
General Introduction

Turbulence is often defined as the chaotic state of a fluid. The example that immediately comes to mind is that of water: turbulence in water takes the form of eddies whose size, location, and orientation are constantly changing. Such a flow is characterized by a very disordered behavior difficult to predict and by the existence of multiple spatial and temporal scales. There are many experiments of everyday life where the presence of turbulence can be verified: the agitated motions of a river downstream of an obstacle, those of smoke escaping from a chimney, or the turbulence zones that one sometimes crosses in an airplane.

Experiencing turbulence at our scale seems easy since it is not necessary to use powerful microscopes or telescopes. A detailed analytical understanding of turbulence remains, however, limited because of the intrinsic difficulty of nonlinear physics. As a result, we often read that turbulence is one of the last great unresolved problems of classical physics. This long-held message, found, for example, in Feynman et al. (1964), no longer corresponds to the modern vision. Indeed, even if turbulence remains a very active research topic, we have to date many theoretical, numerical, experimental, and observational results that allow us to understand in detail a part of the physics of turbulence.

This book deals mainly with wave turbulence. However, wave turbulence is not totally disconnected from eddy turbulence, from which the main concepts have been borrowed (e.g. inertial range, cascade, two-point correlation function, spectral approach). Moreover, very often, wave turbulence and eddy turbulence can coexist as in rotating hydrodynamics. This is why a broad introduction to eddy turbulence is given (Part I) before moving on to wave turbulence (Part II), giving this book, for the first time, a unified view on turbulence. We will see that many results have been obtained since the first steps taken by Richardson (1922), a century ago. The many examples discussed in this book reveal that the classical presentation of turbulence, based on the Navier–Stokes equations (Frisch, 1995; Pope, 2000), is somewhat too simplistic because turbulence is found in various environments, in various forms. If we restrict ourselves to the standard example of incompressible

hydrodynamics, the simple introduction of a uniform rotation for describing geophysical fluids drastically changes the physics of turbulence by adding anisotropy. In astrophysics, 99 percent of the visible matter of the Universe is in the form of plasma, which is generally very turbulent, but plasma turbulence mixes waves and eddies. The regime of wave turbulence, described in Part II, can emerge from a vibrating steel plate; here, we are far from the classical image of eddies in water. Finally, recent studies reveal that the cosmological inflation that followed the Big Bang could have its origin in strong gravitational wave turbulence.

The objective of Part I, which follows this first chapter, is to present the fundamentals of turbulence. We will start with eddy turbulence, where the first concepts and laws have emerged. We will limit ourselves to the most important physical laws. The theoretical framework will be that of a statistically homogeneous turbulence for which a universal behavior is expected. The problems of inhomogeneity inherent to laboratory experiments will therefore not be dealt with. Through the examples discussed, we will gradually reveal the state of knowledge in turbulence. To help us in this task, we begin with a brief historical presentation.

I.1 Brief History

I.1.1 First Cognitive Advances

Leonardo da Vinci was probably the first to introduce the word *turbulence* (*turbulenza*) at the beginning of the sixteenth century to describe the tumultuous movements of water. However, the word was not commonly used by scientists until much later.¹

The first notable scientific breakthrough in the field of turbulence can be attributed to Reynolds (1883): he showed experimentally that the transition between the laminar and turbulent regimes was linked to a dimensionless number – the Reynolds number.² The experiment, which can be easily reproduced in a laboratory, consists of introducing a colored stream of the same liquid as circulating in a straight transparent tube (see Figure 1.1). It can be shown that the transition to turbulence occurs when the Reynolds number becomes greater than a critical value. An important step in this discovery is the observation that the tendency to form eddies increases with the temperature of the water, and Reynolds knew that in this case the viscosity decreases. He also showed the important role played by the development of instabilities in this transition to turbulence.

World War I was a time of further important advances. The war efforts in Germany and, in particular, under the influence of Prandtl in Göttingen, directed

¹ For example, the book of Boussinesq (1897) still bears the evocative title: “Theory of the Swirling and Tumultuous Flow of Liquids in Straight Beds with a Large Section.”

² The Reynolds number measures the ratio between the inertial force and the viscous force. We will come back to this definition in Section 1.3.

