Predictability in Systems with Many Characteristic Times: The Case of Turbulence

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Abstract

In chaotic dynamical systems, an infinitesimal perturbation is exponentially amplified at a time-rate given by the inverse of the maximum Lyapunov exponent $\lambda$. In fully developed turbulence, $\lambda$ grows as a power of the Reynolds number. This result could seem in contrast with phenomenological arguments...
suggesting that, as a consequence of ‘physical’ perturbations, the predictability time is roughly given by the characteristic life-time of the large scale structures, and hence independent of the Reynolds number. We show that such a situation is present in generic systems with many degrees of freedom, since the growth of a non-infinitesimal perturbation is determined by cumulative effects of many different characteristic times and is unrelated to the maximum Lyapunov exponent. Our results are illustrated in a chain of coupled maps and in a shell model for the energy cascade in turbulence.

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I. INTRODUCTION

After the seminal work of Lorenz [1], it is well understood that the predictability of the state of a system ruled by a deterministic evolution law has severe limitations in presence of deterministic chaos. In systems with sensitive dependence on the initial condition one has an exponential divergence of the distance $\delta \mathbf{x}$ between two initially close trajectories, i.e.

$$|\delta \mathbf{x}(t)| \simeq |\delta \mathbf{x}(0)| e^{\lambda t}$$  \hspace{1cm} (1)

where $\lambda$ is the maximum Lyapunov exponent [2]. Consequently, if $|\delta \mathbf{x}(0)| = \delta_0$ and one accepts a maximum tolerance $\delta_{\text{max}}$ on the knowledge of the state of the system, (1) implies that the systems is predictable up to a time

$$T \sim \frac{1}{\lambda} \ln \left( \frac{\delta_{\text{max}}}{\delta_0} \right).$$  \hspace{1cm} (2)

Equation (2) gives only a first rough answer to the problem since it does not take into account some important features of chaotic systems. Endeed to study the predictability of a generic dynamical system one has to consider the following non trivial aspects:

- a) The Lyapunov exponent $\lambda$ is a global quantity: it measures the average exponential rate of divergence of nearby trajectories. In general there are finite-time fluctuations of this rate and it is possible to define an ‘instantaneous’ rate $\gamma$, called effective Lyapunov exponent [3], which depends on the particular point of the trajectory $\mathbf{x}(t)$ where the perturbation is performed. In the same way, the predictability time $T$ fluctuates, following the $\gamma$-variations.

- b) In dynamical systems with many degrees of freedom, the interactions among different parts of the system play an important role on the growth of a perturbation. The statistics of the effective Lyapunov exponent is not sufficient to characterize the growth of infinitesimal perturbations and one has to analyze the behavior of the tangent vector $\mathbf{z}(t)$, i.e. of the direction along which an infinitesimal perturbation grows, see e.g
Moreover, if one is interested in the behaviour of a perturbation concentrated on certain degrees of freedom, e.g. small length scales in weather forecasting, and in a prediction on the evolution of other degrees of freedom, e.g. large length scales, a relevant quantity is the time $T_R$ necessary to the tangent vector to relax on the time dependent eigenvector $e(t)$ of the stability matrix, corresponding to the maximum Lyapunov exponent. If the perturbations are small enough, i.e. $\delta x$ is proportional to the tangent vector, one has that

$$T \sim T_R + \frac{1}{\lambda} \ln \frac{\delta_{\text{max}}}{\delta_0}$$

where in general $T_R$ may depend on $\delta x$. So the mechanism of transfer of the error $\delta x$ through the degrees of freedom of the system could be more important than the rate of divergence of nearby trajectories [3].

- c) In systems with many characteristic times, such as the eddy turn-over times in fully developed turbulence, if the perturbation is not infinitesimal, or if the threshold of accepted error is not small, $T$ is determined by the detailed mechanism of transfer due to the non-linear effects in the evolution equation for $\delta x$. In this case, the predictability time might have no relation with the Lyapunov exponent and $T$ depends in a non-trivial way on the details of the system.

The aspects a) and b) have been studied in previous works [3–5]. In this paper we mainly address point c). We investigate the predictability problem for non-infinitesimal perturbations in the framework of two models: a system of coupled maps, and a shell model for the energy cascade in three dimensional turbulence.

The paper is organized as follows. In section [I] we discuss some phenomenological results in fully developed turbulence. In section [II] the predictability problem is discussed in a system of coupled maps, using analytic methods supported by some numerical investigations. Section [IV] analyzes the more realistic case of a shell model of turbulence by both numerical
simulations and closure approximations. In section we discuss the physical relevance of our results and open problems.

II. SOME RESULTS FOR THE PREDICTABILITY IN FULLY DEVELOPED TURBULENCE

In three dimensional fully developed turbulence, the inverse maximum Lyapunov exponent is roughly proportional to the smallest characteristic time of the system, the turn-over time $\tau$ of eddies of the size of the Kolmogorov length $\eta$. The argument, due to Ruelle [8], is the following. The Kolmogorov theory predicts that the longitudinal velocity difference at distance $\ell = |r|$ scales as

$$v(\ell) \equiv |v(x + r) - v(x)| \sim \epsilon^{1/3} \ell^{2/3} \sim V \left( \frac{\ell}{L} \right)^{1/3} \quad (4)$$

where $V$ and $L$ are the typical velocity and length of the energy containing eddies, and $\epsilon$ is the mean rate of energy dissipation.

