
Scalar Decay in Chaotic Mixing

Local and Global Theory

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Overview

Part I: Local theory:

- How does a blob of dye behave in a steady flow?
- How does a blob behave in a random flow?
- How do a large number of blobs behave in a random flow?

Part II: Global theory:

- Get away from local (or blob) picture.
- Every detail matters (such as boundary conditions)!
- Fewer generic features.
- Focus is on eigenfunctions.

Prelude

The Advection–Diffusion Equation

The equation that is in the spotlight is the **advection–diffusion equation**

$$\partial_t \theta + \mathbf{v} \cdot \nabla \theta = \kappa \nabla^2 \theta$$

for the time-evolution of a distribution of concentration $\theta(\mathbf{x}, t)$, being **advected** by a velocity field $\mathbf{v}(\mathbf{x}, t)$, and **diffused** with diffusivity κ .

We will restrict our attention to **incompressible** velocity fields, for which $\nabla \cdot \mathbf{v} = 0$.

We leave the exact nature of θ nebulous: it could be temperature, concentration of salt, dye, chemicals, isotopes, plankton. . . .

The only assumption for now is that this scalar is **passive**, which means that it does not affect the velocity field \mathbf{v} .

Some Properties

Define average over the domain V :

$$\langle \theta \rangle := \frac{1}{V} \int_V \theta \, dV,$$

AD eq'n **conserves** the total quantity of θ , $\partial_t \langle \theta \rangle = 0$, for periodic or zero-flux ($\hat{\mathbf{n}} \cdot \nabla \theta = 0$) boundary conditions.

To measure the degree of mixing, define the **variance**,

$$\text{Var} := \langle \theta^2 \rangle - \langle \theta \rangle^2,$$

Then

$$\partial_t \text{Var} = -2\kappa \langle |\nabla \theta|^2 \rangle \leq 0.$$

In bounded or periodic domains, we are guaranteed that variance **will go to zero**.

How is Mixing Enhanced?

There is an apparent problem with this:

The evolution equation for the variance **no longer involves the velocity field**. But if variance is to give us a measure of mixing, **shouldn't its time-evolution involve the velocity field?**

What's the catch?

We do not have a closed equation for the variance: the right-hand side involves $|\nabla\theta|^2$, which is not the same as θ^2 . As we will see, the stirring velocity field can create **very large gradients** in the concentration field, which makes variance decrease much faster than it would if diffusivity were acting alone.

This, in a nutshell, is the essence of **enhanced mixing**.

Some Questions

Several important questions can now be raised:

- How fast is the approach to the perfectly-mixed state?
- How does this depend on diffusivity?
- What does the concentration field look like for long times?
What is its spectrum?
- How does the probability distribution of θ evolve?
- Which stirring fields give efficient mixing?

The answers to these questions are quite complicated, and not fully known. I will attempt to give some hints of the answers.

Blobs, Part I:

Steady Flows

A Linear Velocity Field

What happens to a passive scalar advected by a linear velocity field? This is the starting point for what may be called the **local theory** of mixing.

The perfect setting to consider a linear flow is in the limit of large **Schmidt number**,

$$Sc := \nu / \kappa$$

where ν is the kinematic viscosity of the fluid.

The scalar field has **much faster spatial variations** than the velocity field. Can focus on a region of the domain large enough for the scalar concentration to vary appreciably, but small enough that the velocity field appears linear.

This regime leads to the celebrated k^{-1} Batchelor spectrum
[Batchelor, 1959].

Solution of the Problem

We choose a linear velocity field of the form

$$\mathbf{v} = \mathbf{x} \cdot \boldsymbol{\sigma}(t), \quad \text{Tr } \boldsymbol{\sigma} = 0.$$

We wish to solve the **initial value problem**

$$\partial_t \theta + \mathbf{x} \cdot \boldsymbol{\sigma}(t) \cdot \nabla \theta = \kappa \nabla^2 \theta, \quad \theta(\mathbf{x}, 0) = \theta_0(\mathbf{x}).$$

We will follow closely the solution of Zeldovich et al. [1984], who solved this by the method of “**partial solutions,**”

$$\theta(\mathbf{x}, t) = \hat{\theta}(\mathbf{k}_0, t) \exp(i\mathbf{k}(t) \cdot \mathbf{x}), \quad \mathbf{k}(0) = \mathbf{k}_0, \quad \hat{\theta}(\mathbf{k}_0, 0) = \hat{\theta}_0(\mathbf{k}_0),$$

where \mathbf{k}_0 is some initial wavevector. We will see if we can make this into a solution by a judicious choice of $\hat{\theta}(\mathbf{k}_0, t)$ and $\mathbf{k}(t)$.

This gives the two evolution equations

$$\partial_t \mathbf{k} = -\sigma \cdot \mathbf{k}, \quad (1)$$

$$\partial_t \hat{\theta} = -\kappa k^2 \hat{\theta}. \quad (2)$$

We can write the solution to (1) in terms of the **fundamental solution** \mathcal{T}_t as

$$\mathbf{k}(t) = \mathcal{T}_t \cdot \mathbf{k}_0,$$

where

$$\partial_t \mathcal{T}_t = -\sigma(t) \cdot \mathcal{T}_t, \quad \mathcal{T}_0 = \text{Id}$$

and Id is the identity matrix. We can then use the same fundamental solution for all initial conditions \mathbf{k}_0 .

If σ is not a function of time, then the fundamental solution is simply a **matrix exponential**,

$$\mathcal{T}_t = \exp(-\sigma t),$$

but in general the form of \mathcal{T}_t is more complicated.

Note that because $\text{Tr } \sigma = 0$, we have

$$\det \mathcal{T}_t = 1,$$

which expresses **volume conservation** (incompressibility).

Can express the solution to (1) and (2) as

$$\mathbf{k}(t) = \mathcal{T}_t \cdot \mathbf{k}_0 ,$$

$$\hat{\theta}(\mathbf{k}_0, t) = \hat{\theta}_0(\mathbf{k}_0) \exp \left\{ -\kappa \int_0^t (\mathcal{T}_s \cdot \mathbf{k}_0)^2 ds \right\} .$$

We can think of \mathcal{T}_t as transforming a **Lagrangian** wavevector \mathbf{k}_0 to its **Eulerian** counterpart \mathbf{k} .

$\hat{\theta}$ decays diffusively at a rate determined by the **cumulative** norm of the wavenumber $\mathbf{k} = \mathcal{T}_s \cdot \mathbf{k}_0$ experienced during its evolution.

The full solution to the AD eq'n is now given by superposition of the partial solutions,

$$\begin{aligned}\theta(\mathbf{x}, t) &= \int \hat{\theta}(\mathbf{k}_0, t) \exp(i\mathbf{k}(t) \cdot \mathbf{x}) d^3k_0 \\ &= \int \hat{\theta}_0(\mathbf{k}_0) \exp \left\{ i \mathbf{x} \cdot \mathcal{T}_t \cdot \mathbf{k}_0 - \kappa \int_0^t (\mathcal{T}_s \cdot \mathbf{k}_0)^2 ds \right\} d^3k_0 ,\end{aligned}$$

where $\hat{\theta}_0(\mathbf{k}_0)$ is the Fourier transform of the initial condition $\theta_0(\mathbf{x})$.

Two effects: **stretching** of the initial wavenumber and **decay** of the initial amplitude.

Stretching Flow in 2D

Take an even more idealised approach: consider the case where the velocity gradient matrix σ is **constant** and **two-dimensional**.

After a coordinate change, the traceless matrix σ can take one of two possible forms,

$$\sigma^{(2a)} = \begin{pmatrix} \lambda & 0 \\ 0 & -\lambda \end{pmatrix} \quad \text{and} \quad \sigma^{(2b)} = \begin{pmatrix} 0 & 0 \\ U' & 0 \end{pmatrix}.$$

Case (2a) is a **uniformly stretching flow** that stretches exponentially in one direction, and contracts in the other.

Case (2b) is a linear **shear flow** in the x_1 direction.

We assume without loss of generality that $\lambda > 0$ and $U' > 0$.

The corresponding fundamental matrices $\mathcal{T}_t = \exp(-\sigma t)$ are easy to compute.

For Case (2a) we merely exponentiate the diagonal elements.

$$\mathcal{T}_t^{(2a)} = \begin{pmatrix} e^{-\lambda t} & 0 \\ 0 & e^{\lambda t} \end{pmatrix}$$

For Case (2b) the exponential power series terminates after two terms, because $\sigma^{(2b)}$ is **nilpotent**.

$$\mathcal{T}_t^{(2b)} = \begin{pmatrix} 1 & 0 \\ -U't & 1 \end{pmatrix}.$$

Consider Case (2a), a flow with constant stretching. The action of the fundamental matrix on \mathbf{k}_0 is

$$\mathcal{J}_t^{(2a)} \cdot \mathbf{k}_0 = \left(e^{-\lambda t} k_{01}, e^{\lambda t} k_{02} \right),$$

with norm

$$\left(\mathcal{J}_t^{(2a)} \cdot \mathbf{k}_0 \right)^2 = e^{-2\lambda t} k_{01}^2 + e^{2\lambda t} k_{02}^2.$$

The wavevector $\mathbf{k}(t) = \mathcal{J}_t^{(2a)} \cdot \mathbf{k}_0$ grows exponentially in time, which means that the **length scale is becoming very small**.

This only occurs in the direction x_2 , which is sensible because that direction corresponds to a contracting flow.

For one Fourier mode, we have

$$\hat{\theta}(\mathbf{k}_0, t) = \hat{\theta}_0(\mathbf{k}_0) \exp \left\{ -\kappa \int_0^t \left(e^{-2\lambda s} k_{01}^2 + e^{2\lambda s} k_{02}^2 \right) ds \right\} .$$

The time-integral can be done explicitly, and we find

$$\hat{\theta}(\mathbf{k}_0, t) = \hat{\theta}_0(\mathbf{k}_0) \exp \left\{ -\frac{\kappa}{2\lambda} \left(\left(e^{2\lambda t} - 1 \right) k_{02}^2 - \left(e^{-2\lambda t} - 1 \right) k_{01}^2 \right) \right\} .$$

For moderately long times ($t \gtrsim \lambda^{-1}$), we can surely neglect $e^{-2\lambda t}$ compared to 1, and 1 compared to $e^{2\lambda t}$,

$$\hat{\theta}(\mathbf{k}_0, t) \simeq \hat{\theta}_0(\mathbf{k}_0) \exp \left\{ -\frac{\kappa}{2\lambda} \left(e^{2\lambda t} k_{02}^2 + k_{01}^2 \right) \right\} .$$

This assumption of moderately long time is easily justified physically.