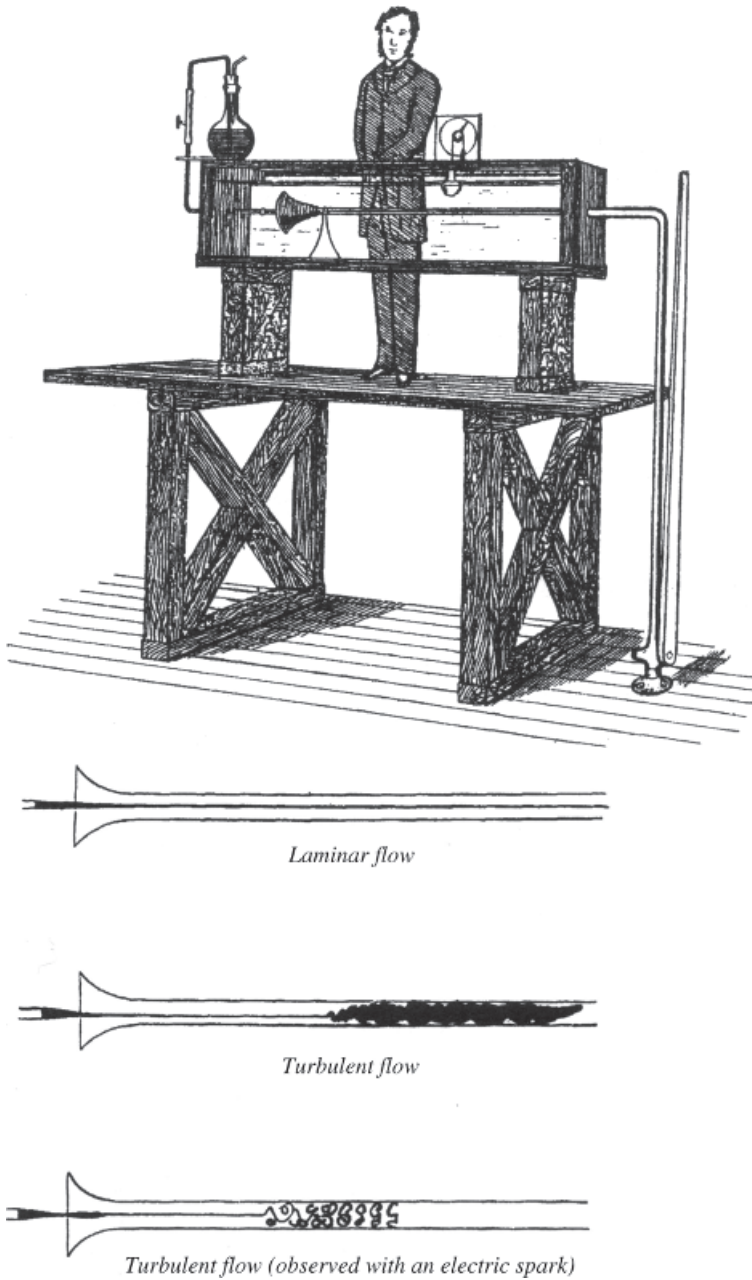


Figure 1.1 Historical experiment of Reynolds (1883) (top) and his observations (bottom). The original device is kept at the University of Manchester.

the research in the field of aerodynamics to the study of the fall of bombs in air or water. It is a question here of studying, for example, the drag of a sphere;

this work was then used for the design of airplanes. After the war, research in turbulence increased: for example, we can mention the results on the inhomogeneous effects due to walls in wind tunnel experiments (Burgers, 1925). But it is with Richardson (1922) that a second major breakthrough in turbulence arrives: in his book on weather predictions and numerical calculation.³ Richardson introduced the fundamental concept of energy cascade. Inspired by the Irish writer J. Swift, Richardson wrote “Big whirls have little whirls that feed on their velocity. Little whirls have lesser whirls and so on to viscosity – in the molecular sense” (page 66). We find here the idea of a cascade of eddies from large to small spatial scales.

It is probably with this idea in mind that Richardson (1926) formulated the empirical 4/3 law⁴ to describe the turbulent diffusion process. This law differs from the one proposed by Einstein in 1905 on the diffusion of small particles in a liquid (Brownian motion), which was in clear disagreement with turbulence experiments where a much higher diffusion was found.⁵ The proposed new law is characterized by a nonconstant diffusion coefficient D_ℓ , which depends on the scale being considered, such that:

$$D_\ell \sim \ell^{4/3}. \quad (1.1)$$

This relationship reflects the fact that in a turbulent liquid the diffusivity increases with the mean separation between pairs of particles. This scaling law is fundamental because we find there the premises of the exact four-fifths law of Kolmogorov (1941a), with which it is in agreement dimensionally.

It was during this interwar period that the first works based on two-point correlations emerged (Taylor, 1935),⁶ as well as works on the spectral analysis of fluctuations by Fourier transform, which have become the basis of modern research in turbulence (Motzfeld, 1938; Taylor, 1938). The correlation approach leads, in particular, to the Kármán–Howarth equation (von Kármán and Howarth, 1938) for an incompressible, statistically homogeneous, and isotropic⁷ hydrodynamic turbulence. This equation describes the fluid dynamics through correlators – two-point measurements in physical space. As we will see in Chapter 2, this result is central for the establishment of the exact four-fifths law of Kolmogorov (1941a), which is not a dynamic equation but a statistical solution of Navier–Stokes equations.