The non-linear transfer of energy is stopped at the Kolmogorov scale $\eta$ where viscosity $\nu$ is able to compete with the convective term, i.e. $\nu \sim \eta v(\eta)$, thus from (4) we have

$$\eta \sim L Re^{-3/4} \quad (5)$$

where $Re = VL/\nu$ is the Reynolds number. The corresponding turn-over time is

$$\tau(\eta) \sim \frac{\eta}{v(\eta)} \sim T_0 \left( \frac{\eta}{L} \right)^{2/3} \quad (6)$$

where $T_0 = L/V$ is the life time of the large scale disturbances.

These dimensional relations imply that the maximum Lyapunov exponent scales with $Re$ as

$$\lambda \sim \frac{1}{\tau(\eta)} \sim \frac{1}{T_0} Re^{1/2} \quad (7)$$

Taking into account the intermittency one expects that the presence of quiescent quasi-laminar periods changes the chaotic features of the fluid flow. The intermittency of energy
dissipation can be described by introducing a spectrum of singularities \( h \) of the velocity gradients [9], i.e. assuming a local scaling invariance so that in any point \( x \) of the fluid \( v(\ell) \sim \ell^h(x) \). In the framework of the multifractal approach, one thus finds [7]

\[
\lambda \sim \frac{1}{T_0} Re^\alpha \quad \text{with} \quad \alpha = \max_h \left[ \frac{D(h) - 2 - h}{1 + h} \right] \quad (8)
\]

where \( D(h) \) is the fractal dimension of the set of fluid points characterized by a given singularity \( h \). The value of \( \alpha \) depends on \( D(h) \). By using the function \( D(h) \) obtained by fitting the exponents \( \zeta_q \) of the velocity structure functions with the random beta model [10], one has \( \alpha = 0.459..., \) slightly smaller than the Ruelle prediction \( \alpha = 0.5 \), see (7).

Relation (2) and (8) tell us that considering a very small perturbation at \( t = 0 \) and a very small tolerance \( \delta_{\max} \), the predictability time vanishes as the Reynolds number increases, as verified in recent numerical simulations of the shell model (see sect. IV) [6].

On a very different ground, without considering the exponential growth of infinitesimal disturbances, Lorenz [11], see also [12] and [13], proposed a phenomenological approach to the predictability problem in turbulence. Consider wave-numbers around \( k \) with corresponding typical spatial scale \( \ell \sim k^{-1} \). The time \( \tau(k) \) for a perturbation at wavenumber \( 2k \) to induce a complete uncertainty on the velocity field on the wave number \( k \) is assumed to be proportional to the typical eddy turn-over time at scale \( \ell \), from (4):

\[
\tau(\ell) \sim \frac{\ell}{v(\ell)} \sim T_0 \left( \frac{\ell}{L} \right)^{2/3} .
\]

An incertitude \( O(v(\eta)) \) propagates through an inverse cascade from the Kolmogorov scale \( \eta \sim k_d^{-1} \) up to the scale of the energy containing eddies \( L \sim k_0^{-1} \). The predictability time on the large scales is therefore

\[
T = \sum_{n=0}^{N} \tau(2^n \eta) \quad (10)
\]

where \( N = \log_2(k_d/k_0) \sim \log Re \). The geometric series (10) is dominated by the term \( n = N \) so that \( T \) is practically independent of Reynolds number:

\[
T \sim T_0 \sim L/V . \quad (11)
\]
It is worth remarking that closure approximations \cite{12,13} allows one to write down simple
equations for the evolution of disturbances in turbulent flows and fully confirm these results.
In appendix B, we derive this type of equations in the simplified framework of the shell
model, but there are no conceptual differences with the analogous derivation in the case of
the Navier-Stokes equations.

The Lorenz picture of an inverse cascade of a perturbation also permits to estimate
the growth of a perturbation at intermediate times. Indeed, after a time $t$, a perturbation
localized on the Kolmogorov length scale, is expected to affect an eddy of size $\ell_t$ such that
its turn-over time is $\tau(\ell_t) \sim t$. It follows \cite{14}, see \cite{3}
\[
\ell_t \sim L \left( \frac{t}{T_0} \right)^{3/2} \tag{12}
\]
Let us indicate by $\mathbf{v}$ the reference velocity field and by $\mathbf{v}'$ the perturbed field. The size of
the difference $\delta \mathbf{v}(t)$ between two velocity fields at time $t$ can be estimated as the typical
velocity of a disturbance at scale $\ell_t$, so that from \cite{4} and \cite{12}
\[
|\delta \mathbf{v}(t)| \sim v(\ell_t) \sim V \sqrt{t/T_0}. \tag{13}
\]
Perturbations grow as square root of time. Let us stress again that such perturbations
cannot be considered infinitesimal so that the inverse cascade picture is not in contrast
with the exponential amplification of errors on initial conditions that is present in chaotic
dynamical systems.

There are two main predictions of the Lorenz approach: predictability time on large scale
independent of Reynolds number and growth of perturbations as a power of time instead of
an exponential.