If $\kappa k_0^2 / \lambda \ll 1$, where k_0 is the largest initial wavenumber (that is, the smallest initial scale), then can neglect diffusion unless

$$e^{2\lambda t} \gtrsim \text{Pe}^{-1}, \quad \text{or} \quad \lambda t \gtrsim \log \text{Pe}^{-1/2}$$

where the **Péclet number** is

$$\text{Pe} = \lambda / \kappa k_0^2.$$

The Péclet number influences this time scale only weakly.

Diffusivity has only a logarithmic effect. Thus vigorous stirring always has a chance to overcome a small diffusivity: **we need just stir a bit longer.**

Roughly, for one Fourier mode our solution predicts

$$\hat{\theta} \sim \exp \left\{ -\text{Pe}^{-1} e^{2\lambda t} \right\}$$

for $\lambda t \gg 1$: a **superexponential** decay (unreasonable).

This decay comes from the factor

$$\exp\left(-(\kappa/2\lambda) e^{2\lambda t} k_0^2\right).$$

There is an exponential increase in the wavenumber. This is exactly the mechanism for enhanced mixing we advertised earlier: very large gradients of concentration are being created, exponentially fast. **This mechanism is just acting too quickly for our taste!**

So what's the problem? Clearly the concentration in most wavenumbers gets annihilated almost instantly, once enough time has elapsed.

Blow up the k_{02} integration by making the coordinate change $\tilde{k}_{02} = k_{02} e^{\lambda t}$,

$$\theta(\mathbf{x}, t) = e^{-\lambda t} \int_{-\infty}^{\infty} dk_{01} \int_{-\infty}^{\infty} d\tilde{k}_{02} \hat{\theta}_0(k_{01}, \tilde{k}_{02} e^{-\lambda t}) e^{i\mathbf{k}(t) \cdot \mathbf{x}} \times \exp \left\{ -\frac{\kappa}{2\lambda} \left(\tilde{k}_{02}^2 + k_{01}^2 \right) \right\},$$

For large times, dominated by **very small wavenumbers** in x_2 direction.

For small κ , we can neglect the k_{01}^2 term in the exponential.

Taking the inverse Fourier transform,

$$\theta(\mathbf{x}, t) \simeq e^{-\lambda t} G(x_2; \ell) \int_{-\infty}^{\infty} \theta_0(e^{-\lambda t} x_1, \tilde{x}_2) d\tilde{x}_2,$$

where

$$G(x; \sigma) := \frac{1}{\sqrt{2\pi\ell^2}} e^{-x^2/2\ell^2}$$

is a **normalised Gaussian** with standard deviation ℓ , and

$$\ell := \sqrt{\kappa/\lambda}.$$

The x_1 dependence is given by the **stretched** initial distribution, averaged over x_2 . The x_2 dependence is **always Gaussian**.

The important thing to notice is that

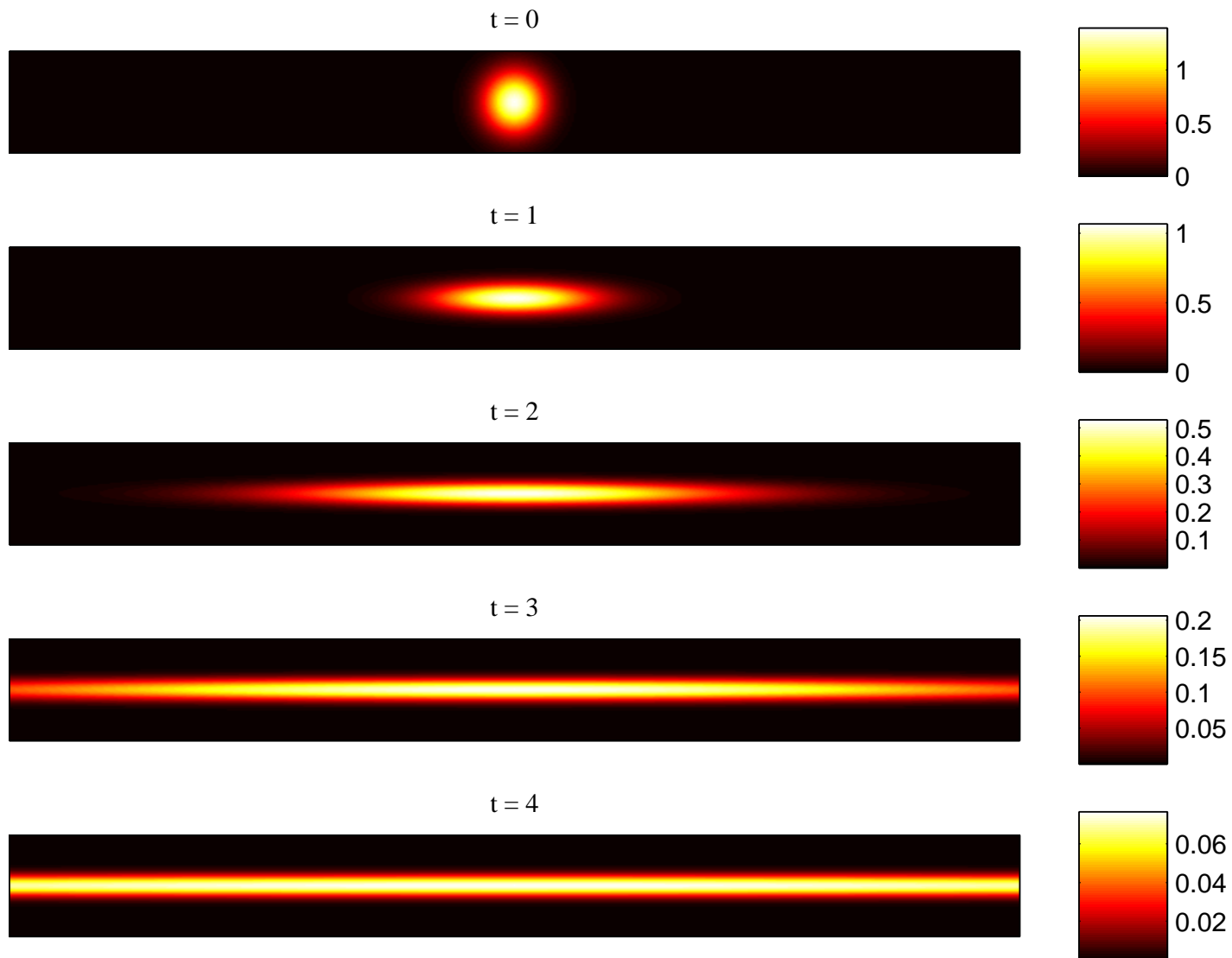
$$\theta(\mathbf{x}, t) \sim e^{-\lambda t}.$$

This is a much more reasonable estimate for the decay of concentration than superexponential! The concentration thus decays **exponentially** at a rate given by the **stretching rate** of the flow.

The asymptotic decay rate tends to be independent of diffusivity.

But note that a nonzero diffusivity is **crucial** in obtaining this result. The only direct effect of the diffusivity is to **lengthen the wait** before exponential decay sets in. But this is only **logarithmic** in the diffusivity.

Numerical Example



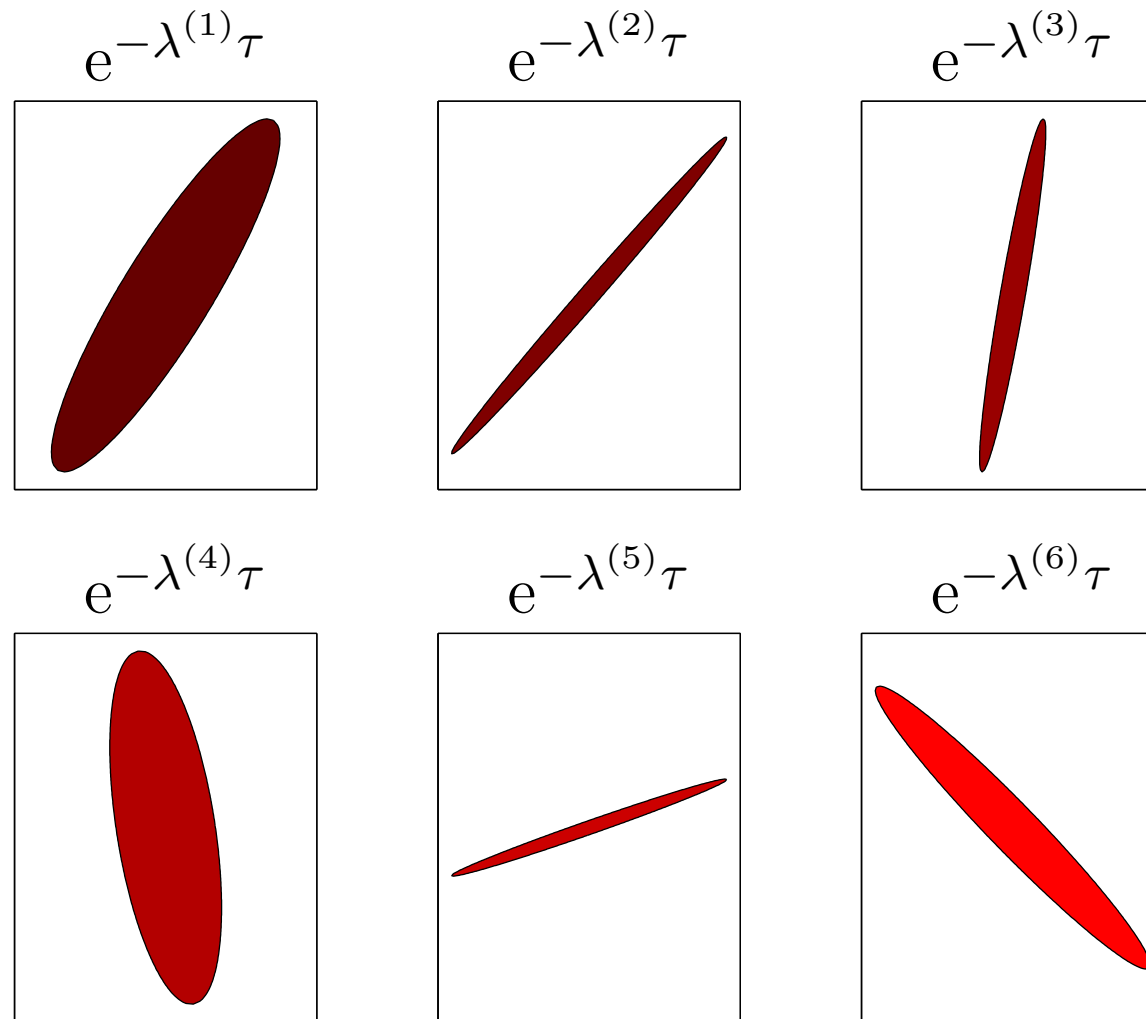
Blobs, Part II:

Random Strain

A Single Blob

- We have thus far analysed the deformation of a patch of concentration field (a ‘blob’) in a linear velocity field.
- We will now inch slightly closer to the real world by giving a random time dependence to our velocity field.
- As before, consider a single blob in a two-dimensional constant-stretching velocity field, but assume the orientation and stretching rate λ of the flow change randomly every time τ .
- We assume that the time τ is much larger than a typical stretching rate $\lambda^{(i)}$ at the i th period, so that there is sufficient time for the blob to be deformed into its asymptotic form.
- The results presented are the culmination of a flurry of activity in the late 90’s [Antonsen, Jr. et al., 1996, Balkovsky and Fouxon, 1999, Son, 1999, Falkovich et al., 2001].

A Single Blob



The amplitude of the concentration field decays by $\exp(-\lambda^{(i)}\tau)$ at each period.

Decay of Concentration

The concentration field after n periods will thus be proportional to the product of decay factors,

$$\begin{aligned}\theta &\sim e^{-\lambda^{(1)}\tau} e^{-\lambda^{(2)}\tau} \dots e^{-\lambda^{(n)}\tau}, \\ &= e^{-(\lambda^{(1)} + \lambda^{(2)} + \dots + \lambda^{(n)})\tau}.\end{aligned}$$

We may rewrite this as

$$\theta \sim e^{-\Lambda_n t},$$

where $t = n\tau$, and

$$\Lambda_n := \frac{1}{n} \sum_{i=1}^n \lambda^{(i)}$$

is the ‘running’ mean value of the stretching rate at the n th period.

Asymptotic Behaviour

- As we let n become large, how do we expect the concentration field to decay?
- We might expect that it would decay at the mean value $\bar{\lambda}$ of the stretching rates $\lambda^{(i)}$.
- This is not the case: the running mean Λ_n does not **converge** to the mean $\bar{\lambda}$.
- Rather, by the central limit theorem its **expected value** is $\bar{\lambda}$, but its **fluctuations** around that value are proportional to $1/\sqrt{t}$. These fluctuations have an impact on the decay rate of θ .

Average over Realisations

The set of variables $\lambda^{(i)}$ is known as a **realisation**.

Now let us imagine performing our blob experiment several times, and averaging the resulting concentration fields: this is known as an **ensemble average** over realisations.

Ensemble-averaging **smooths out fluctuations** present in each given realisation.

We may then replace the running mean Λ_n by a sample-space variable Λ , together with its probability distribution $P(\Lambda, t)$. The mean (**expected value**) $\overline{\theta^\alpha}$ of the α th power of the concentration field is then proportional to

$$\overline{\theta^\alpha} \sim \int_0^\infty e^{-\alpha\Lambda t} P(\Lambda, t) d\Lambda .$$

The PDF of Λ

The form of the probability distribution function (PDF) $P(\Lambda, t)$ is given by the **central limit theorem**:

$$P(\Lambda, t) \simeq G(\Lambda - \bar{\Lambda}; \sqrt{\nu/t}),$$

that is, a **Gaussian distribution** with **standard deviation** $\sqrt{\nu/t}$.

Actually, the central limit theorem only applies to values of Λ that do not deviate too much from the mean. A more general form of the PDF of Λ comes from **large deviation theory**,

$$P(\Lambda, t) \simeq \sqrt{\frac{t S''(0)}{2\pi}} e^{-tS(\Lambda - \bar{\Lambda})}.$$

The function $S(x)$ is known as the **rate function**, the **entropy function**, or the **Cramér function**.

Large Deviation Theory

S is a time-independent convex function with a minimum value of 0 at 0:

$$S(0) = S'(0) = 0.$$

If Λ is **near the mean**, we have

$$S(\Lambda - \bar{\Lambda}) \simeq \frac{1}{2} S''(0)(\Lambda - \bar{\Lambda})^2,$$

which recovers the Gaussian result with $\nu = 1/S''(0)$.

The Gaussian or Large Deviation asymptotic forms are only valid for **large t** .

(Which in our case means $t \gg \tau$, or equivalently $n \gg 1$.)

The Decay Rate of $\overline{\theta^\alpha}$

We can now evaluate our integral with the asymptotic PDF,

$$\overline{\theta^\alpha} \sim \int_0^\infty e^{-\alpha\Lambda t} e^{-tS(\Lambda-\bar{\Lambda})} d\Lambda \sim \int_0^\infty e^{-tH(\Lambda)} d\Lambda \sim e^{-\gamma_\alpha t},$$

where we have omitted the nonexponential prefactors, and defined

$$H(\Lambda) := \alpha\Lambda + S(\Lambda - \bar{\Lambda}).$$

Since t is large, the integral is dominated by the minimum value of $H(\Lambda)$: we can use the **saddle-point approximation**. The **decay rate** is then given by

$$\gamma_\alpha = H(\Lambda_{\text{sp}}), \quad \text{with} \quad H'(\Lambda_{\text{sp}}) = 0,$$

where Λ_{sp} is the saddle-point.

The Decay Rate of $\overline{\theta^\alpha}$ (cont'd)

There's a caveat to this: for α large enough the saddle point Λ_{sp} is negative. This is not possible: the stretching rates are defined to be **nonnegative**.

The best we can do is to choose $\Lambda_{\text{sp}} = 0$: the ensemble average is dominated by **realisations with no stretching**.

In that case,

$$\gamma_\alpha = H(0) = S(-\bar{\Lambda}),$$

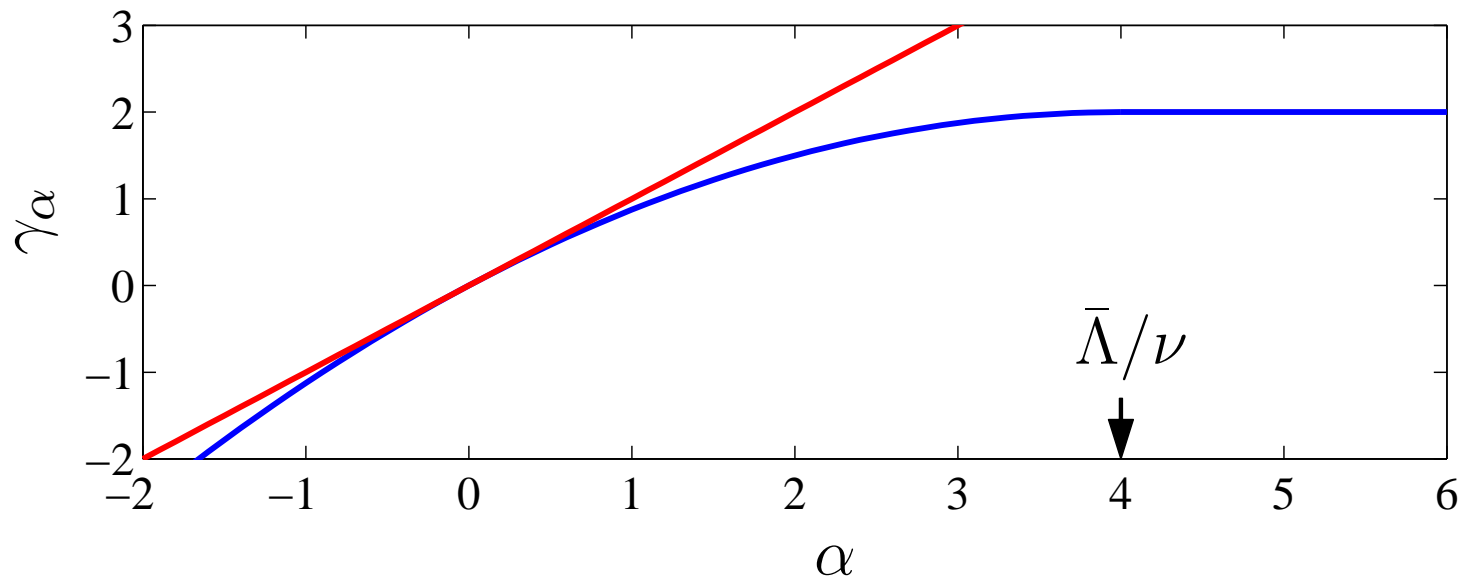
independent of α !