³ “Numerical calculation” here means calculation carried out by hand with a method essentially based on finite differences.

⁴ This empirical law should not be confused with the exact four-thirds law which deals with structure functions (see Chapter 2).

⁵ It is known that a cloud of milk dilutes more rapidly in tea if stirred with a spoon.

⁶ It is the British Francis Galton (1822–1911) who seems to have been the first to correctly introduce the concept of correlation for statistical studies in biology.

⁷ This is the strong isotropy that is considered here, which we will return to in Section 1.4.

1.1.2 Kolmogorov's Law and Intermittency

In the 1930s and under the leadership of the mathematician Kolmogorov, the Soviet school became very active in turbulence. At that time, Kolmogorov was working on stochastic processes and random functions. It was therefore natural that he turned his attention to turbulence, where a pool of data was available. Based on some of the work described in the Section 1.1.1, Kolmogorov and his student Obukhov set out to develop a theory for the standard case of incompressible, statistically homogeneous, and isotropic hydrodynamic turbulence. Based, in particular, on the Kármán–Howarth equation, Kolmogorov (1941a,b) established the first exact statistical law of turbulence – known as the four-fifths law – which relates a third-order structure function involving the difference of the component in direction ℓ of the velocity between two points separated by the vector ℓ , the distance ℓ , and the mean rate of dissipation of kinetic energy ε ($\langle \rangle$ means the ensemble average):⁸

$$-\frac{4}{5}\varepsilon\ell = \langle [u_\ell(\mathbf{x} + \ell) - u_\ell(\mathbf{x})]^3 \rangle. \quad (1.2)$$

To establish this universal law, Kolmogorov assumes that fully developed turbulence becomes isotropic on a sufficiently small scale, regardless of the nature of the mean flow. He also assumes that ε becomes independent of viscosity within the limits of large Reynolds numbers (i.e. low viscosity); this is what is often referred to today as the zeroth law of turbulence. After several years of research, a first exact law was established for which it was possible to get rid of the nonlinear closure problem. The trick used to achieve this was to relate the cubic nonlinear term to the mean energy dissipation in the inertial range, that is, in a limited range of scales between the larger scales where inhomogeneous effects can be felt, and the smaller scales where viscosity efficiently damps the fluctuations. We will return at length to the law (1.2) in Chapter 2. Kolmogorov's law remained unnoticed for several years (outside the USSR). It was Batchelor (1946) who was the first to discover the existence of Kolmogorov's articles:⁹ he immediately realized the importance of this work, which he shared with the scientific community at the Sixth International Congress of Applied Mathematics held in Paris in 1946 (Davidson et al., 2011).

For his part, independently of Kolmogorov but inspired by the ideas of Richardson (1922), Taylor (1938), and the work by Millionschikov (1939, 1941), who was another student of Kolmogorov, Obukhov (1941b) proposed a nonexact spectral theory of turbulence based on the relationship:

⁸ Kolmogorov was probably the first to be interested in structure functions that are constructed from the differences and not from the products of a field (here the velocity field), as was the case with the Kármán–Howarth equation.

⁹ The English version of the Russian papers had been received in the library of the Cambridge Philosophical Society.

$$\frac{\partial E}{\partial t} + D = T, \quad (1.3)$$

with E the energy spectrum, D the viscous dissipation, and T the energy transfer (in Fourier space). The artificial closure proposed is based on an average over small scales. He obtained as a solution the energy spectrum:¹⁰

$$E(k) \sim k^{-5/3}, \quad (1.4)$$

which is dimensionally compatible with Kolmogorov's exact law. In extending this study, Obukhov was then able to provide a theoretical justification for Richardson's (1926) empirical 4/3 law of diffusion. Later, Yaglom (1949) obtained a new exact law, applied this time to the passive scalar: this model describes how a scalar evolves, for example the temperature or the concentration of a product, in a turbulent fluid for which the velocity fluctuations are given.

For a short period of time Kolmogorov thought that the mean rate of energy dissipation was the key to establishing a more general exact law describing the statistics at any order in terms of a velocity structure function. This general law would have provided a complete statistical solution to the problem of hydrodynamic turbulence. But in 1944, Landau¹¹ pointed out the weakness of the demonstration (proposed by Kolmogorov during a seminar), which we will come back to in Chapter 2: it does not take into account the possible local fluctuations of ε , a property called intermittency. It took about 20 years for Kolmogorov (1962) and Oboukhov (1962) to propose, in response to Landau, a model (and not an exact law) of intermittency based on a log-normal statistics which incorporates the exact four-fifths law as a special case. Kolmogorov's answer was given (in French) at a conference held in Marseilles in 1961 to celebrate the opening of the Institut de Mécanique Statistique de la Turbulence. This conference became famous because it brought together for the first time all the major specialists (American, European, and Soviet) on the subject. It was also during this conference that the first energy spectrum in $k^{-5/3}$ measured at sea was announced (Grant et al., 1962).