In the next sections we use the theory of dynamical systems with many degrees of freedom
to argue that while the former is correct, the latter is a too rough description of the real
behavior of $\delta \mathbf{v}(t)$. 
III. PREDICTABILITY IN A CHAIN OF COUPLED MAPS

In this section we discuss the predictability problem in a system of coupled maps each with a different time scale. This is an idealized situation where each degree of freedom has a chaotic dynamics with its own characteristic time and it is coupled to the other degrees of freedom by a weak local interaction. Our toy model can be considered the prototype for physical situations where one can separate the evolution on different scales. Despite its simplicity, it displays non-trivial properties which enlighten the behaviour of more complex systems.

The system is given by a chain of chaotic coupled maps

\[
\begin{align*}
  x_1(t+1) &= (1 - \epsilon)g_1(x_1(t)) + \epsilon f(x_2(t)) \\
  x_2(t+1) &= (1 - \epsilon)g_2(x_2(t)) + \epsilon f(x_3(t)) \\
  &\quad \ldots \\
  x_{N-1}(t+1) &= (1 - \epsilon)g_{N-1}(x_{N-1}(t)) + \epsilon f(x_N(t)) \\
  x_N(t+1) &= g_N(x_N(t))
\end{align*}
\]

where the \(N\) variables \(x_k\) are defined on the interval \(I = [0, 1]\), \(\epsilon\) is the coupling constant, \(g_k\) and \(f\) are functions of \(I\) into itself. In order to mimic the energy cascade of turbulent flow, we assume that the function \(g_k\) represents the evolution law of an eddy of size \(l_k\) in the absence of interactions. In this context, \(x_k\) can be regarded as the velocity difference of the eddies on the octave of length scale \(l_k = L_0 2^{-k}\). The evolution is chaotic with a Lyapunov exponent proportional to the inverse of the eddy turn-over time \(\tau_k\). The simplest possible choice for \(g_k(x)\) is the piecewise linear map

\[
g_k(x) = e^{\lambda_k x} \mod 1
\]

From dimensional arguments, and using (9) we can estimate the eddy turn-over time \(\tau_k\) so that the Lyapunov exponent is

\[
\lambda_k = \frac{1}{T_0} 2^{2/3(k-1)}
\]
The coupling parameter $\epsilon$ is small and constant for each scale, although more realistic models could consider scale-dependent couplings. The form of $f(x)$ – the term representing the local interaction between eddies – does not affect the qualitative results. We have considered two possibilities: $f(x) = x$ and $f(x) = x^2$.

In order to study the predictability, the system (14) has been integrated with two different initial conditions $x(0)$ and $x'(0)$ differing on the smallest scale, $\Delta_k(0) \equiv x'_k(0) - x_k(0) = \delta_{k,N}\delta_0$. The initial incertitude is thus confined to the smallest and fastest scale $x_N$ while we want to forecast the behavior of the system at the largest scale $x_1$.

Because time-scales are well separated, we expect that at the beginning the uncertainty in the system is driven by the fastest scale $x_N$ and the error at any scale grows with the smallest characteristic time

$$\Delta_k(t) \sim \epsilon^{N-k}e^{\lambda N t}\delta_0$$  \hspace{1cm} (17)

where the power of $\epsilon$ is due to the locality of the interactions. The behavior (17) will last up to the time $T_N$ at which the perturbation at small scale saturates, i.e. $\Delta_N = \Delta_{sat}$. Then a second regime driven by the variable $x_{N-1}$, which has now the fastest exponential growth of errors, sets in. When this second regime holds, the incertitudes at scales $k \leq N - 1$ grows as $\sim e^{\lambda N - 1 t}$ until, at time $T_{N-1}$, the variable $x_{N-1}$ saturates and $x_{N-2}$ dominates, and so on. Such an argument suggests that a perturbation $\Delta_1$ at the largest scale $x_1$ follows different exponential laws with rates $\lambda_k$ ($k = 1, \cdots, n$) in each different regimes, with a global (envelope) evolution which appear very similar to a power law.

Figure 1 shows the error observed at large scale $\Delta_1$ as a function of time in a numerical experiment realized with a chain of $N = 10$ maps. The coupling function is chosen linear, $f(x) = x$, the coupling parameter is $\epsilon = 10^{-4}$, the largest characteristic time is $T_0 = 200$. The initial conditions are random and the initial perturbation on the small scale is $\delta_0 = 10^{-8}$. Figure 2 shows the error observed at large scale $\Delta_1$ as a function of time. Some exponential regimes are still recognizable, the straight lines with different slopes in the linear-logarithmic plot.
The observed behaviour can be well understood by means of a quasi-linear analysis which also allows for some analytical estimates. The evolution with \( f(x) \) leads to a linear evolution for the perturbation,

\[
\Delta(t + 1) = A \Delta(t)
\]  

(18)

where \( A \) is the \( N \times N \) Jacobian matrix

\[
A = \begin{pmatrix}
l_1 & \epsilon & 0 & \ldots & 0 & 0 \\
0 & l_2 & \epsilon & \ldots & 0 & 0 \\
\vdots & \vdots & \ddots & \ddots & \vdots & \vdots \\
0 & 0 & 0 & \ldots & 0 & l_N
\end{pmatrix}.
\]  

(19)

Let us denote with \( T_k \) the time at which scale \( k \) saturates, i.e. \( \Delta_k(T_k) = 1 \), and with \( M_k \) the period (number of steps) during which scale \( k \) dominates the dynamics, i.e. \( M_k = T_k - T_{k+1} \).