All this is best illustrated by quoting the Gaussian result,

$$\gamma_\alpha = \begin{cases} \alpha (\bar{\Lambda} - \frac{1}{2} \alpha \nu), & \alpha < \bar{\Lambda}/\nu; \\ \bar{\Lambda}^2/2\nu, & \alpha \geq \bar{\Lambda}/\nu. \end{cases}$$

Decay Rate of $\overline{\theta^\alpha}$ for Gaussian PDF

Decay rate γ_α for the moments of concentration $\overline{\theta^\alpha}$ of a blob (blue) in a Gaussian random stretching flow:



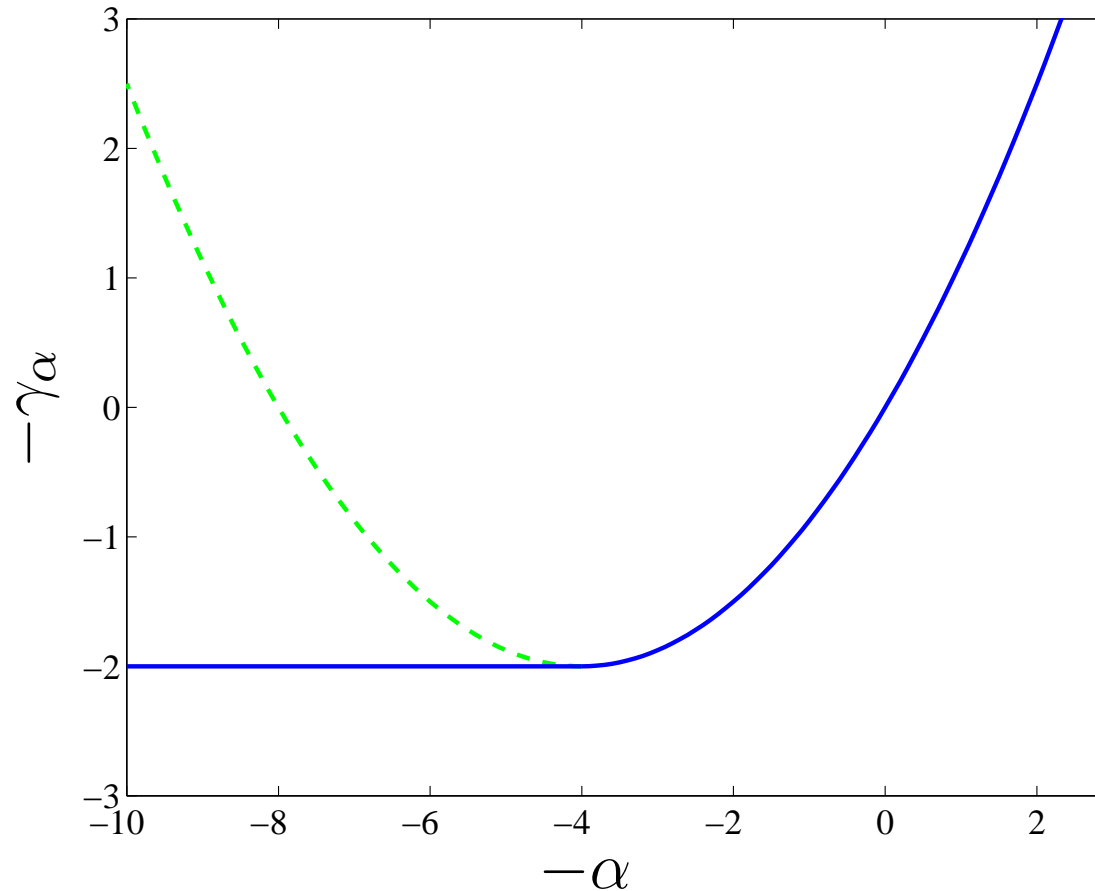
The red line is for a fixed, nonrandom flow.

The curve and its first derivative are always continuous.

Notice that the blue curve (for a random flow) lies below the red curve (for a nonrandom flow).

A More Familiar Form?

Plot this upside down and reversed:



Plateau shows the difference between line- and blob-stretching.

Fluctuations about the Mean

This is a general result: if $f(x)$ is a convex function and x a random variable, **Jensen's inequality** says that

$$\overline{f(x)} \geq f(\bar{x}).$$

Now, $e^{-\alpha t \Lambda}$ is a convex function of Λ , so we have

$$\overline{e^{-\alpha t \Lambda}} \geq e^{-\alpha t \bar{\Lambda}},$$

which implies that the decay rate satisfies

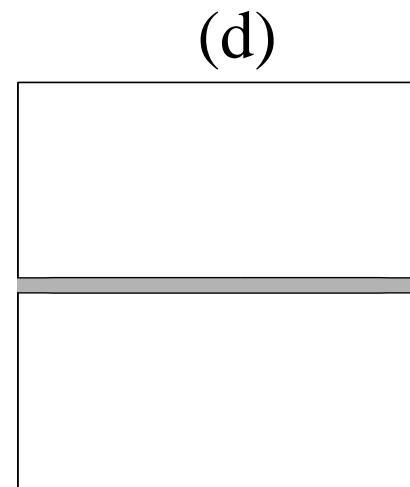
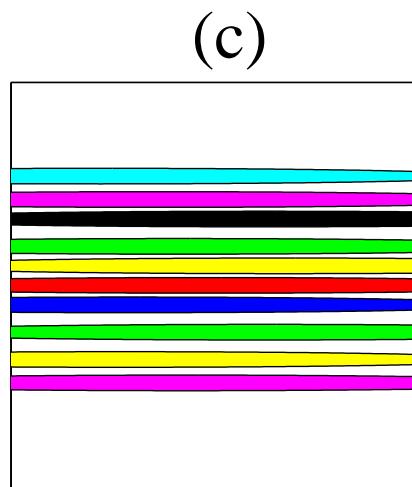
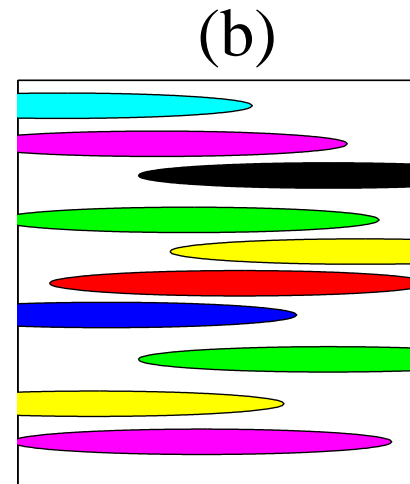
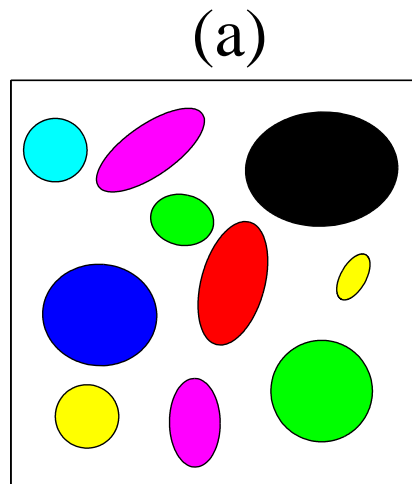
$$\boxed{\gamma_\alpha \leq \alpha \bar{\Lambda}.}$$

Thus, **fluctuations in Λ inevitably lead to a slower decay rate γ_α .**

Many Blobs

- Consider now a large number of blobs, homogeneously and isotropically distributed, with random concentrations. We assume that the mean concentration over all the blobs is zero.
- If we now apply a uniform stretching flow, the blobs are all stretched horizontally and contracted in the vertical direction.
- They are squished together in the vertical direction until diffusion becomes important.
- The effect of diffusion is to homogenise the concentration field until it reaches a value which is the average of the concentration of the individual blobs.
- This is depicted by the long gray blob in which will itself keep contracting until it reaches the diffusive length ℓ .

Many Blobs



Overlap of Blobs

The **expected value** of the concentration at a point \mathbf{x} on the gray filament consisting of N overlapping blobs is **zero**.

By the central limit theorem, the **fluctuations** in θ are

$$\langle \theta^2(\mathbf{x}, t) \rangle_{\text{blobs}} \sim N e^{-2\Lambda t} \left(\frac{1}{N} \sum_i^N \theta_0^{(i)2} \right)$$

where $\theta_0^{(i)}$ is the initial concentration of the i th blob, and $\langle \cdot \rangle_{\text{blobs}}$ denotes a sum over the overlapping blobs at point \mathbf{x} .

But the number of overlapping blobs N is **proportional to $e^{\Lambda t}$** : as time increases more and more blobs **converge and interact diffusively**.

Overlap of Blobs: Decay of Moments

Overall, then

$$\langle \theta^2(\mathbf{x}, t) \rangle_{\text{blobs}}^{1/2} \sim e^{-\Lambda t/2}.$$

Compare this to $\overline{\theta^2} \sim e^{-\Lambda t}$ for the single-blob case: the overlap between blobs has led to an extra square root.

Thus, the ensemble averages $\overline{\langle \theta^2(\mathbf{x}, t) \rangle_{\text{blobs}}^\alpha}$ for the overlapping blobs are computed exactly as for the single blob case.

