all-to-all communication that reduces parallel-computation scaling.
- Global Fourier analysis obscures physical-location information.



# Finite-element method, roughly (wikipedia image)

The **red** curve approximates a smooth function  $\psi[x]$  as a weighted sum of 4 **blue** “tent” functions  $\phi_k[x]$ . One can state *exactly* :



$$\psi[x] = \sum_{k=1}^4 (\psi[x_k] \phi_k[x] + \frac{1}{2} (x - x_k)(x - x_{k\pm 1}) \psi''[\xi_k^\pm[x]])$$



# FEM pros & cons

- Nonlinear terms are straightforward.
- Complicated geometries and bcs can be treated.
- Efficient parallelization.
- Generally, error goes like  $h^1$  or  $h^2$ , where  $h$  is the size of the largest element.
- Recovered spectral information tends to be poor.



# SEM, roughly

(e.g., Fournier et al. *MWR* 2004)

Where FEM uses a basis

$\phi_k[\vec{x}]$  that is piecewise

linear and interpolating,

SEM uses  $\phi_{\vec{j},k}[\vec{x}]$

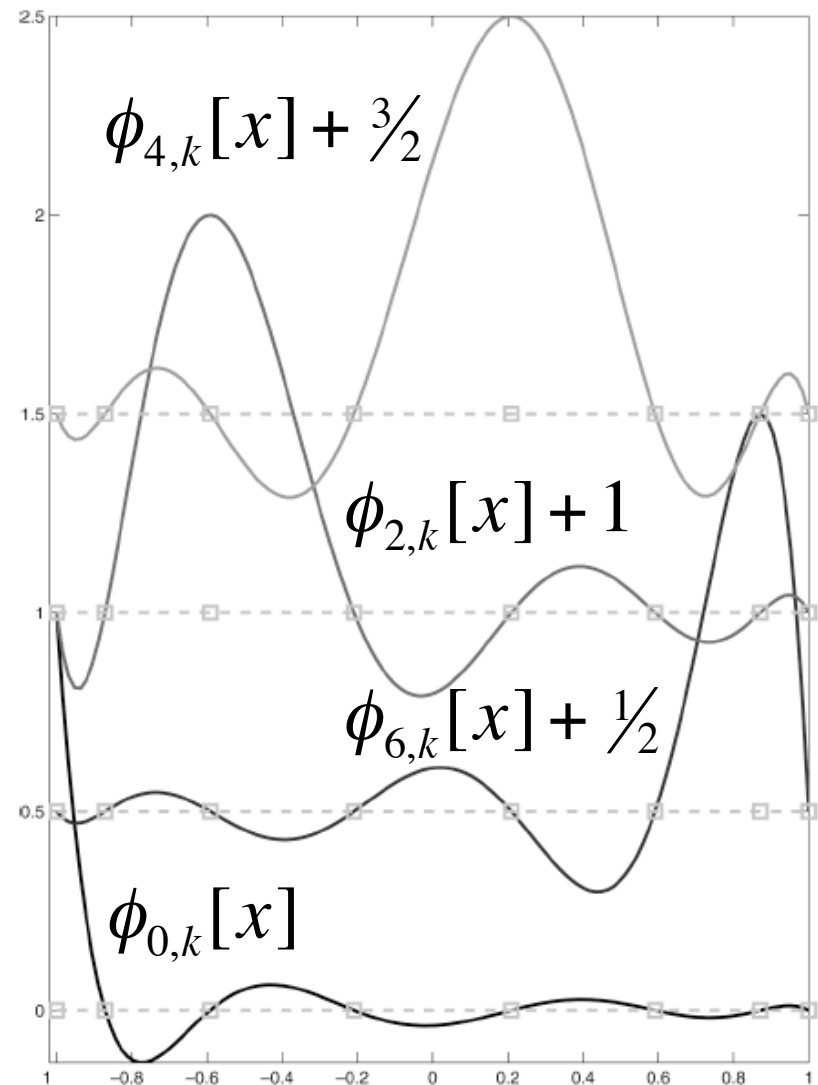
that is piecewise degree- $p$

polynomial and

interpolates  $p-1$  additional

interior points per

direction:  $\phi_{\vec{i},k}[\vec{x}_{\vec{j},l}] = \delta_{\vec{i},\vec{j}} \delta_{k,l}$ .





# SEM, roughly ... (e.g., Fournier et al. *MWR* 2004)

The Gauss-node distribution enables the  $\phi_{j,k}[x]$  representation to be as accurate as a Fourier-Legendre expansion in each direction.

For example, the error  $\tilde{\psi}[x]$  in solving  $\psi'' + \omega^2\psi = f$  is bounded as  $\|(d/dx + i\omega)\tilde{\psi}\| \leq C_s h^{\min[p,s]} p^{-s} \|\psi_{\text{true}}^{(s+1)}\|$  assuming  $\|f^{(s-1)}\| < \infty$ , similar to spectral method!



# Fourier analysis on spectral elements

(Fournier *J. Comp. Sci.* 2006)

- $C^0$ -continuous and  $C^1$ -discontinuous implies that standard  $N^d$ -point uniform cubature for the Fourier coefficient  $u_{\mathbf{q}}$  potentially commits an  $O(N^{-d-1})$  error.
- *This* error can be *completely* eliminated starting from known (Legendre polynomial) $_{\mathbf{q}}$ .