If we suppose that the main contribution to the growth of perturbations during period \( M_k \) is given by the faster scale \( \Delta_k \), which is correct whenever \( \epsilon \) is very small, we can write for any \( i < k \)

\[
\Delta_i(T_k) = \Delta_i(T_{k+1}) + (A^{M_k})_{i,k} \Delta_k(T_{k+1})
\]  

(20)

while \( \Delta_i(T_k) = \Delta_{sat} \) for \( i \geq k \). The matrix \( A^M \) can be easily computed and at the leading order is given by

\[
(A^M)_{i,k} = \epsilon^{k-i} \frac{e^{M \lambda_k} - e^{M \lambda_i}}{e^{\lambda_k} - e^{\lambda_i}}
\]  

(21)

The saturation periods are given by

\[
M_k = \frac{1}{\lambda_k} \log \frac{\Delta_{sat}}{\Delta_k(T_{k+1})}
\]  

(22)

so that from (20), (21), (22) and using the fact that \( e^{M \lambda_k} \Delta_k(T_{k+1}) \sim \Delta_{sat} \) we obtain

\[
M_k = \frac{1}{\lambda_k} \log \left( \frac{(\alpha - 1) \lambda_k}{\epsilon} \right), \quad \alpha = 2^{2/3}.
\]  

(23)

Figure 2 shows the result obtained averaging over 1000 initial perturbations. Scattered markers represent the values of \( \Delta_1(T_k) \) at the different saturation times, obtained according
to the quasi-linear analysis. The agreement with the direct simulation of (14) is quite good. The global behavior can be fitted by a power law, whose slope can be roughly estimated by the following argument. From (23), one has that the periods $M_k$ scale, a part logarithmic corrections, as $M_k \sim \lambda_k^{-1} \sim \alpha^{-k}$. From (24) the growth of $\Delta_1$ during period $M_k$ is estimated to be $\sim \epsilon^k$. Then, we expect $\Delta_1(t) \sim t^\gamma$ with $\gamma = -\log \epsilon / \log \alpha$.

We have also performed a second numerical experiment with a stronger coupling $\epsilon = 10^{-2}$ and quadratic coupling function $f(x) = x^2$. The initial error is $\delta_0 = 10^{-3}$, while all the other parameters in the model are unchanged. We take an average of 1000 runs of 2000 steps in order to get a good statistics. The results are reported in figure 3, where one sees that the error on large scale $\Delta_1(t)$ has a complex behaviour resulting from the combinations of several time-scales, which are now not well separated. However, even in this case, it is possible to determine an apparent power-law regime for intermediate times.

The system of coupled maps with different chaotic characteristic time teaches us that it is possible to have non trivial time evolutions of non-infinitesimal perturbations at slowest scale, and that these can be fitted by power laws, although they are actually generated by saturation processes. In this kind of systems, if we are interested in long time predictions, the maximum Lyapunov exponent is of little or no importance and one should consider all the time scales present in the system.

**IV. PREDICTABILITY IN A SHELL MODEL OF TURBULENCE**

In this section we discuss the problem of predictability in a model for the energy cascade in three dimensional fully developed turbulence [13–18]. The model, which is intended to mimic the Navier-Stokes equations, is defined in the Fourier space as follows. The Fourier space is divided into $N$ shells labelled by the wavevector modulus $k_n = k_0 2^n$, where $k_0$ is an arbitrary constant, each one containing all the wavevector $k$ with modulus $k_0 2^n < |k| \leq k_0 2^{n+1}$. The velocity difference over the length scale $\sim k_n^{-1}$ is given by a complex variable $u_n$ representing the Fourier components of the velocity field. The evolution is given by the
set of $N$ ordinary differential equation

$$\frac{d}{dt} u_n = -\nu k_n^2 u_n + i g_n + f_n \quad (24)$$

$$g_n = k_n^* u_{n+1}^* u_{n+2}^* - \frac{1}{2} k_{n-1}^* u_{n-1}^* u_{n+1}^* - \frac{1}{2} k_{n-2}^* u_{n-2}^* u_{n-1}^* \quad (25)$$

where $f_n$ is an external forcing, acting on large scale, necessary to have a stationary state, and $\nu$ the viscosity. The main differences with the Navier-Stokes equations are:

- i) the wave-vectors and the velocity fields $u_n$ are scalars;
- ii) there are only nearest and next-nearest neighbour interactions among shells.

The first point implies that it is not possible to have geometrical structures, all informations on phases being lost. The second point does not represent a strong limitation as long as the energy cascade in Fourier space is local, with exponentially decreasing interactions among shells. This is rather sensible for three-dimensional turbulence, but not for the two-dimensional case [17].

Despite the fact that the time evolution governed by (24)-(25) spends long times around an unstable fixed point given by the Kolmogorov law $|u_n| \propto k_n^{-1/3}$ [18], it exhibits chaotic behaviour on a strange attractor in the $2N$ dimensional phase space, with maximum Lyapunov exponent roughly proportional to $\nu^{-1/2}$. The velocity structure functions $\langle |u_n|^p \rangle \sim k_n^{-\zeta_p}$ have non-linear exponents $\zeta_p$ very similar to those of real turbulence [16].