Basically, the notion of intermittency is related to the concentration of dissipation in localized structures of vorticity. As mentioned by Kolmogorov, intermittency may slightly modify the $-5/3$ exponent of the energy spectrum, but its most important contribution is expected for statistical quantities of higher orders (the exact law is of course not affected). This new formulation is at the origin of work, in particular, on the concept of fractal dimension as a model of intermittency (Mandelbrot, 1974; Frisch et al., 1978) – see Chapter 2. It is interesting to note that we already find the concept of fractional dimension in Richardson's (1922) book, where the study of geographical boundaries is discussed.

¹⁰ In general, this solution is called the Kolmogorov spectrum, but it would be more accurate to call it the Kolmogorov–Obukhov spectrum. This spectrum was also obtained independently by other researchers, such as Onsager (1945) and Heisenberg (1948).

¹¹ Landau's remark (Landau and Lifshitz, 1987) can be found in the original 1944 book (Davidson et al., 2011).

I.1.3 Spectral Theory and Closure

In this postwar period, the theoretical foundations of turbulence began to be established. The first book exclusively dedicated to this subject is that of Batchelor (1953), which still remains a standard reference on the subject: it deals with statistically homogeneous turbulence. From the 1950s, a major objective seemed to be within the reach of theorists: developing a theory for homogeneous and isotropic turbulence in order to rigorously obtain the energy spectrum. The work of Millionschikov (1941) (see also Chandrasekhar, 1955) based on the quasi-normal approximation (QN) had opened the way: this approximation – a closure – assumes that moments of order four and two are related as in the case of a normal (Gaussian) law without making this approximation for moments of order three (which would then be zero, making the problem trivial). Kraichnan (1957) was the first to point out that this closure was inconsistent because it violated some statistical inequalities (realizability conditions), and Ogura (1963) demonstrated numerically that this closure could lead to a negative energy spectrum for some wavenumbers.

In this quest, Kraichnan (1958, 1959) proposed a sophisticated theory which does not have the defects we have just mentioned: it is the direct interaction approximation (DIA), which is based on field theory methods, a domain in which Kraichnan was originally trained.¹² The fundamental idea of this approach is that a fluid perturbed over a wavenumber interval will have its perturbation spread over a large number of modes. Within the limit $L \rightarrow +\infty$, with L being the side of the cube in which the fluid is confined, this interval becomes infinite in size, which suggests that the mode coupling becomes infinitely weak. The response to the perturbation can then be treated in a systematic way. Under certain assumptions, two integro-differential equations are obtained for the correlation functions in two points of space and two of time, and the response function. The inferred prediction for the energy spectrum, in $k^{-3/2}$, is, however, not in dimensional agreement with Kolmogorov's theory, nor with the main spectral measurements. Improvements were then made (Lagrangian approach) to solve some problems (noninvariance by random Galilean transformation, Kolmogorov spectrum) (Kraichnan, 1966): this new theory can be seen as the most sophisticated closure model.¹³ This work has led, in particular, to the development of the EDQNM (eddy-damped quasi-normal Markovian) closure model (Orszag, 1970), still widely used today, to which we will return in Chapter 3.

¹² Kraichnan became interested in turbulence in the early 1950s while he was Einstein's postdoctoral fellow.

Together, they searched for nonlinear solutions to the unified field equations.

¹³ In (strong) eddy turbulence, no exact spectral theory with an analytical closure has been found to date. This contrasts with the (weak) wave turbulence regime, for which an asymptotic closure is possible (see Chapter 4).

1.1.4 Inverse Cascade

Two-dimensional hydrodynamic (eddy) turbulence is the first example where an inverse cascade was suspected. The motivation for the study of such a system may seem on the face of it surprising, but several works showed that a two-dimensional approach could account for the atmospheric dynamics quite satisfactorily (Rossby and collaborators, 1939). We now know that the rotation, or stratification, of the Earth's atmosphere tends to confine its nonlinear dynamics to horizontal planes.¹⁴ The first work on two-dimensional hydrodynamic turbulence dates back to the 1950s with, for example, Lee (1951), who demonstrated that a direct energy cascade would violate the conservation of enstrophy (proportional to vorticity squared), which is the second inviscid invariant (i.e. at zero viscosity) of the equations. Batchelor (1953) had also noted at the end of his book that the existence of this second invariant should contribute to the emergence, by aggregation, of larger and larger eddies. He concluded by asserting the very great difference between two- and three-dimensional turbulence. By using the two inviscid invariants, energy and enstrophy, Fjørtoft (1953) was able on his part to demonstrate, in particular with dimensional arguments, that the energy should cascade preferentially towards large scales.