# Analysis of $\sin qx$ using 1D spectral elements

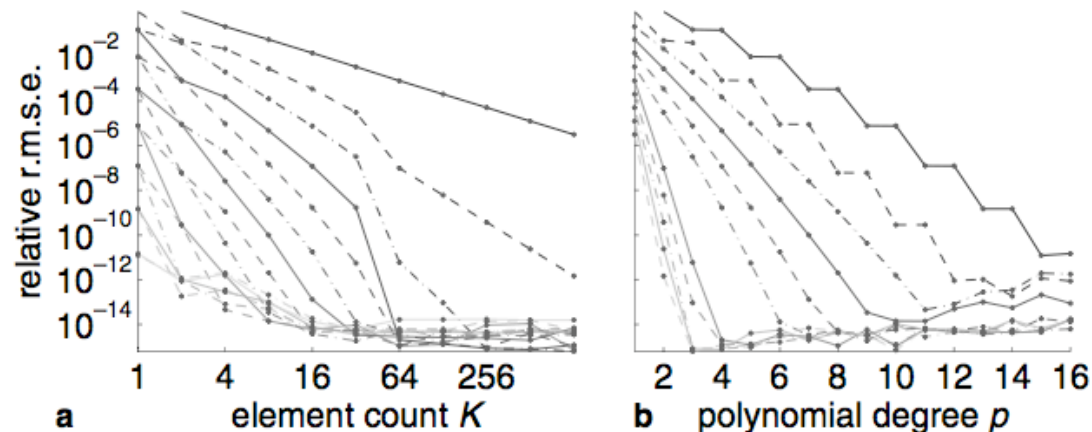
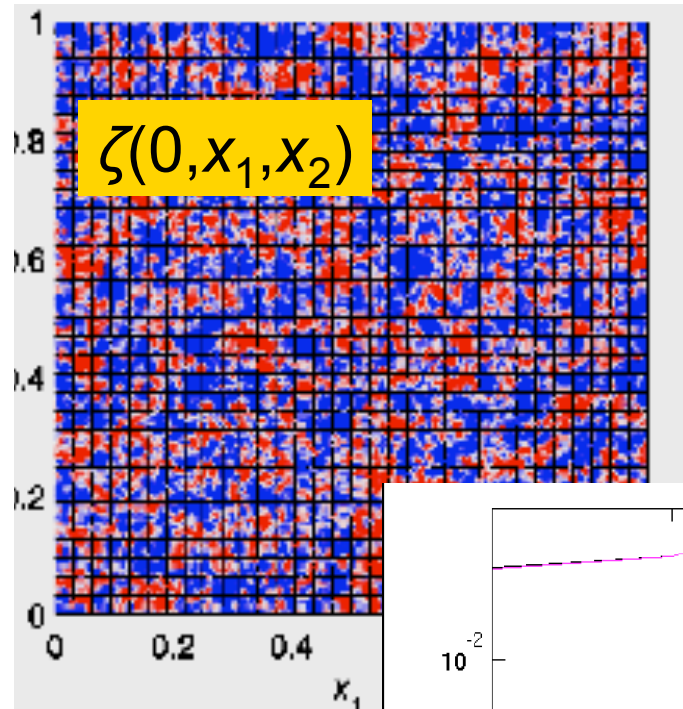


Fig. 1. Relative r.m.s. error in (3) for  $u(x) = \sin x$ , (a) vs.  $K = 2\pi/h$  for  $p \in \{1, \dots, 16\}$  (dark to light), and (b) vs.  $p$  for  $\log_2 K \in \{0, \dots, 10\}$  (dark to light).

E.g., at degree  $p=2$  or 8, need  $K=1024q$  or  $8q$  elements ( $Kp$  points) to compute Fourier coefficient to 12 digits.

Fournier 2006.





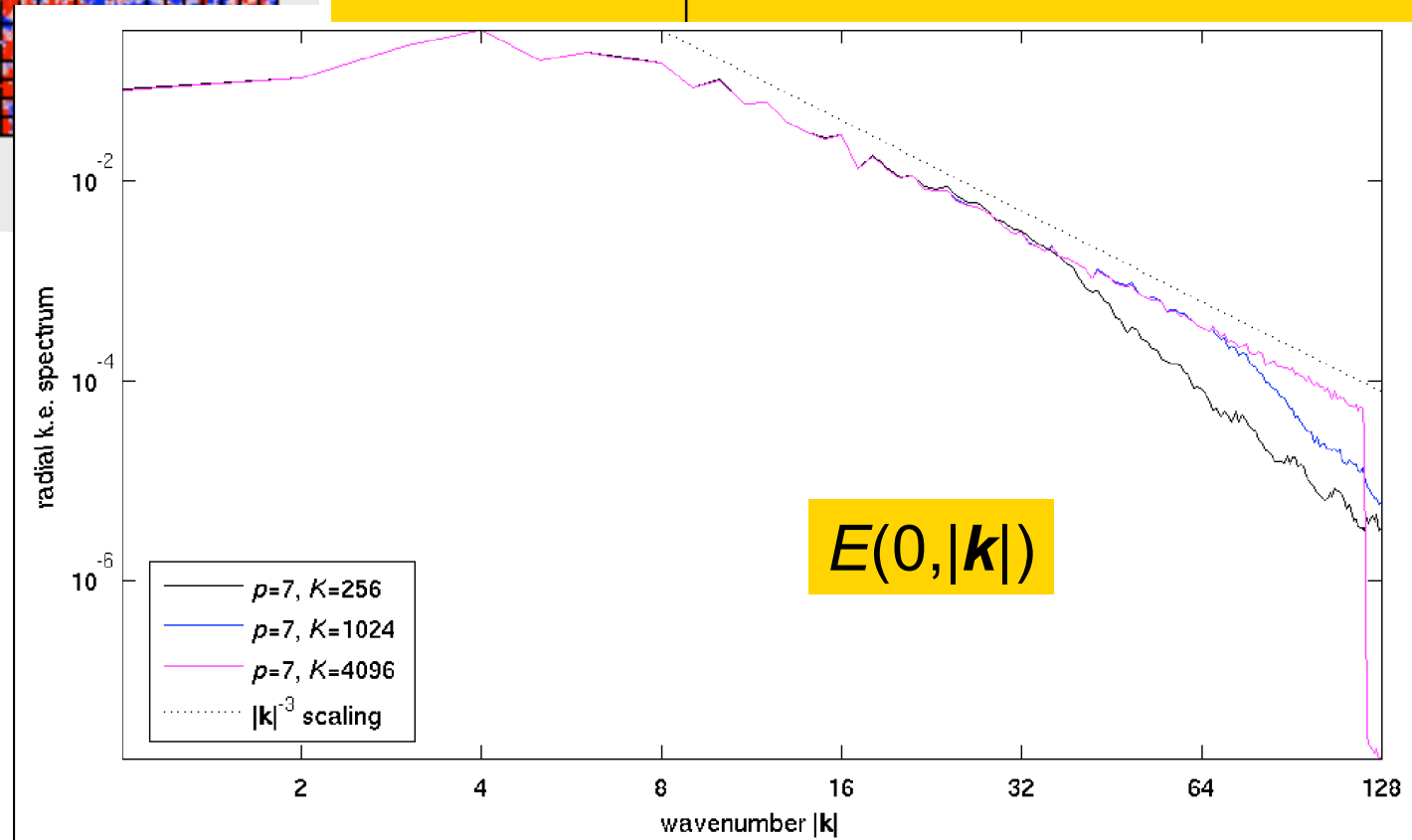
## Decaying incompressible Navier-Stokes: scaling $E(0, |k|)$ , random phase i.c.