Our study of predictability is based on the comparison of the temporal evolution of pairs of different realizations of the velocity field, say $u_n$ and $v_n$. Both fields evolve according to (24)-(25) form initial conditions such that:

- i) the energy spectra of $u_n$ and $v_n$ at the initial time are equal;
- ii) $u_n$ and $v_n$ at initial time differ only on small scales, corresponding to wavenumber $k_n \geq k_{nE}$:

$$v_n = \begin{cases} u_n & \text{for } n < n_E \\ e^{i \omega_n} u_n & \text{for } n \geq n_E \end{cases} \quad (26)$$
where \( w_n \) is a random number uniformly distributed in the range \([0, \theta]\).

By changing the value of \( \theta \) we can modify the correlation between the two field. The extreme case \( \theta = 2\pi \), i.e. completely uncorrelated variables for \( n \geq n_E \), corresponding to the Lorenz choice discussed in section [1].

Previous works [6] investigated the growth of different small perturbations in shell models. Here we want to study this issue for a finite perturbation at initial time.

In the numerical simulation we have taken as the reference field \( u_n \) in (26) a solution of (24)-(25) obtained from a long simulation starting from a random initial condition. The forcing \( f_n \) was taken constant and equal to

\[
f_n = (1 + i) \gamma \delta_{n,4}
\]

with \( \gamma = 0.005 \). The simulations were done mainly for two different systems: (A) \( N = 19 \) and \( \nu = 10^{-6} \); (B) \( N = 27 \) and \( \nu = 10^{-9} \). We used the leap-frog method of integration with time step \( 10^{-3} \) in the case (A) and \( 2 \times 10^{-5} \) in the case (B). The average is over \( 10^3 \) different realizations of the field \( v_n \). All the figures will be for the case (A), the case (B) being similar.

In order to understand whether intermittency has any effect on the qualitative features, we also performed a detailed study in terms of closure approximation, where, by construction, one considers averaged quantities neglecting intermittency. We thus developed the standard eddy damped quasi-normal markovian (EDQNM) approximation [14] for the shell model (see appendices [A] and [B]).

Among the various quantities that can be computed, we focused on the error-spectrum at wavevector \( k_n \)

\[
\Delta_n = \frac{1}{2} \langle (u_n - v_n)(u_n^* - v_n^*) \rangle = (E_n - \text{Re} W_n)
\]

(28)

where \( E_n = \langle u_n u_n^* \rangle = \langle v_n v_n^* \rangle \) is the energy of the two fields and \( W_n = \langle u_n v_n^* \rangle \) is the overlap energy at scale \( n \).

In Figs. [4] and [5] the error energy spectrum \( \Delta_n \) is showed at different times for \( \theta = 2\pi \) and \( 10^{-4} \), respectively.
In figure 4 we see that at the beginning we have a very fast growth until $\Delta_n$ reaches the saturation (i.e. $\Delta_n = E_n$) at large $n$. Then one has a sort of inverse cascade on the error. This is also the main feature one observes in the case of strong initial perturbation (figure 3).

In order to compare the error growth in the shell model with the behaviour observed in the toy model of section III, we also compute the (global) growth of the moments of the difference field, defined as

$$\langle |\delta u|^q \rangle = \left\langle \left[ \sum_n 2\Delta_n \right]^{q/2} \right\rangle.$$  \hfill (29)

and the large-scale error

$$\delta U_0 = \left[ \frac{\Delta_6 + \Delta_7 + \Delta_8}{3} \right]^{1/2}.$$  \hfill (30)

Figures 6 and 7 show the growth of the moments of $\langle |\delta u|^q \rangle^{1/q}$ respectively for $\theta = 2\pi$ and $\theta = 10^{-4}$. For the first case we observe at intermediate times a power law behaviour in agreement with the Lorenz prediction. The intermittency produces anomalous scaling, i.e. $\langle |\delta u|^q \rangle \sim t^{\alpha(q)}$ where $\alpha(q)$ is a non increasing function of $q$. Let us note that $\alpha(2) = 1/2$, as in Lorenz prediction where no intermittent effects are taken into account. In the case of small initial perturbation (figure 7) one can recognize an initial exponential growth until the error saturates at small scales. Then we find a kind of power law behaviour.

For a qualitative comparison with the results discussed for the coupled maps, we show in figure 8 the growth of $\delta U_0$. We can recognize an initial exponential growth driven by the smallest scale; in later times all the time scales interplay leading to a non simple function which can be misinterpreted as a power law.

The closure approximation for the shell model leads to a qualitative similar behaviour. The basic idea of closure is quite straightforward: one writes a Reynolds hierarchy for the moments of the shell variables, and truncate the chain of equations at the lowest sensible order. The full derivation is given below in appendices A and B. The closure equation thus gives information of the behaviour of $E_n$ and $W_n$ as functions of time. The results are similar.
to those obtained by the direct integration (and ensemble average) of the shell model, as is evident by the direct comparison of figure 9 with figure 4 and figure 10 with 5. This is a clear evidence that the relevant mechanism, at least at a qualitative level, is due to the existence of many characteristic times and not to intermittency effects.

V. DISCUSSION

The predictability problem can be formulated in terms of the Lyapunov exponent, or the effective Lyapunov exponent, only for infinitesimal perturbations. On the other hand in systems with many different characteristic times and finite perturbations the non-linear effects are very relevant. Direct consequence is that the growth of the perturbation is, a part at very short times, not exponential but rather similar to a power law. Actually it is a sequence of exponentials with varying rates. This mechanism has an important practical relevance: the predictability time for finite perturbations can be much larger than the inverse of the Lyapunov exponent (1).