Because of the assumption of **homogeneity**, the point-average is the same as the average over the whole domain, and we have

$$C_{2\alpha} = \langle \theta^2 \rangle^\alpha \sim e^{-\gamma_\alpha t},$$

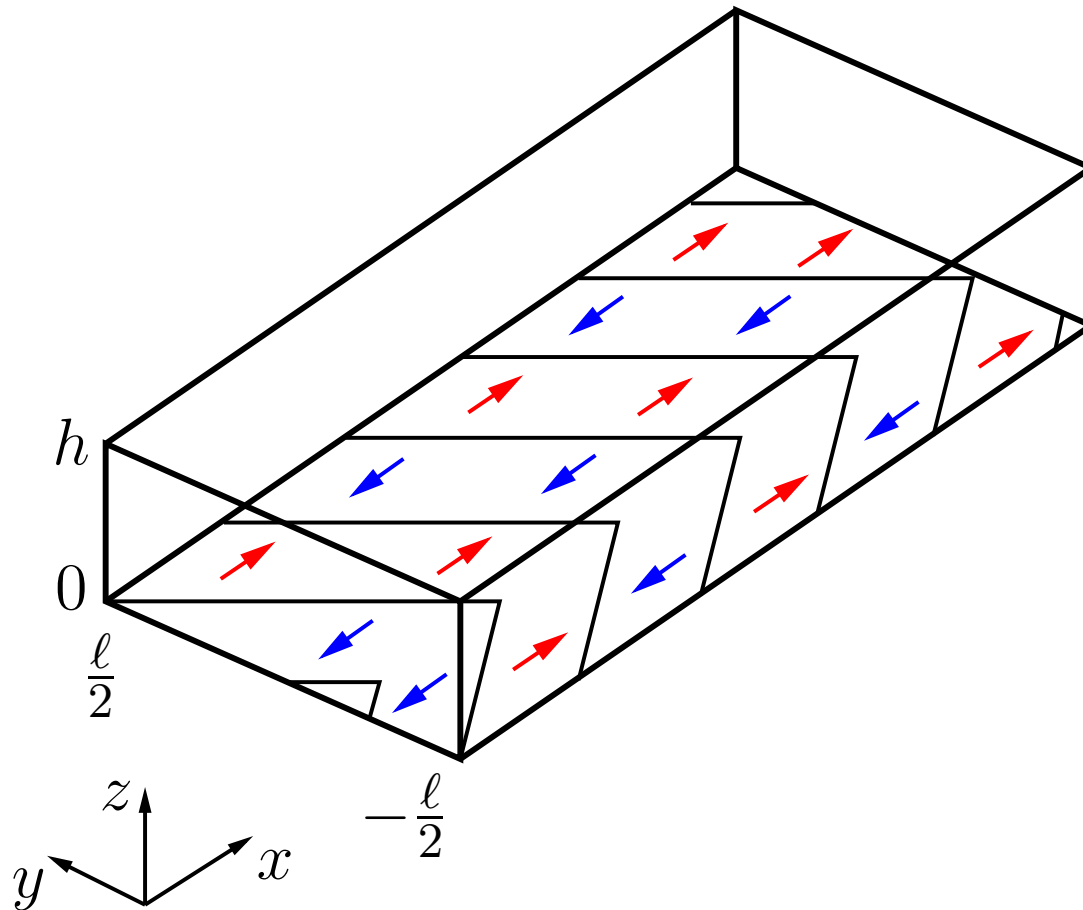
with γ_α the same as before.

“Reality”

Practical Considerations

- The “many blobs” picture has a chance of depicting reality.
- Two important questions:
 - Where does the ensemble average come from?
 - What gives the stretching rates?
- The many initial random blobs provide the ensemble: each blob is a “realisation”.
- The mean stretchings Λ are given by the **finite-time Lyapunov exponents**.
- These give the mean stretching experienced by a fluid element, and account for reorientations of the blobs.

Example: Microchannel Mixer

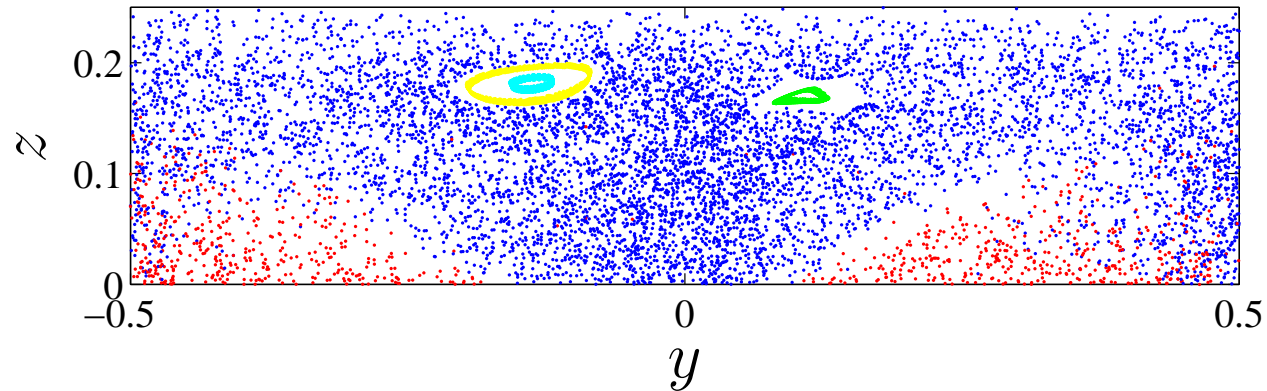


- Periodic electro-osmotic potential at the bottom (moving wall).
- Width $\sim 100 \mu\text{m}$, height $\sim 10\text{--}50 \mu\text{m}$.
- A typical mean fluid velocity is $10^2\text{--}10^3 \mu\text{m/s}$.

Use Stokes flow and lubrication approximations to derive analytical solutions (with M. A. Ewart).

Poincaré Section

Section through vertical plane at $x = 0$

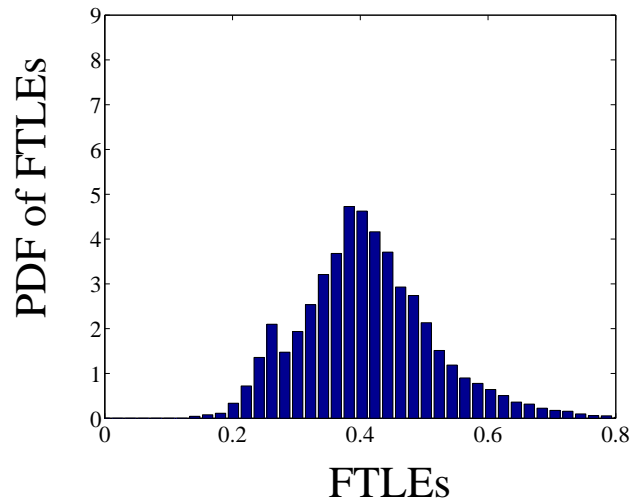


The **red** and **blue** dots represent the same trajectory periodically puncturing two vertical planes many times over (**blue** if in the same direction as the flow, **red** otherwise).

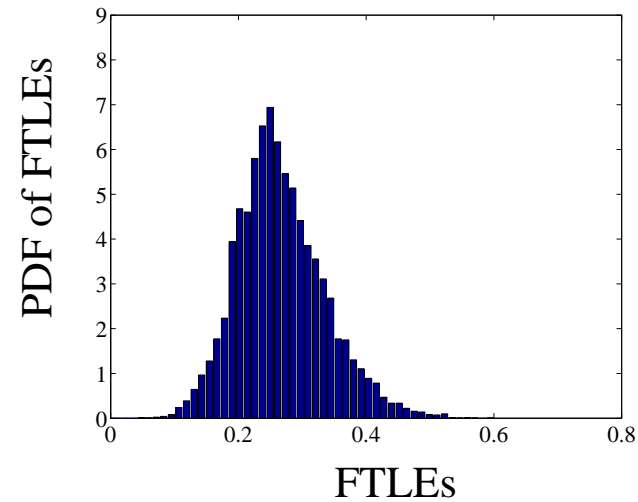
The **green** and **yellow** dots show two trajectories in regular, nonmixing regions.

PDF of Finite-time Lyapunov Exponents (FTLEs)