$p = 7$

$K = 16^2, 32^2, 64^2$

Initial condition: Matthaeus, Stribling,  
Martinez, Oughton & Montgomery 1991  
(dealiased pseudospectral,  $512^2$  d.o.f.).

GASpAR simulation code: Rosenberg,  
Fournier, Fischer & Pouquet 2006.

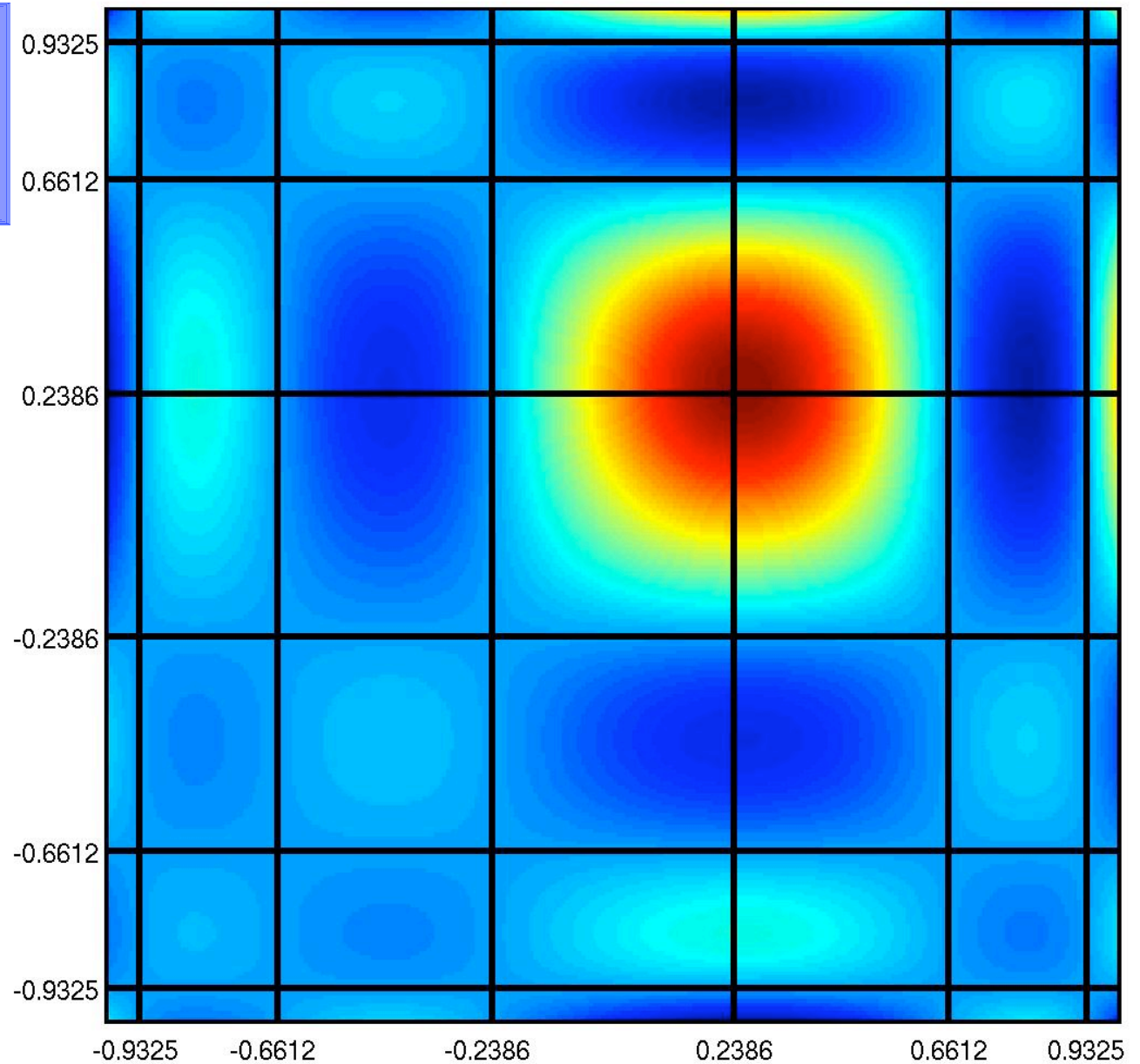


## 2D Spectral elements

- Patera 1984,
- Karniadakis & Sherwin 1999,
- Deville et al. 2002

Here's 1 of  
36 basis  
functions

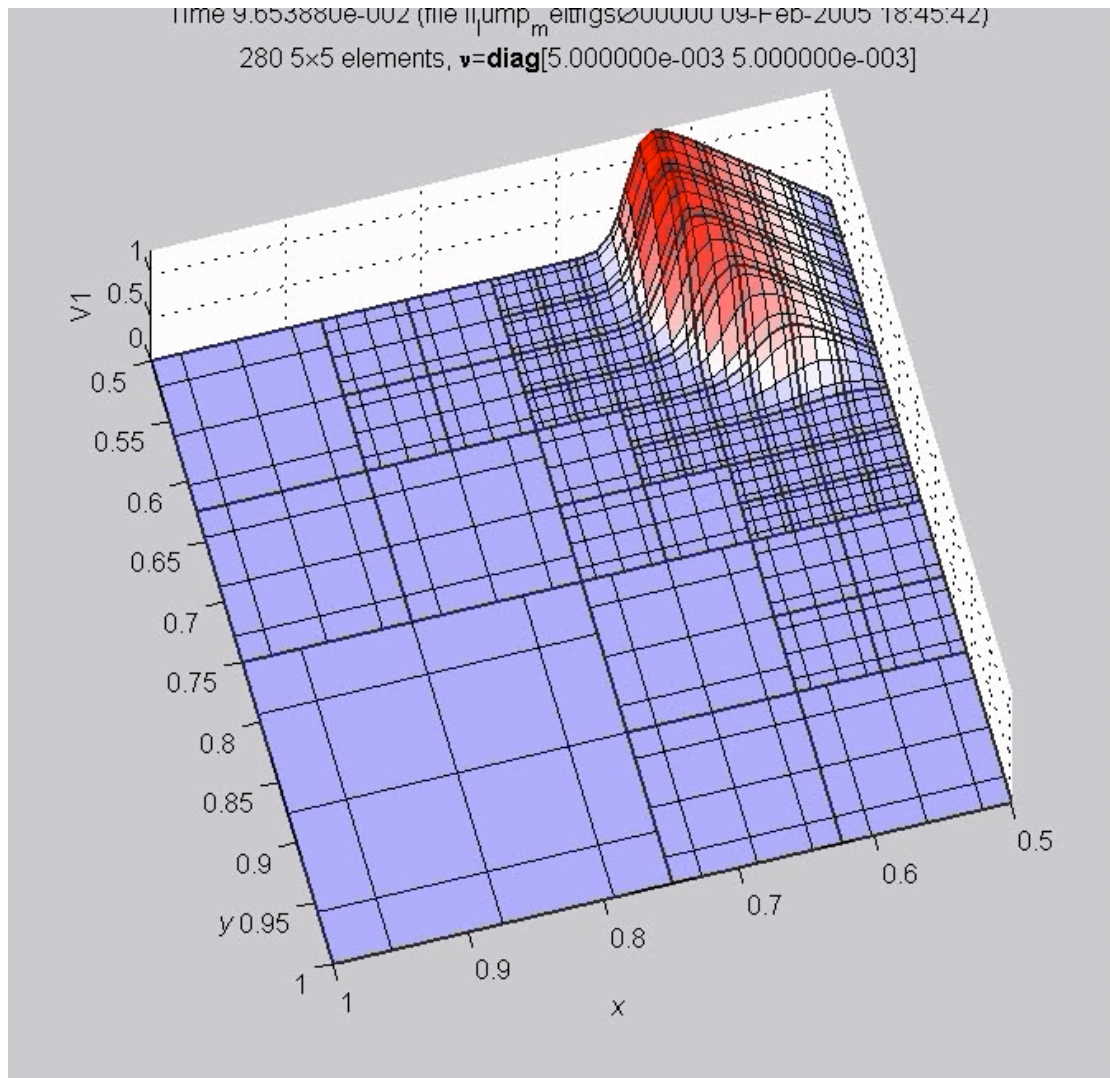
$\phi_j$ :



# 2D Burgers eq., $Re=200$

Adaptive  