For example, in three dimensional turbulence for a “physical” perturbation localized at the initial time at the Kolmogorov length $\eta$, $\delta v = O(v(\eta))$, the predictability time is $T \sim L/V$, independent of the Reynolds number. On the contrary, the predictability time for an infinitesimal perturbation is proportional to the inverse of the maximum Lyapunov exponent $\lambda$, which grows as a power of the Reynolds number. Hence the predictability time decreases for increasing $Re$.

These results give a strong indication that despite the presence of strong chaos, realistic situations have relatively long predictability times.

In conclusion we have showed that the concepts of Lyapunov exponents, effective Lyapunov exponent, Kolmogorov entropy give insufficient informations on the chaotic behaviour of extended systems, and it is urgent the identification of new indicators.
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APPENDIX A:

Here we derive the equations for the energy of the field in the eddy damped quasi-normal markovian approximation (EDQNM) for the shell model. For more details see e.g. [14][19].

We are interested into the energy of the shell $n$ given by $E_n = \langle u_n u_n^* \rangle$. Differentiation with respect to time of $E_n$, and use of (24)-(25), leads to the evolution equation for $E_n$ for the shell model:

$$\frac{d}{dt}E_n = -2 \nu k_n^2 E_n + i \langle g_n u_n^* \rangle - i \langle u_n g_n^* \rangle + 2 \epsilon \delta_{n,4}. \quad (A1)$$

In order to have a constant energy input $\epsilon$ we assumed a forcing

$$f_n = \frac{u_n}{|u_n|^2} \epsilon \delta_{n,4} \quad (A2)$$

in (24). This equation is not closed since the third and fourth terms on r.h.s involve third order correlation functions. For example

$$\langle g_n u_n^* \rangle = k_n \langle u_n^* u_{n+1}^* u_{n+2}^* \rangle - \frac{1}{2} k_{n-1} \langle u_{n-1}^* u_n^* u_{n+1}^* \rangle - \frac{1}{2} k_{n-2} \langle u_{n-2}^* u_{n-1}^* u_n^* \rangle \quad (A3)$$

and similarly the other. The third order cumulants obey a differential equation involving fourth order correlation functions, e.g.

$$\frac{d}{dt} \langle u_n u_{n+1} u_{n+2} \rangle = - \nu (k_n^2 + k_{n+1}^2 + k_{n+2}^2) \langle u_n u_{n+1} u_{n+2} \rangle$$

$$+ i \langle g_n u_{n+1} u_{n+2} \rangle + i \langle u_n g_{n+1} u_{n+2} \rangle + i \langle u_n u_{n+1} g_{n+2} \rangle. \quad (A4)$$
and so on. Thus in order to have a closed problem we have to truncate the hierarchy. This is done assuming a quasi-normal probability distribution for the field, and factorizing the fourth order correlation functions as

\[ \langle x_1 x_2 x_3 x_4 \rangle = \langle x_1 x_2 \rangle \langle x_3 x_4 \rangle + \langle x_1 x_3 \rangle \langle x_2 x_4 \rangle + \langle x_1 x_4 \rangle \langle x_3 x_2 \rangle. \quad (A5) \]

By means of (A5), and the assumption of isotropic turbulence

\[ \langle u^n u^m \rangle = \delta_{nm} E_n, \quad \langle u^n u^m \rangle = 0 \quad (A6) \]

it is easy to evaluate the terms involving the fourth order correlation functions in the equations for the third order ones, and close the hierarchy. For example for Eq. (A4) we have,

\[ \langle g_n u_{n+1} u_{n+2} \rangle = k_n E_{n+1} E_{n+2} \]
\[ \langle u_n g_{n+1} u_{n+2} \rangle = -\frac{1}{2} k_n E_n E_{n+2} \]
\[ \langle u_n u_{n+1} g_{n+2} \rangle = -\frac{1}{2} k_n E_n E_{n+1}. \quad (A7) \]

Inserting (A7) into (A4) we obtain

\[ \left[ \frac{d}{dt} + \nu (k_n^2 + k_{n+1}^2 + k_{n+2}^2) \right] \langle u_n u_{n+1} u_{n+2} \rangle = i S(n, t) \quad (A8) \]

with

\[ S(n, t) = k_n E_{n+1} E_{n+2} - \frac{1}{2} k_n E_n E_{n+2} - \frac{1}{2} k_n E_n E_{n+1}. \quad (A9) \]

Similar equations hold for the third order cumulants entering into Eq. (A3).

The quasi-normal approximation (A8) it is known to give unphysical results [19]. In particular it does not produce positive definite energy spectra. The problem has been cured by introducing the so-called “eddy damped” approximation. One replaces (A8) with

\[ \left[ \frac{d}{dt} + \nu (k_n^2 + k_{n+1}^2 + k_{n+2}^2) \right] \langle u_n u_{n+1} u_{n+2} \rangle + \mu_n + \mu_{n+1} + \mu_{n+2} \langle u_n u_{n+1} u_{n+2} \rangle = i S(n, t) \quad (A10) \]

where

\[ \mu_n \equiv \mu(k_n, E_n) = \alpha k_n E_n^{1/2}. \quad (A11) \]
Dimensionally $k_n E_n^{1/2}$ is an inverse time, the turn-over time at shell $n$. We have one free parameter, the dimensionless constant $\alpha$. It should be adjusted such that the spectrum is as similar as possible to the spectrum obtained in simulations of the full equation. We will return to this point later.