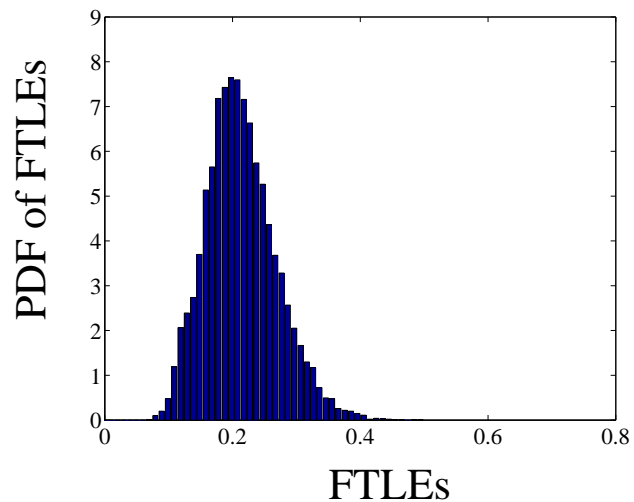
$t = 19 \text{ s}$



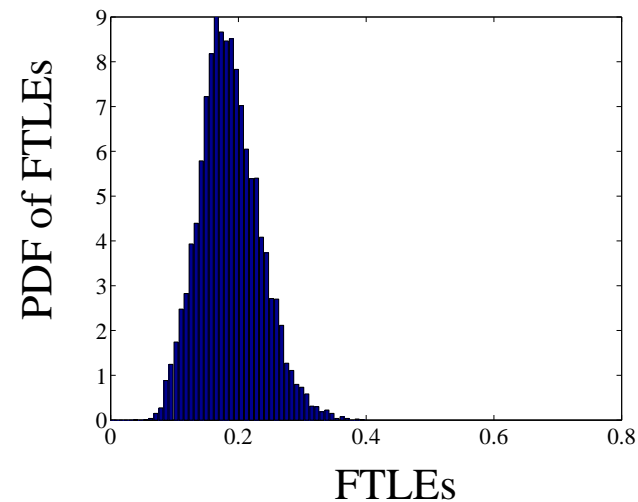
$t = 38 \text{ s}$



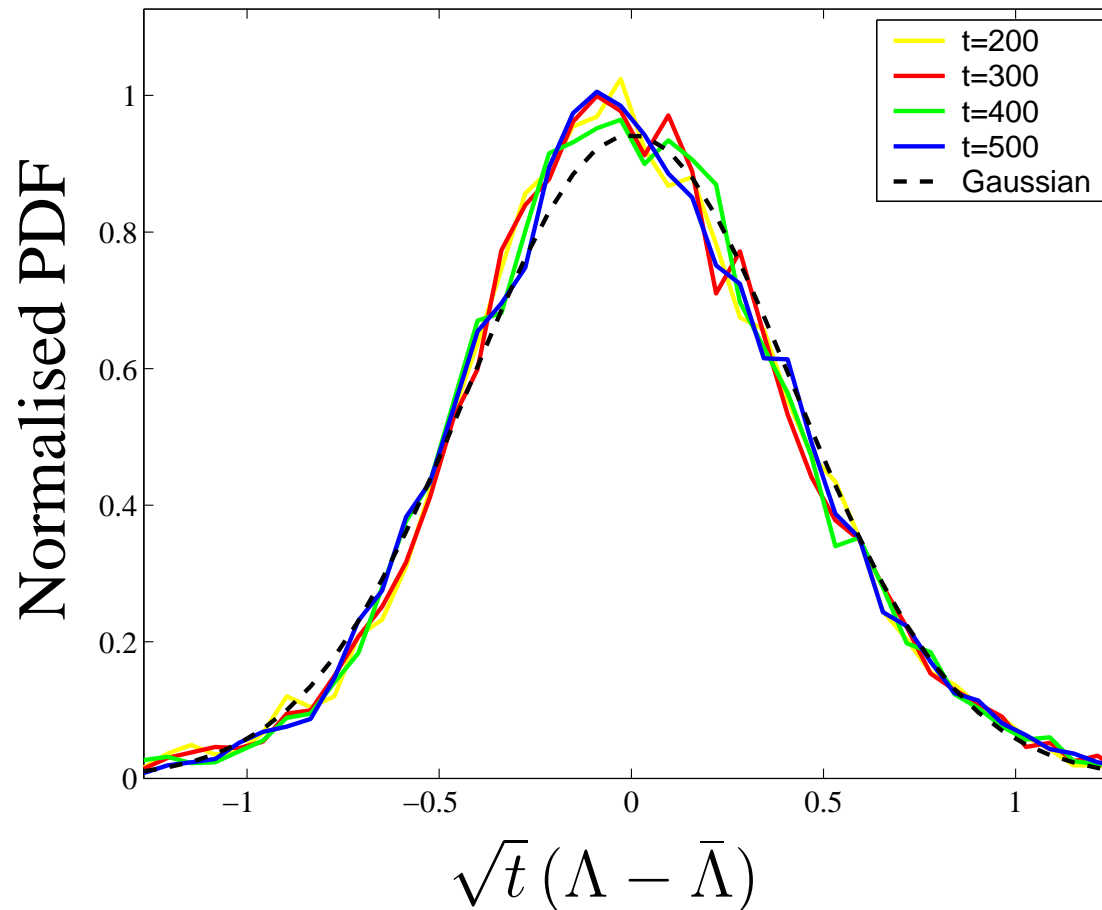
$t = 57 \text{ s}$



$t = 76 \text{ s}$



Rescaled Distribution of FTLEs



The mean Lyapunov exponent is $\bar{\Lambda} \simeq 0.116 \text{ s}^{-1}$, and the standard deviation of the Gaussian is $\sqrt{\nu/t}$, with $\nu \simeq 0.168 \text{ s}^{-1}$.

Mixing Time

From the “many blobs” theory:

$$C_2 = \langle \theta^2 \rangle \sim e^{-\gamma_1 t}$$

$$\begin{aligned}\gamma_1 &= \bar{\Lambda}^2 / 2\nu \quad \text{since } \nu > \bar{\Lambda} \\ &= (0.116)^2 / (2 \cdot 0.168) \simeq 0.040 \text{ s}^{-1}.\end{aligned}$$

- The “mixing time” is $\gamma_1^{-1} \simeq 25$ seconds.
- Fluctuations triple the mixing time compared to $\bar{\Lambda}^{-1}$!
- We don’t really know if this is right...
- Not spectacular improvement over diffusion time for, say, DNA molecules, but still pretty good (factor of four).

Summary: Local Theory

- The decay rate for the passive scalar depends on the **distribution of finite-time Lyapunov exponents**.
- The **fluctuations** in the Lyapunov exponents tend to **work against good mixing**.
- There may be regions of **poor mixing** (regular regions).
- This local regime is not always valid: must also understand the role of **strange eigenfunctions**.
- The breakdown is associated with blobs feeling higher-order moments (**curvature**) of the velocity field and beginning to bend and fold.
- But range of validity is poorly understood (and controversial).
- **Comparison to direct solution is needed (but difficult)**.

Limitations of the Local Theory

- Agreement of decay rate with Cramér function prediction is uncertain.
- The Cramér function is extremely difficult to obtain accurately, even in two dimensions.
- There is evidence that moments don't behave as predicted for longer times. They show a linear increase with α . This is consistent with $\theta \sim e^{-\gamma t}$ everywhere [Fereday and Haynes, 2003].
- Boundary conditions: Results often change dramatically between periodic vs no-flux [Gilbert, 2004].
- Some systems have a decay rate that is completely independent of stretching [Fereday et al., 2002, Wonhas and Vassilicos, 2002, Thiffeault and Childress, 2003, Thiffeault, 2004].

Global Theory

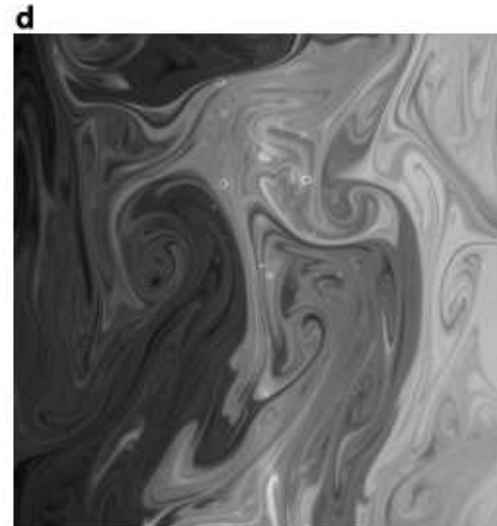
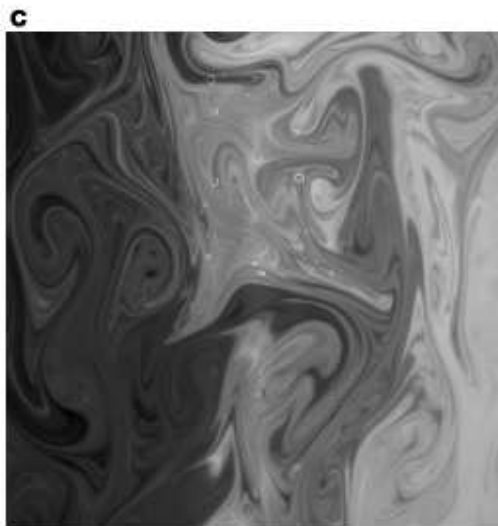
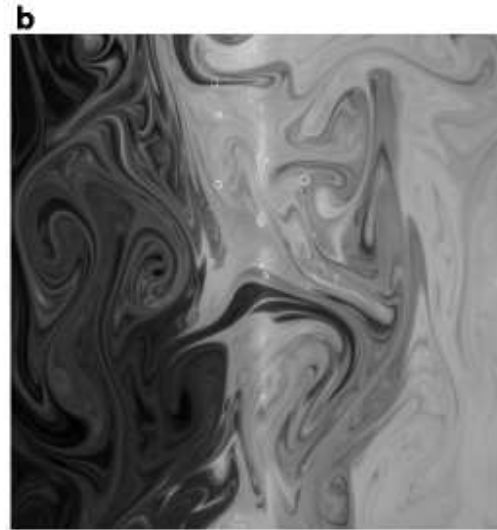
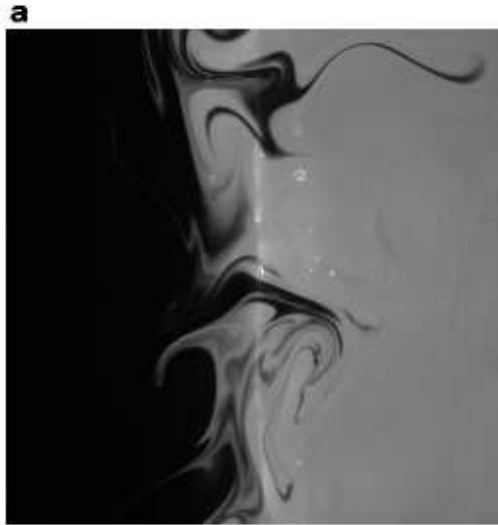
Let $\theta \sim e^{\gamma t}$ and rewrite AD equation as

$$(-\mathbf{v} \cdot \nabla + \kappa \nabla^2)\theta = \gamma \theta.$$

This is a linear eigenvalue problem for the AD operator.

- Difficult! Global problem. Boundary conditions matter.
- All eigenvalues have negative real part.
- But one (or several) eigenvalues must be largest.
- These eigenfunctions will dominate at long times.
- Diffusion is crucial in regularising at small scales (arrest cascade, which allows existence of eigenmode).
- Called “strange eigenmode” [[Pierrehumbert, 1994](#)].

Experiment of Rothstein *et al.*: Persistent Pattern



Disordered array of magnets with oscillatory current drive a thin layer of electrolytic solution.

periods 2, 20, 50, 50.5

[Rothstein *et al.*, 1999]

The Modified Cat Map

We consider a diffeomorphism of the 2-torus $\mathbb{T}^2 = [0, 1]^2$,

$$\mathcal{M}(\mathbf{x}) = \mathbb{M} \cdot \mathbf{x} + \phi(\mathbf{x}),$$

where

$$\mathbb{M} = \begin{pmatrix} 2 & 1 \\ 1 & 1 \end{pmatrix}; \quad \phi(\mathbf{x}) = \frac{\varepsilon}{2\pi} \begin{pmatrix} \sin 2\pi x_1 \\ \sin 2\pi x_1 \end{pmatrix};$$

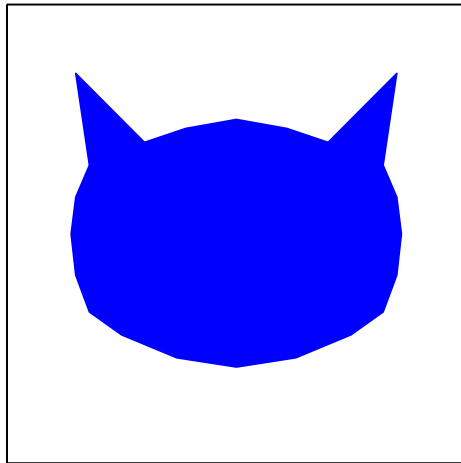
$\mathbb{M} \cdot \mathbf{x}$ is the **Arnold cat map**.