*nonconforming*  
refinement for a  
nonlinear radial  
“N-wave”. Each  
element has  
degree  $p=4$ .

Rosenberg, Fournier, Fischer &  
Pouquet 2006.



# Decaying incompressible Navier-Stokes: 3 vortices

Degree  $p = 7$ , element count  $K$  varies.

Viscosity  $\nu$ , 1-vortex circulation  $\Gamma$

Reynolds nu.  $Re = \Gamma / \nu = 2 \times 10^4$

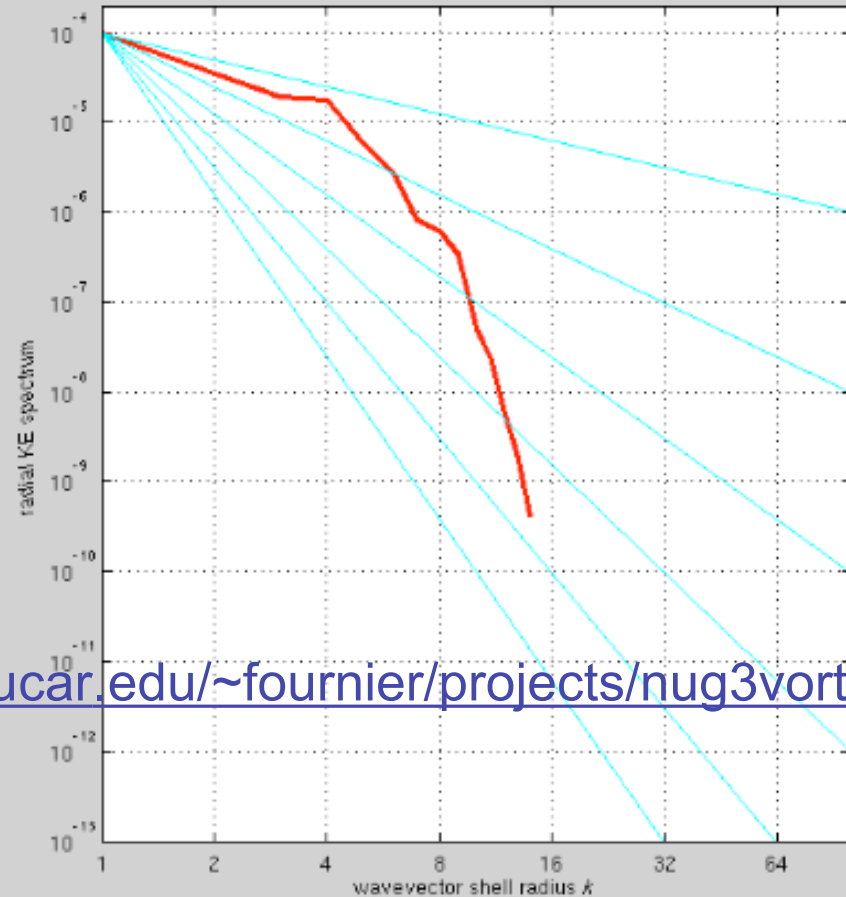
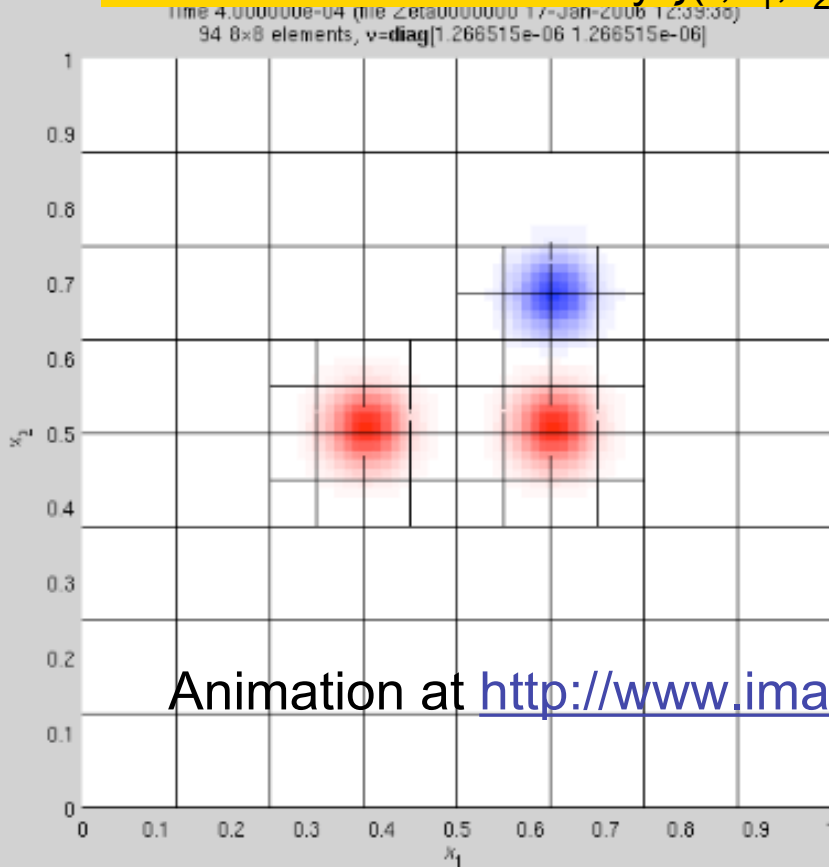
Initial condition: Schneider, Kevlahan & Farge 1997.