It is in this context, clearly in favor of an inverse energy cascade, that Kraichnan became interested in two-dimensional turbulence. Using an analytical development of Navier–Stokes equations in Fourier space, the use of symmetries, and under certain hypotheses such as the scale invariance of triple moments, Kraichnan (1967) rigorously demonstrated the existence of a dual cascade – that is, in two different directions – of energy and enstrophy (see Chapter 3). This prediction is in agreement with previous analyses and the existence of a direct cascade of enstrophy and an inverse cascade of energy for which the proposed (nonexact) spectrum is in $k^{-5/3}$.

The existence in the same system of two different cascades was quite new in eddy turbulence. This prediction has since been accurately verified both experimentally and numerically (Leith, 1968; Pouquet et al., 1975; Paret and Tabeling, 1997; Chertkov et al., 2007). The second-best-known system where an inverse cascade exists is that of magnetohydrodynamics (MHD): using some arguments from Kraichnan (1967), Frisch et al. (1975) deduced in the three-dimensional case the possible existence of an inverse cascade of magnetic helicity, a quantity which plays a major role in the dynamo process in astrophysics (Galtier, 2016). To date, we know several examples of turbulent systems producing an inverse cascade (see, e.g., the review of Pouquet et al., 2019).

¹⁴ Chapter 6 is devoted to inertial wave turbulence (i.e. incompressible hydrodynamic turbulence under a uniform and rapid rotation), for which it can be rigorously demonstrated that the cascade is essentially reduced to the direction transverse to the axis of rotation. However, it can be shown in this case that the energy cascade is direct.

Kraichnan's (1967) discovery was made at a period when the theory of wave turbulence, the regime that is the main subject of this book, was beginning to produce important results. The brief history presented in Chapter 4 allows us to appreciate the evolution of ideas on this subject, which finds a large part of its foundations in eddy turbulence (spectral approach, inertial range, cascade, closure problem). In this context, a problem that attracted a lot of attention was that of gravity wave turbulence (which is an example of surface waves). This problem deals with four-wave resonant interactions: in this case, there are two inviscid invariants, energy and wave action. The first is characterized by a direct cascade and the second by an inverse cascade. The study carried out¹⁵ by Zakharov and Filonenko (1966) (see also Zakharov and Filonenko, 1967) focused only on the energy spectrum. The authors obtained the exact solution as a power law associated with energy, but curiously they did not focus on the second solution and therefore did not immediately realize that it corresponded to a new type of cascade. Starting from a similar study (involving four-wave resonant interactions) on Langmuir wave turbulence by Zakharov (1967), in which the energy spectrum had also been obtained, Kaner and Yakovenko (1970) found the second exact solution corresponding to an inverse cascade of wave action. It is thus in the field of plasmas that the existence of a dual cascade was finally demonstrated in wave turbulence.¹⁶

A major difference between the two turbulence regimes is that, unlike (strong) eddy turbulence, (weak) wave turbulence theory is analytical (see Chapter 4). In this case, one can develop a uniform asymptotic theory and obtain the dynamic equations of the system and then, if they exist, its exact spectral solutions. It is then possible to provide analytical proof of the type of cascade (direct or inverse). It is also possible to prove the local character of turbulence (by a study of the convergence of integrals) and thus be in agreement with one of Kolmogorov's fundamental hypotheses. For this reason, exact nontrivial solutions of wave turbulence are called Kolmogorov–Zakharov spectra. There are several examples in wave turbulence where there is an inverse cascade of wave action; in Chapter 9 we present the case of gravitational wave turbulence (Galtier and Nazarenko, 2017). It is less common to obtain an inverse cascade in the case of three-wave resonant interactions. An example is given by rotating magnetohydrodynamic turbulence: the energy cascades directly and the hybrid helicity (a modified magnetic helicity) cascades inversely (Galtier, 2014).

To conclude this section, let us note that Robert Kraichnan and Vladimir Zakharov received the Dirac medal in 2003 for their contributions to the theory of turbulence, particularly the exact results and the predictions of inverse

¹⁵ Many other studies have been devoted to gravity wave turbulence. Chapter 4 discusses some of them.

¹⁶ The second exact solution corresponding to an inverse cascade of wave action for gravity waves was published by Zaslavskii and Zakharov (1982).

cascade, and for identifying classes of turbulence problems for which in-depth understanding has been achieved.