The map \mathcal{M} is **area-preserving** and **chaotic**.

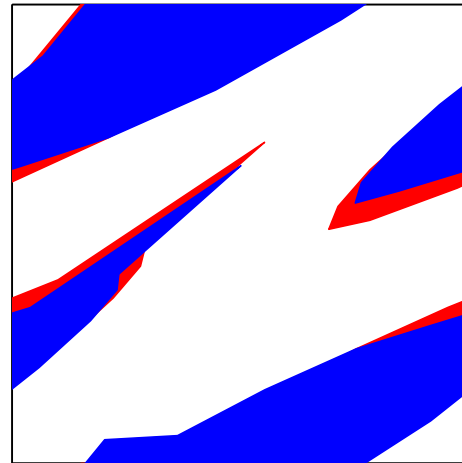
For $\varepsilon = 0$ the stretching of fluid elements is **homogeneous in space**.

For small ε the system is still **uniformly hyperbolic**.

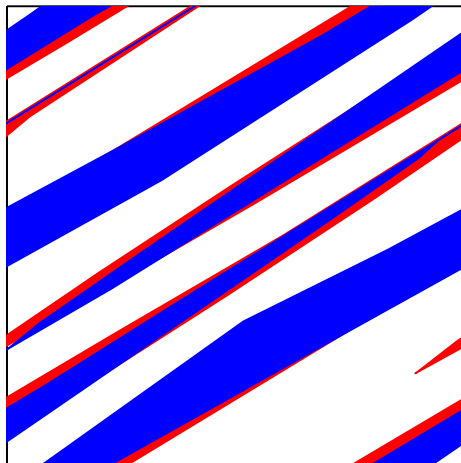
Action of the Modified Cat Map



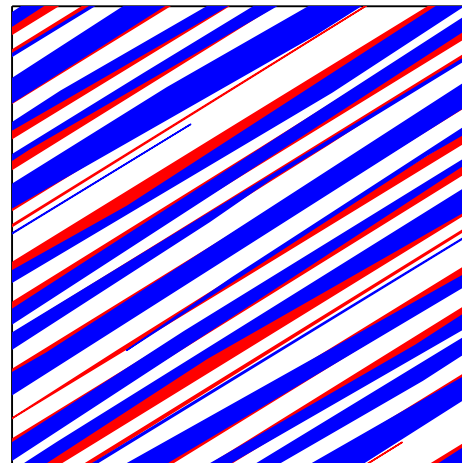
$n = 0$



$n = 1$



$n = 2$



$n = 3$

Advection and Pulsed Diffusion

Iterate the map and apply the **heat operator** to a scalar field (which we call **temperature** for concreteness) distribution $\theta^{(n-1)}(\mathbf{x})$,

$$\theta^{(n)}(\mathbf{x}) = \mathcal{H}_\kappa \theta^{(n-1)}(\mathcal{M}^{-1}(\mathbf{x}))$$

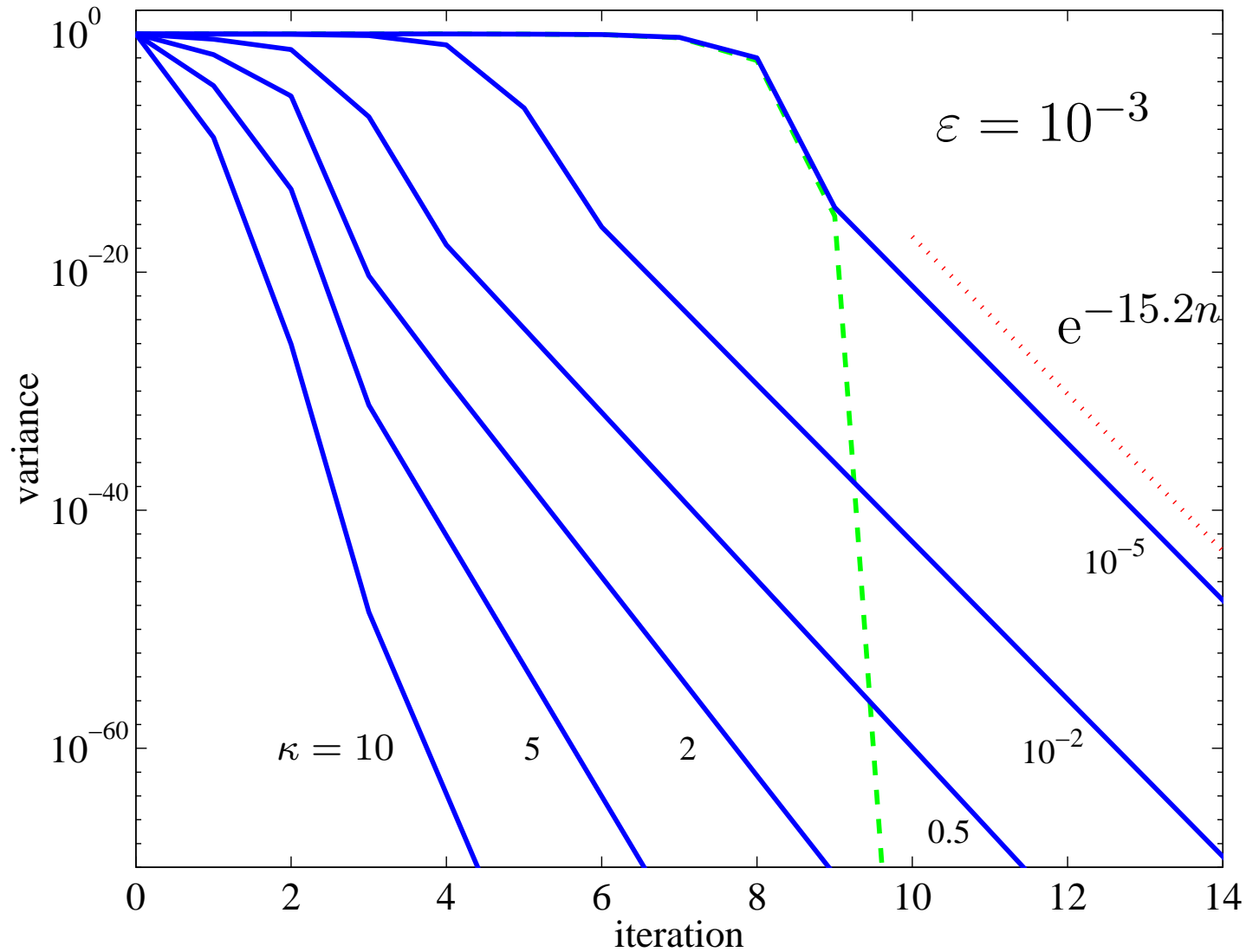
where κ is the **diffusivity**, with the **heat operator** \mathcal{H}_κ and **kernel** h_κ

$$\mathcal{H}_\kappa \theta(\mathbf{x}) := \int_{\mathbb{T}^2} h_\kappa(\mathbf{x} - \mathbf{y}) \theta(\mathbf{y}) \, d\mathbf{y};$$

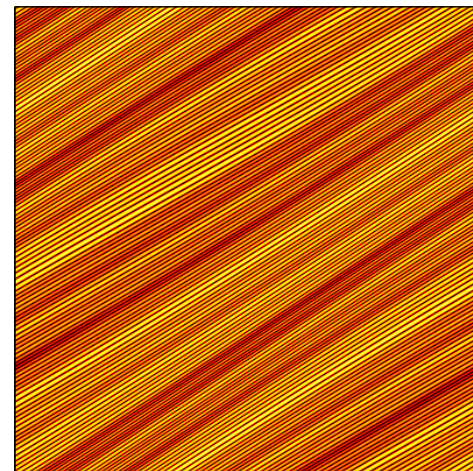
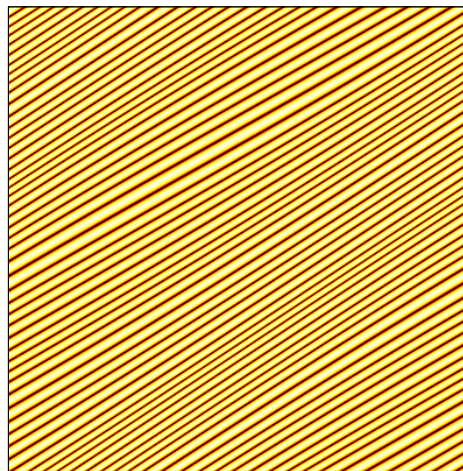
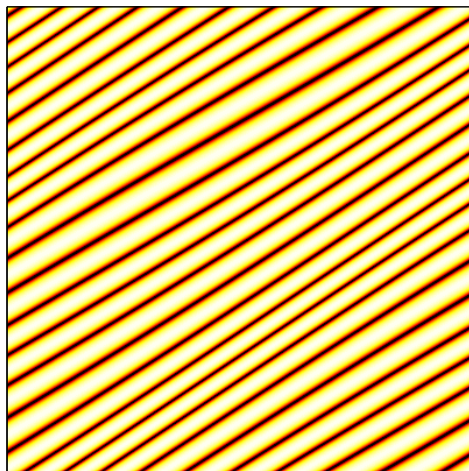
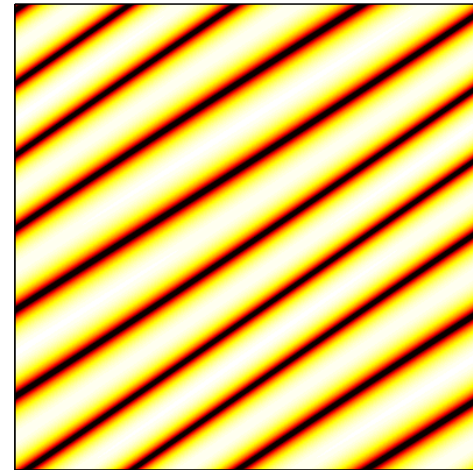
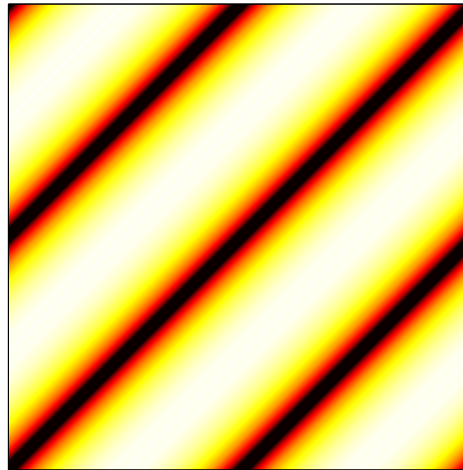
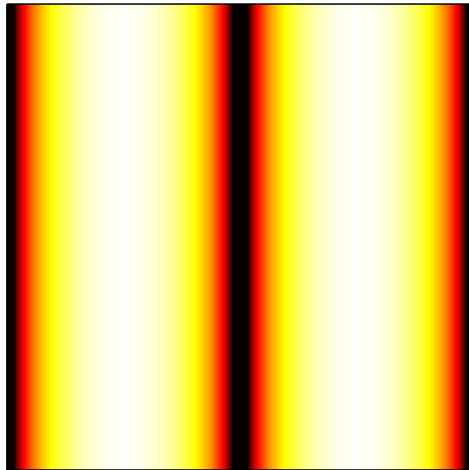
$$h_\kappa(\mathbf{x}) = \sum_{\mathbf{k}} \exp(2\pi i \mathbf{k} \cdot \mathbf{x} - \mathbf{k}^2 \kappa).$$