GASpAR simulation code: Rosenberg, Fournier, Fischer & Pouquet 2006;  
F, R & P *GAFD* submitted 2008.

Fourier analysis exact for SEM: Fournier 2006.

vorticity  $\zeta(t, x_1, x_2)$

energy spectrum  $E(t, |\mathbf{k}|)$



Animation at <http://www.image.ucar.edu/~fournier/projects/nug3vort/>

Note,  $|((d/dt)_{\alpha(\Delta t^2)} E) / 2\nu Z + 1| < 8 \times 10^{-3} \forall t$





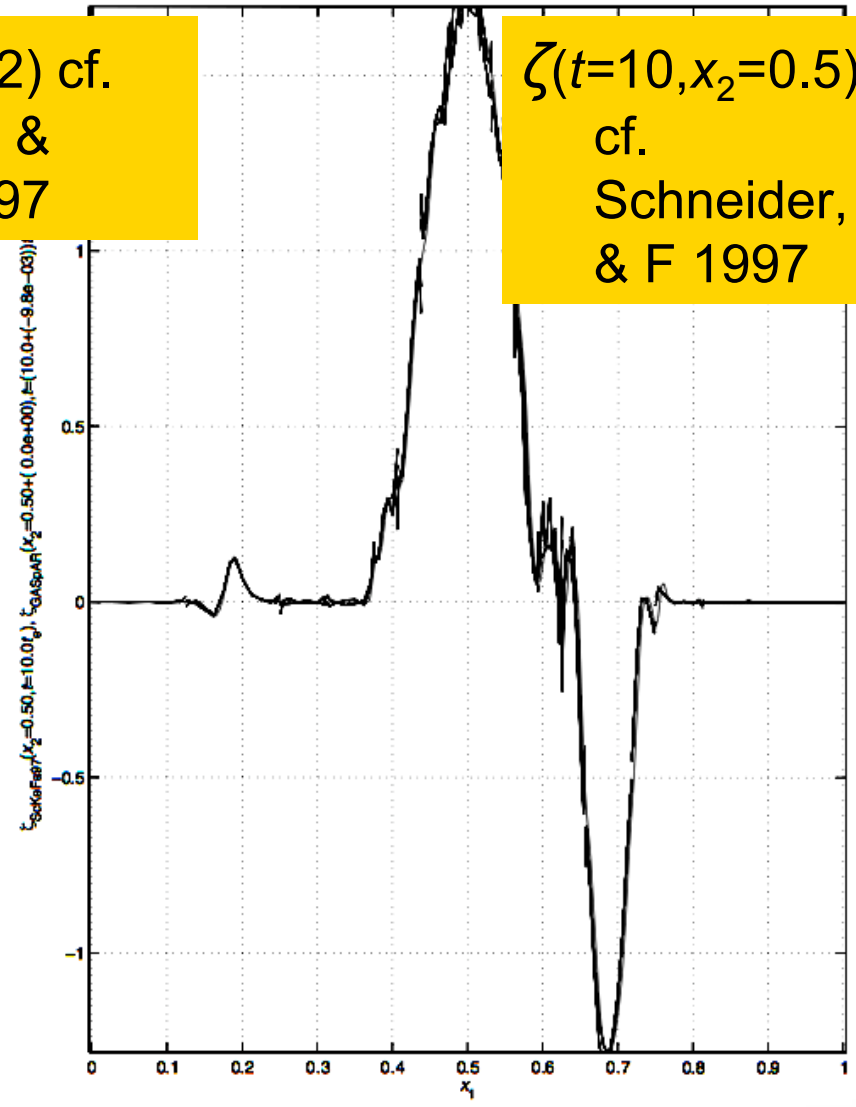
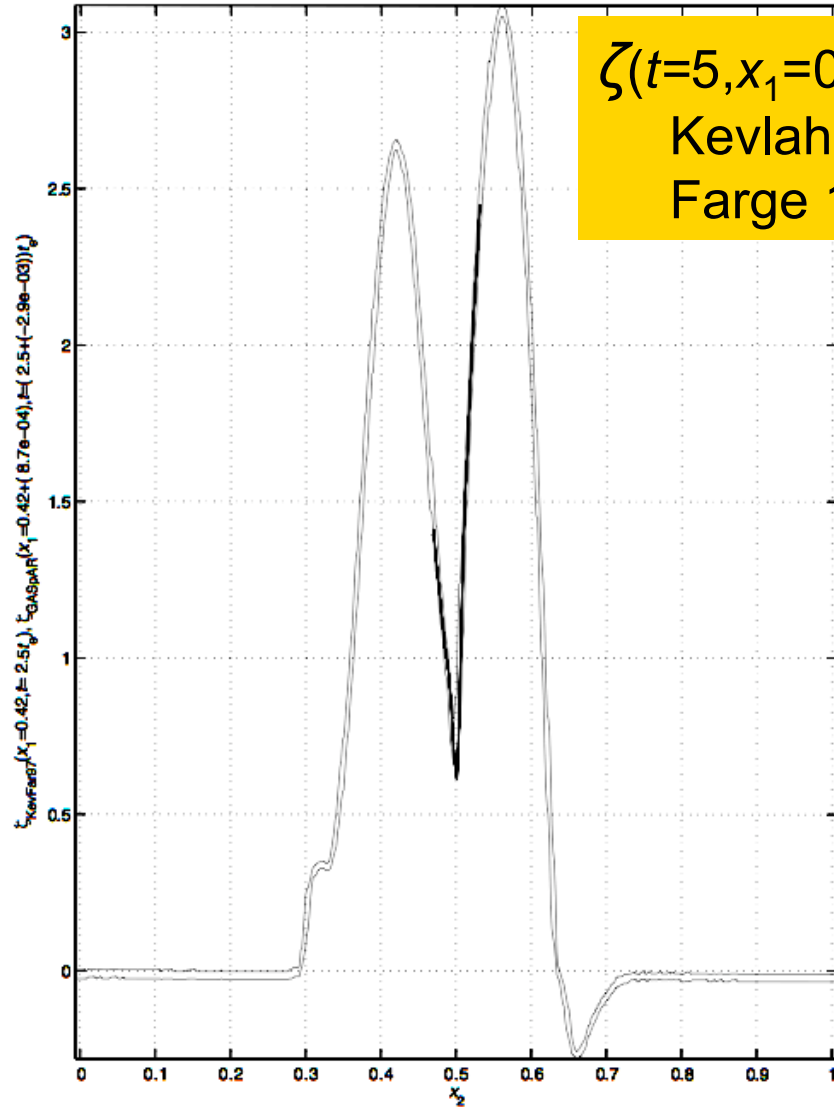
# Decaying incompressible Navier-Stokes: 3-vortex slice comparison