1.1.5 Emergence of Direct Numerical Simulation

From the 1970s, a new method for analyzing turbulence emerged: direct numerical simulation (Patterson and Orszag, 1971; Fox and Lilly, 1972). By direct, we mean the simulation of the fluid equations themselves and not a model of these equations. We have already cited as a model the EDQNM approximation used in hydrodynamics (Orszag, 1970); there is also the case of magnetohydrodynamics with the study of the inverse cascade of magnetic helicity (Pouquet et al., 1976). There are other models such as nonlinear diffusion models (Leith, 1967) or shell models (Biferale, 2003) – which we will briefly discuss in Chapter 3.

Since its beginnings, direct numerical simulation has made steady progress. It currently represents a means of studying turbulence in great detail; it is also an indispensable complement to experimental studies. It is impossible to summarize in a few lines the numerous results obtained in the field of numerical simulation. Let us simply point out that the regular increase in spatial resolution makes it possible to increase the Reynolds number and to describe increasingly fine structures (see Figure 1.2). It is interesting to compare the current situation with the first direct numerical simulations of incompressible three-dimensional hydrodynamic turbulence. For example, Orszag and Patterson (1972) used a spatial resolution of 64^3 and, as explained by the authors, each time step then required a computation time of 30 seconds! It is also interesting to note that the diffusion of knowledge takes some time: for example, the first direct numerical simulation of incompressible three-dimensional magnetohydrodynamic turbulence was realized by Pouquet and Patterson (1978) with a spatial resolution of 32^3 . Nowadays, a standard direct numerical simulation of turbulence is generally performed with a pseudospectral code, in a periodic box and with a spatial resolution of about 2048^3 – the highest to date being $16\,384^3$ (Iyer et al., 2019). For more information on the subject, the reader can consult the review article of Alexakis and Biferale (2018), where numerous examples of direct numerical simulation are presented in the context of various turbulence studies.

1.1.6 Turbulence Today

In the history of sciences on turbulence, the early 1970s were a turning point. Very schematically, we can consider that the theory of turbulence was built during the years 1922–1972, a period during which the main concepts were introduced, allowing the first exact results to be obtained.¹⁷ The books of Monin and

¹⁷ The year 1922 can be used as a reference since it is this year that Richardson introduced the fundamental concept of energy cascade.

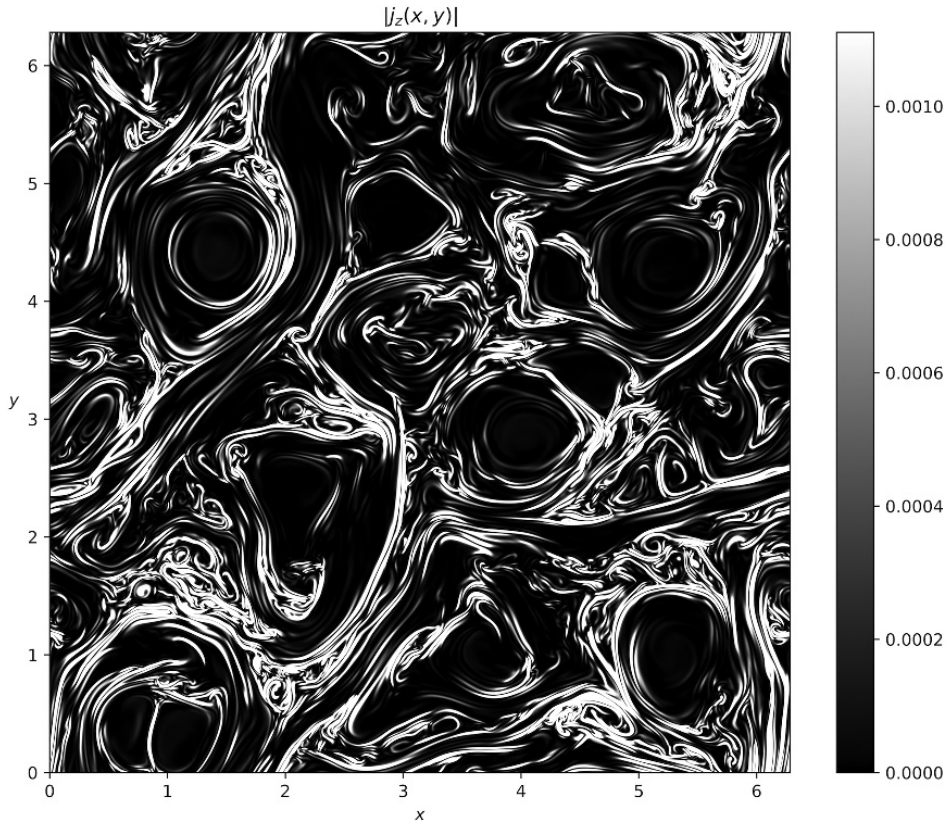


Figure 1.2 Two-dimensional direct numerical simulation of incompressible magnetohydrodynamic turbulence (see Chapter 7). The image, with a spatial resolution of 2048×2048 , shows the norm of the out-of-plane component of the electric current. The white regions correspond to the sites of energy dissipation.