In other words: **advect** instantaneously and then **diffuse** for one unit of time.

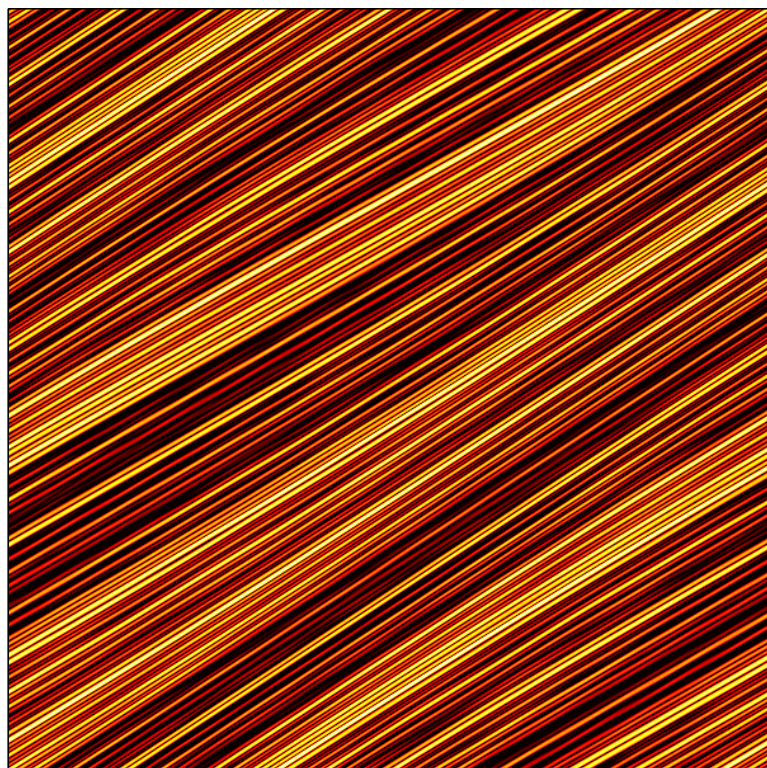
Decay of Variance



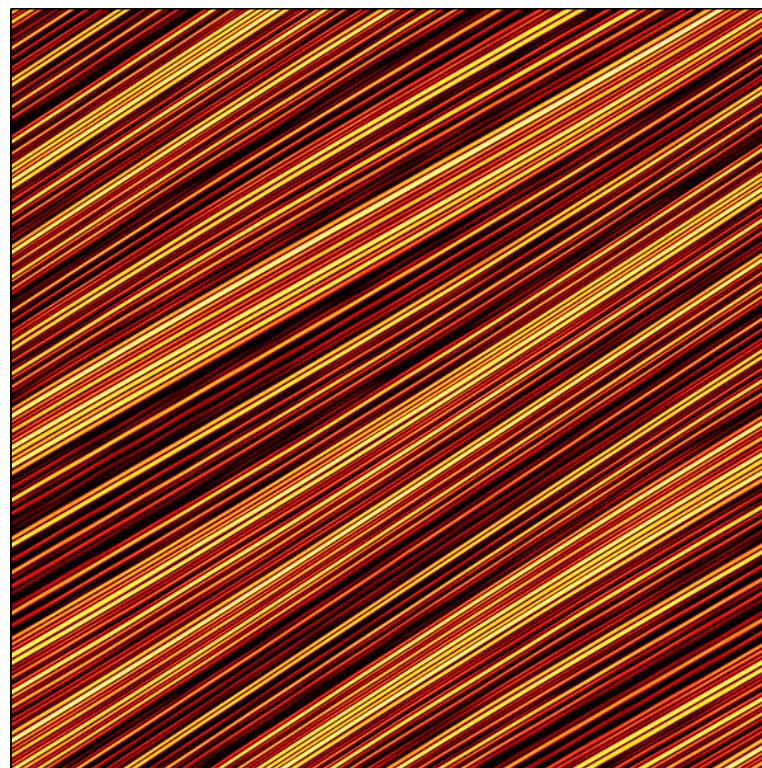
Variance: 5 iterations for $\varepsilon = 0.3$ and $\kappa = 10^{-3}$



The Strange Eigenmode

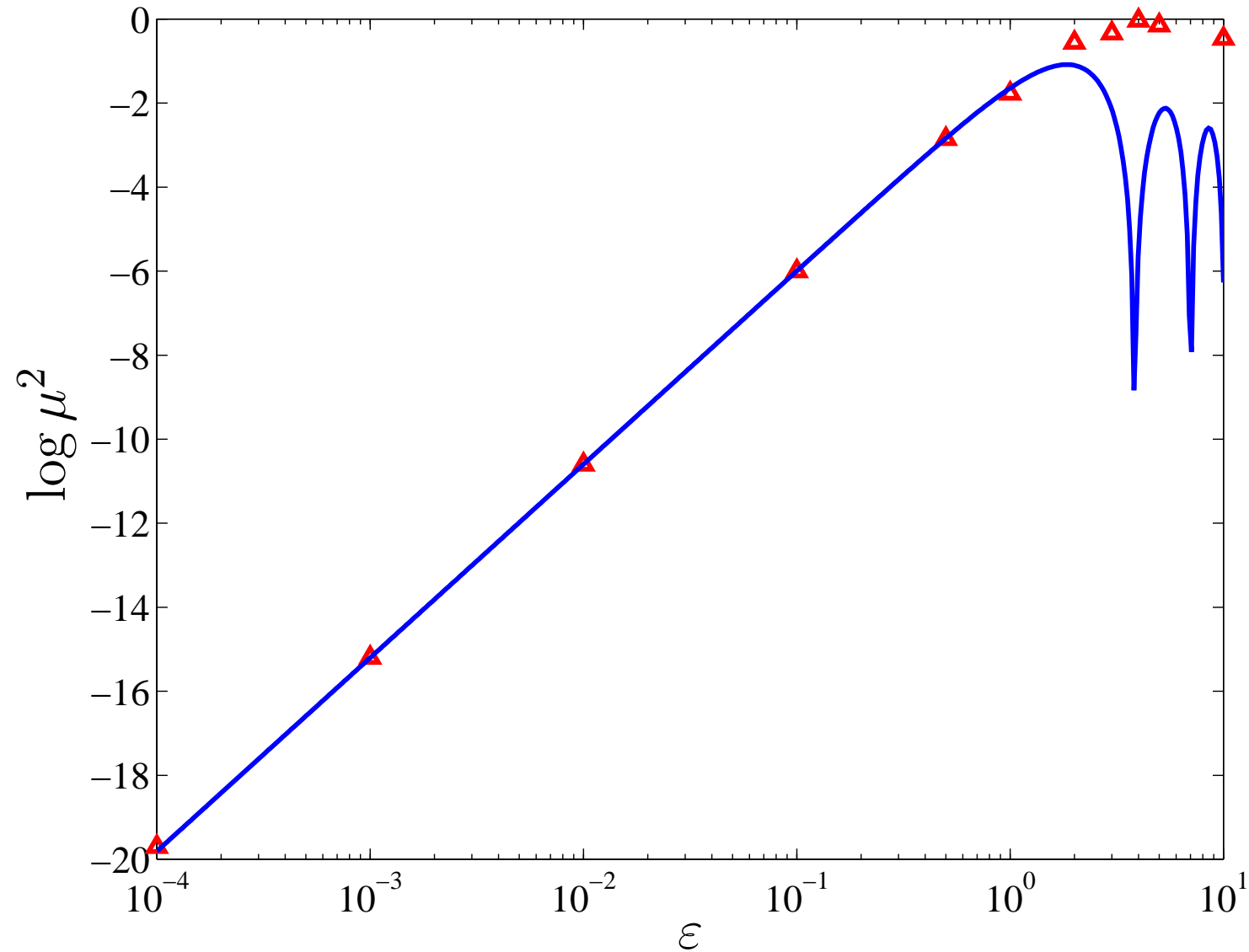


Iteration 28



Iteration 30

Decay Rate as $\kappa \rightarrow 0$



Summary: Global Theory

- Advection and diffusion conspire to create **eigenfunctions**. The slowest-decaying ones **survive longest**.
- Difficult and non-generic.
- In some cases the local and global theories are clearly different. **Pathological?**
- The **dynamo theory** literature contains many relevant results (**cancellation exponents**, ...).
- The **ergodic theory** literature is also promising (**Pollicott–Ruelle resonances**), if it could be understood by mortals (and if one cares mostly about **hyperbolic systems**).
- The approach to zero diffusivity is cool [Hascoët and Eckhardt, 2004].
- Time-a-periodic systems a challenge (**statistical eigenmodes**).

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