Degree  $p = 7$ , element count  $K$  varies.

Reynolds nu.  $Re = \Gamma/\nu = 2 \times 10^4$

Initial condition: Schneider, Kevlahan & Farge 1997.

GASpAR simulation code: Rosenberg, Fournier, Fischer & Pouquet 2006.



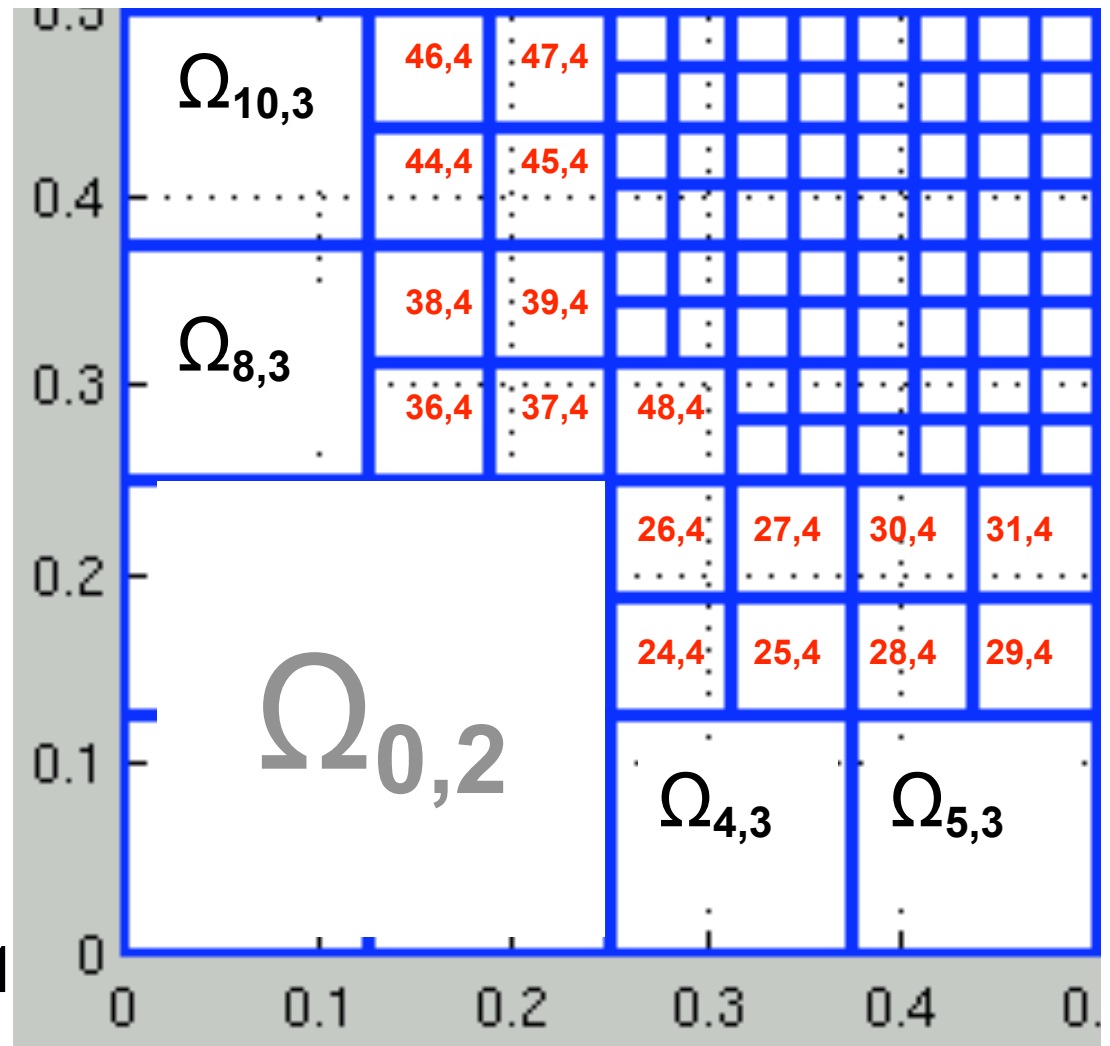
# Multiresolution spectral elements

Fournier, Beylkin & Cheruvu 2005; Fournier 2008

*New kind of MRA:*

define  $\tilde{\mathbf{u}}_{k,\ell}$  to contain the extra info. filtered out by merging element  $\Omega_{k,\ell}$  with its  $2^d - 1$  “sibling” elements.

$$\phi_{k,\ell} = \sum_i \mathbf{H}_i \phi_{2^d k + i, \ell + 1}$$





# Decaying incompressible Navier-Stokes: 3 vortices (cont.)

$\rho = 16, K = 32^2$

$Re = \Gamma / \nu = 5.07 \times 10^3$

$\ell = 6$  multiresolution levels

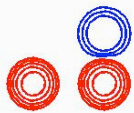
Initial condition: Schneider, Kevlahan & Farge 1997.