Equation (A10) can be easily integrate, and the solution reads

$$\langle u_n u_{n+1} u_{n+2} \rangle = i \int_0^t dt' e^{-\nu(k_n^2 + k_{n+1}^2 + k_{n+2}^2)(t-t')} S(n, t'). \quad \text{ (A12)}$$

It has been proved that if we assume that $S(n, t)$ does not vary significantly in the range where the exponential in (A12) is substantially different from zero, then this is a sufficient condition for the positiveness of the energy spectra [19]. This assumption is called Markovianization. Therefore the third order correlation function at time $t$ in the EDQNM approximation reads

$$\langle u_n u_{n+1} u_{n+2} \rangle = i \theta(n, t) S(n, t) \quad \text{ (A13)}$$

where

$$\theta(n, t) = \int_0^t dt' e^{-\nu(k_n^2 + k_{n+1}^2 + k_{n+2}^2)(t-t')} = \frac{1 - e^{-\nu(k_n^2 + k_{n+1}^2 + k_{n+2}^2)(t-t')}}{\nu(k_n^2 + k_{n+1}^2 + k_{n+2}^2) + \mu_n + \mu_{n+1} + \mu_{n+2}}. \quad \text{ (A14)}$$

Similar equations hold for the other third order correlation functions.

We can now go back to (A1) and write down the equation for the energy $E_n$ in the EDQNM approximation

$$\left( \frac{d}{dt} + 2\nu k_n^2 \right) E_n = 2 \left[ k_n^2 \theta(n, t) S(n, t) - \frac{1}{2} k_{n-1}^2 \theta(n-1, t) S(n-1, t) - \frac{1}{2} k_{n-2}^2 \theta(n-2, t) S(n-2, t) \right] + 2 \epsilon \delta_{n,4}. \quad \text{ (A15)}$$

The quasi-normal ansatz implies the absence of intermittency corrections. This is an essential limitation of all closure theories. The energy spectrum of the shell model in the EDQNM approximation must therefore obey $E_n \simeq C(\alpha) \epsilon^{2/3} k_n^{-2/3}$ in the inertial range. The undetermined function $C(\alpha)$ is the Kolmogorov constant.
On the other hand it has become clear in several independent investigations that intermittency corrections exist in shell models. The energy spectrum is therefore in reality more closely described by \( E_n \sim F(\epsilon)k_n^{-\zeta_2} \), where the exponent \( \zeta_2 \) has been estimated to be 0.70 \[16\]. The function \( F \) that gives the prefactor to the power law in the inertial range should not depend on viscosity, but depends on the forcing through \( \epsilon \), the mean dissipation of energy per unit time, or, equivalently, the mean energy input into the system from the force. In a really large inertial range the two power-laws are not good approximations to one other. The best that can be done is to demand that the spectra agree as closely as possible at the upper end of the inertial range. The disagreement at the lower end will then be approximately \( (k_L/k_0)^{\zeta_2-2/3} \). This is not a very large discrepancy. Assuming an inertial range of twenty shells, that is a scale separation of \( 10^6 \), and \( \zeta_2 = 0.70 \), the mismatch is only a factor 1.5. In practice a number of \( \alpha \)'s have been tried and the two spectra compared until a reasonable agreement is achieved. For \( \alpha = \text{???} \) we obtain \( C(\alpha) = 1.5 \) which is the value observed both in simulations of the shell model and in experiments \[19\].

**APPENDIX B:**

Here we derive the equations for the energy of the field difference in the eddy damped quasi-normal markovian approximation (EDQNM) for the shell model. The procedure is similar to that described in App. \[A\] for the energy, so we only report the main equations.

We consider two independent realizations of the field, \( u_n \) and \( v_n \), with the same energy spectrum \( E_n \), both evolving according to (24) and (25). For simplicity of notation, the equation of motion of the field \( v_n \) is rewritten as

\[
\frac{d}{dt} v_n = -\nu k_n^2 + ih_n + \tilde{f}_n
\]

\[
h_n = k_n v_{n+1}^* v_{n+2}^* - \frac{1}{2} k_{n-1} v_{n-1}^* v_{n+1}^* - \frac{1}{2} k_{n-2} v_{n-2}^* v_{n-1}^*
\]

\[
\tilde{f}_n = \frac{v_n}{|v_n|^2} \epsilon \delta_{n,4}
\]

We are interested into the energy of the field difference at the shell \( n \)
\[ \Delta_n = \frac{1}{2} \langle (u_n - v_n) (u_n^* - v_n^*) \rangle = (E_n - \text{Re} \, W_n) \]  
(B2)

where \( W_n = \langle u_n v_n^* \rangle \). The evolution equation of \( W_n \) is easily derived by differentiation with respect to time and reads,

\[ \frac{d}{dt} W_n = -2 \nu k_n^2 W_n + i \langle g_n v_n^* \rangle - i \langle u_n h_n^* \rangle + 2 \epsilon \delta_{n,4} \]  
(B3)