GASpAR simulation code: Rosenberg, Fournier, Fischer & Pouquet 2006.

Multiresolution analysis based on continuous SEM: Fournier 2006.

$\zeta(t=0.0)$  from 3vortex\_nr0\_n17\_nu5e-6

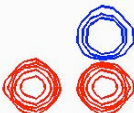
All scales



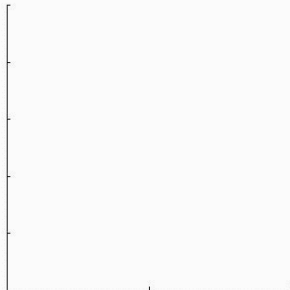
Animation at <http://www.image.ucar.edu/~fournier/projects/nugmasse/>

MRA scale filtering

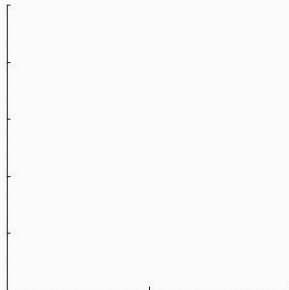
Level 0



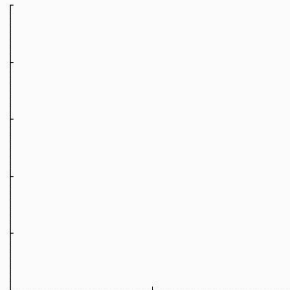
Level 1



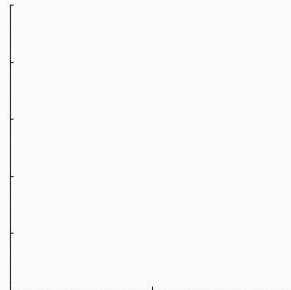
Level 2



Level 3

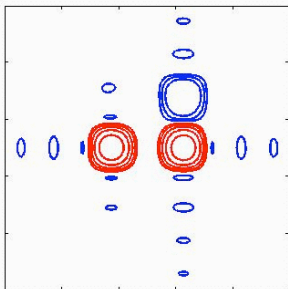


Level 4

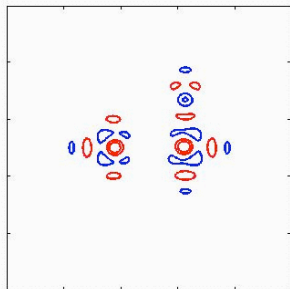


Sharp scale filtering

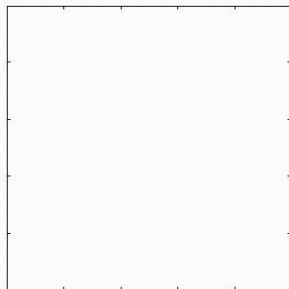
$\{0 \leq \max_{\alpha} |k_{\alpha}| \leq 8\}$



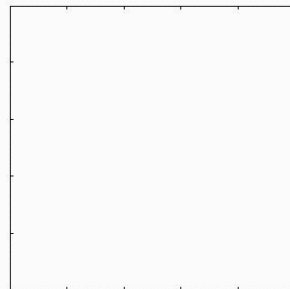
$\{9 \leq \max_{\alpha} |k_{\alpha}| \leq 16\}$



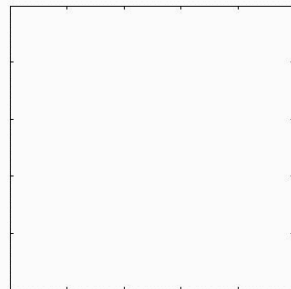
$\{17 \leq \max_{\alpha} |k_{\alpha}| \leq 32\}$



$\{33 \leq \max_{\alpha} |k_{\alpha}| \leq 64\}$



$\{65 \leq \max_{\alpha} |k_{\alpha}| \leq 128\}$



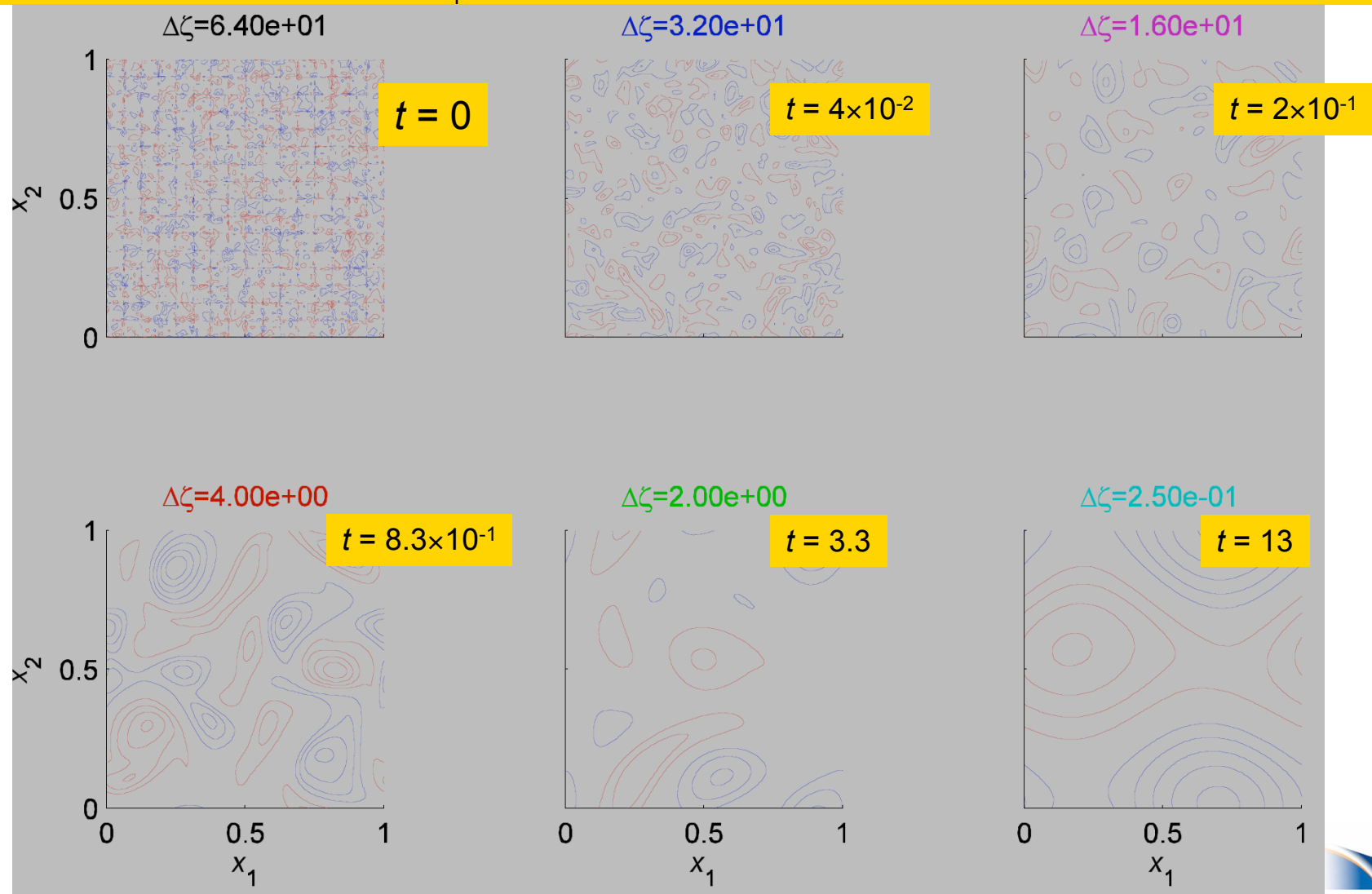
# Decaying incompressible Navier-Stokes: scaling- $E$ , random phase i.c.

$$\rho = 7, K = 16^2$$

$$\text{Re} = U_{\text{rms}}(0)L/\nu = 4000$$

Initial condition: Matthaeus, Stribling, Martinez, Oughton & Montgomery 1991.

GASpAR simulation code: Rosenberg, Fournier, Fischer & Pouquet 2006.



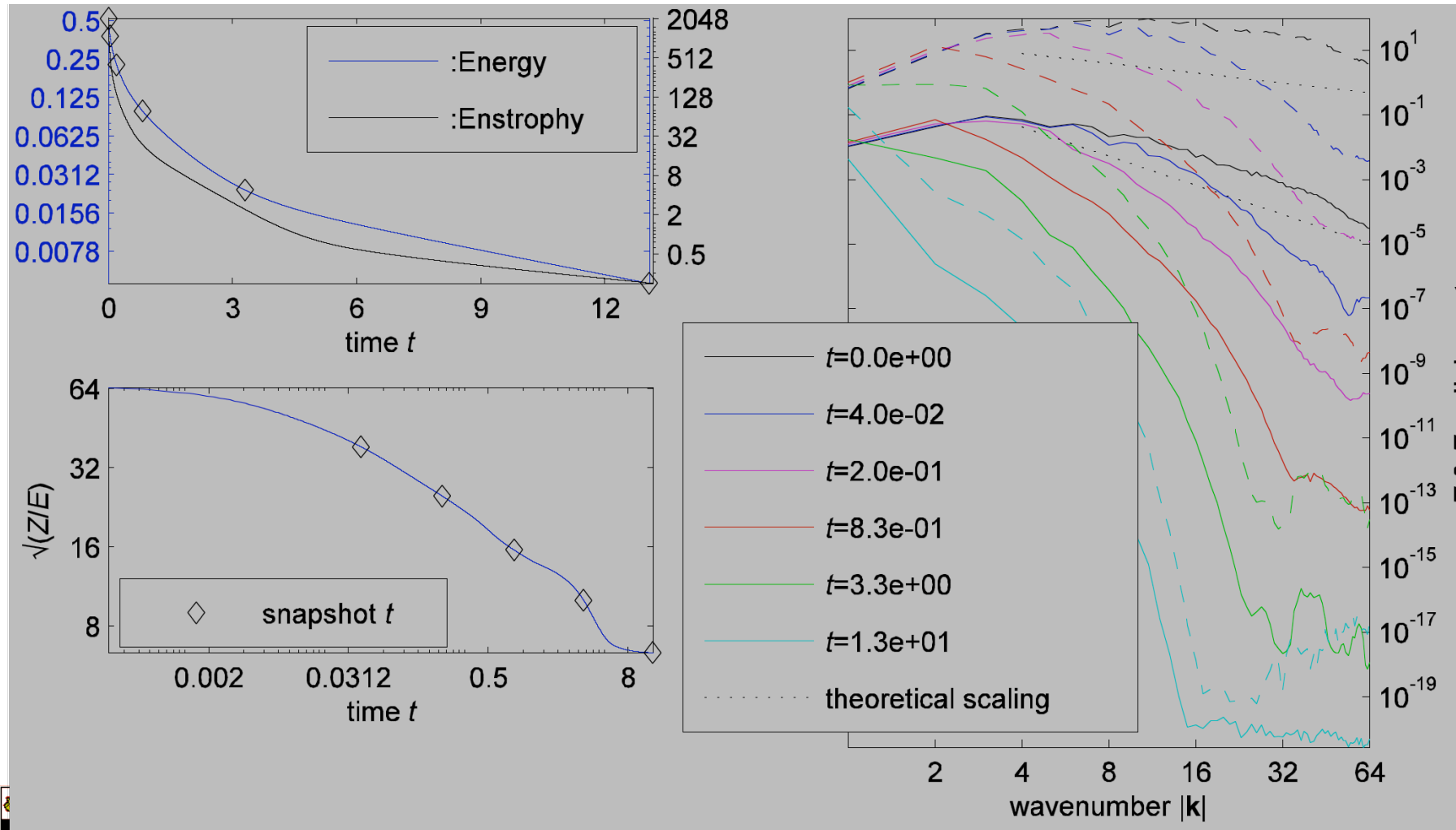
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# Summary

1. Spectral-element method (SEM) reproduces some traditional pseudo-spectral-method (PSM) simulations, with same rate of accuracy increase with computational d.o.f. but adaptively, with greater geometric flexibility and better distributed c.p.u. efficiency.
2. Element-local polynomial spaces enable high-accuracy Fourier analysis.
3. Rigorous multiresolution analysis can be constructed w.r.t. element refinement (Fournier *in preparation* 2008).
4. (Not included) some local conservation laws can be enforced (Taylor & Fournier *in preparation* 2008).