As the case of \( E_n \) this equation is not closed since it involves third order cumulants of \( u_n \) and \( v_n \). For example

\[ \langle g_n v_n^* \rangle = k_n \langle v_n^* u_{n+1}^* u_{n+2}^* \rangle - \frac{1}{2} k_{n-1} \langle u_{n-1}^* v_n^* u_{n+1}^* \rangle - \frac{1}{2} k_{n-2} \langle u_{n-2}^* u_{n-1}^* v_n^* \rangle \]  
(B4)

and similarly the other. As done for the energy \( E_n \), the hierarchy is closed the fourth order correlation functions. With a calculation similar to that of App. [A], one obtains

\[ \left[ \frac{d}{dt} + \nu (k_n^2 + k_{n+1}^2 + k_{n+2}^2) \right] \langle v_n^* u_n^* u_{n+2}^* \rangle = -i k_n W_{n+1}^* W_{n+2}^* + i \frac{1}{2} k_n W_n E_{n+2} + i \frac{1}{2} k_n W_n E_{n+1} \]  
(B5)

and similar equations for the others.

We then perform the eddy damped and markovian approximation, i.e. add a damping term \((\mu_n + \mu_{n+1} + \mu_{n+2})W_n\) to the l.h.s, where \( \mu_n \) is given by (A11), and we integrate the resulting equation in the markovian approximation – see App. [A] for more details. From (B5), it follows

\[ \langle v_n^* u_{n+1}^* u_{n+2}^* \rangle = -i \theta(n, t) k_n \left[ k_n W_{n+1}^* W_{n+2}^* - \frac{1}{2} k_n W_n E_{n+2} - \frac{1}{2} k_n W_n E_{n+1} \right] \]  
(B6)

with \( \theta(n, t) \) given by (A14). The other cumulants leads to similar equations. Collecting all the terms one finally obtains the equation for \( W_n \) in the EDQNM approximation

\[
\left( \frac{d}{dt} + 2 \nu k_n^2 \right) W_n = 2 \left[ k_n^2 \theta(n, t) \left( W_{n+1}^* W_{n+2}^* - \frac{1}{2} W_n E_{n+2} - \frac{1}{2} W_n E_{n+1} \right) - \frac{1}{2} k_{n-1}^2 \theta(n-1, t) \left( W_{n+1} E_{n+1} - \frac{1}{2} W_{n-1} W_{n+1}^* - \frac{1}{2} W_{n-1} W_n \right) - \frac{1}{2} k_{n-2}^2 \theta(n-2, t) \left( W_{n+1} E_{n-1} - \frac{1}{2} W_{n-2} W_n - \frac{1}{2} W_{n-2} W_{n-1} \right) \right] + 2 \epsilon \delta_{n,4}.
\]  
(B7)
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FIGURES

FIG. 1. Error growth $\Delta_1$ as a function of $t$ for $\epsilon = 10^{-4}$. The straight segments correspond to exponential growth driven by different dominant scales.

FIG. 2. $\langle \Delta_1 \rangle$ as a function of $t$ for $\epsilon = 10^{-4}$. The average is taken over 1000 initial configurations. The symbols (diamonds) are the estimated growth of the largest scale $\Delta_1$ during different periods $M_k$ according to the quasi-linear approximation. Dashed line: power law expected by the simple argument described in the text.

FIG. 3. Error growth $\Delta_1$ for a non-linearly coupled system with $\epsilon = 10^{-2}$.

FIG. 4. Error spectrum $\Delta_n$ as a function of $n$ at different time for case (A) and $\theta = 2\pi$. The lines are taken at times: 0, 1, 2, 3, 4, 5, 10, 15, 20, 25 and 30 seconds after the perturbation has been done. The dashed line is the spectrum $E_n$.

FIG. 5. Error spectrum $\Delta_n$ as a function of $n$ at different time for case (A) and $\theta = 10^{-4}$. The lines are taken at times: 0, 5, 10, 15, 20, 25, 30, 35, 40, 45 and 50 seconds after the perturbation has been done. The dashed line is the spectrum $E_n$.

FIG. 6. Moments of the difference field $\langle |\delta u|^q \rangle^{1/q}$ ($q = 1, 2, 3, 4$) as a function of $t$ for case (A) and $\theta = 2\pi$.

FIG. 7. Moments of the difference field $\langle |\delta u|^q \rangle^{1/q}$ ($q = 1, 2, 3, 4$) as a function of $t$ for case (A) and $\theta = 10^{-4}$.

FIG. 8. $\delta U_0$ as a function of $t$ for the case (A).

FIG. 9. Error spectrum $\Delta_n$ as a function of $n$ at different time for the EDQNM approximation and $\theta = 10^{-4}$. The lines are taken at time interval 0.02 seconds from the perturbation, first line. The dashed line is the spectrum $E_n$. 

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FIG. 10. $\langle |\delta u|^2 \rangle$ as a function of $n$ at different time for the EDQNM approximation and $\theta = 10^{-4}$. 
\[ \log_2 \Delta_n \]

Graph with the x-axis labeled \( n \) and the y-axis labeled \( \log_2 \Delta_n \). The graph shows multiple curves indicating \( \log_2 \Delta_n \) for different values of \( t \). The arrow at \( t = 0 \) indicates the starting point.
\[ \langle |u-v|^2 \rangle \]