Yaglom (1971, 1975) summarize the situation well. After this period, which can be described as exploration, the years 1972–2022 are rather a period of exploitation during which the results of incompressible hydrodynamics were generalized to other systems, often much more complex. However, it would be simplistic to limit this second period to a simple exploitation, because new concepts have also emerged and our knowledge has been considerably refined thanks, in particular, to numerous experiments and direct numerical simulations.

Today, the physics of turbulence appears in many fields (physics, geophysics, astrophysics, cosmology, aeronautics, biology) and it is impossible to draw up an exhaustive list of its applications. Given the difficulty of the subject, the use of simple – even simplistic – models of turbulence is quite common. The best-known result is probably the Kolmogorov energy spectrum. While there is no reason to think that this form of spectrum appears in other turbulence problems, it is often mentioned or even used. On the other hand, the exact laws based on two-point

measurements in physical space are less known, as well as the regime of wave turbulence.

Part I of this book is a short introduction to eddy turbulence, where historically the main concepts and results of turbulence have been developed. This part is therefore very important to appreciate Part II, the second and main part of the book, devoted to wave turbulence. In Chapter 2, special attention will be given to anomalous dissipation and the zeroth law of turbulence, which are fundamental for both eddy and wave turbulence. It is then used to derive a modern form of the Kolmogorov exact law. We note in passing that the exact laws of turbulence are also valid for wave turbulence: for example, the Kolmogorov exact law (without the assumption of statistical isotropy) is also valid for inertial wave turbulence (see Chapter 6). In Chapter 2 we also introduce the Kolmogorov eddy phenomenology (which we will compare to the wave turbulence phenomenology in the second part) and intermittency models. The treatment of turbulence in Fourier space will be presented in Chapter 3. In particular, the discussion of statistical closures developed in the 1960s is relevant to the comparison with the wave turbulence closure presented in Chapter 4. The case of two-dimensional turbulence will also be discussed in great detail; we will show that the Zakharov transformation, used so far only for wave turbulence, can also be a powerful tool in this case.

Part II of the book is devoted to wave turbulence: after a general introduction to the subject and a nonexhaustive list of applications of this regime (Chapter 4), various examples will be treated in Chapters 5 to 9. Capillary wave turbulence is probably the simplest example to present the theory of wave turbulence. Therefore, in Chapter 5, we present this theory in great detail. This is an essential technical chapter to master the asymptotic development.

This book is an introduction to the physics of wave turbulence. The bias is to present fundamental results limited to the case of statistically homogeneous turbulence. Therefore, the problems of inhomogeneity that we encounter, especially in laboratory experiments, will not be discussed. Nevertheless, the results of laboratory experiments will be regularly presented, as well as those obtained from observations or numerical simulations.

1.2 Chaos and Unpredictability

Defining turbulence precisely requires the introduction of a number of notions that we will define in part in this chapter. Without going into detail, we can notice that the disordered – or chaotic – aspect seems to be the primary characteristic of turbulent flows. The chaotic nature of a system is of course related to nonlinearities. It is often said that a system is chaotic when two points initially very close to each other in phase space separate exponentially over time. This definition can be extended to the case of fluids.

The origin of the media success of chaos theory goes back to the early 1960s. It is indeed at this period that the meteorologist Lorenz from the Massachusetts Institute of Technology (MIT) decided to use his computer (a Royal McBee LGP-300, without screen, capable of performing 60 operations per second) to numerically integrate a system of nonlinear differential equations – the Lorenz system – which is a simplified version of the fluid equations of thermal convection and whose form is:

$$\frac{dX}{dt} = \sigma(Y - X), \quad (1.5a)$$

$$\frac{dY}{dt} = \rho X - Y - XZ, \quad (1.5b)$$

$$\frac{dZ}{dt} = XY - \beta Z, \quad (1.5c)$$

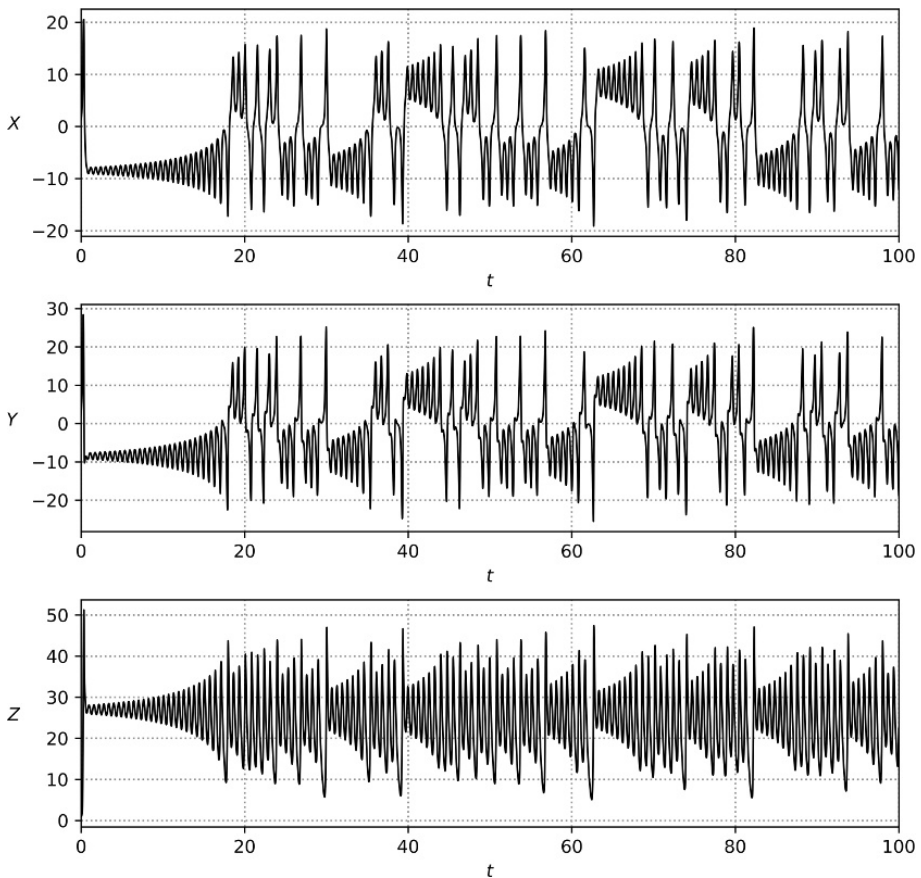


Figure 1.3 Numerical simulation of the Lorenz system (1.5) with $\sigma = 10$, $\rho = 28$ and $\beta = 8/3$. The three variables $X(t)$, $Y(t)$, and $Z(t)$ show a randomness, or unpredictability, in terms of variations or sign changes.

where σ , ρ , and β are real parameters. In Figure 1.3 we show the evolution over time of the three variables $X(t)$, $Y(t)$, and $Z(t)$.

By pure chance, Lorenz (1963) observed that two initial conditions very close to each other diverge quite rapidly.¹⁸ Since linear functions imply results proportional to the initial uncertainties, the observed divergence could only be explained by the presence of nonlinear terms in the model equations. Lorenz then understood that even if some nonlinear phenomena are governed by rigorous and perfectly deterministic laws, precise predictions are impossible because of the sensitivity to initial conditions, which is, as we know, a major problem in meteorology. To make this result clear, Lorenz used an image that contributed to the media success of chaos theory: the famous butterfly effect. He explained that the laws of meteorology are so sensitive to initial conditions that the simple flapping of a butterfly's wings in Brazil can trigger a tornado in Texas. Lorenz had thus just demonstrated that the future is unpredictable. But what is unpredictable is not necessarily chaotic (i.e. disordered), as demonstrated, for example, by the existence of strange attractors (Hénon, 1976): we then speak of deterministic chaos. In phase space, this translates into trajectories irresistibly attracted by complex geometric figures. These systems wander randomly around these figures, without passing twice through the same point. In Figure 1.4, we show Lorenz's strange attractor: it appears when we plot the function $f(X, Y, Z)$ over time.

Turbulent flows are also unpredictable. Two initial conditions that are very close to each other diverge quite rapidly over time. Although the equations – such as those of Navier–Stokes – governing fluid motion are deterministic, it is not possible to predict exactly the state of the turbulent fluid at some distant future time. However, a distinction exists between turbulence and chaos: the word *chaos* is nowadays mainly used in mechanics to describe a deterministic dynamic system with a small number of degrees of freedom. In turbulence, flows have a very large number of degrees of freedom, which results, for example, in the nonlinear excitation of a wide range of spatial scales. As we will see in this book, turbulence is, on the other hand, predictable in the statistical sense, hence the importance of studying turbulence with statistical tools.

I.3 Transition to Turbulence

The observation of turbulence in fluid mechanics is often part of everyday life experiences. In fact, it is under this regime that most of the natural flows of the usual terrestrial fluids such as air and water occur. There is a very large variety of turbulent flows: for example, geophysical flows (atmospheric wind,

¹⁸ Lorenz was not the first to wonder about unpredictability. Henri Poincaré addressed the question at the end of the nineteenth century in his study on the stability of the solar system (Poincaré, 1890). Later, Richardson (1922) also wondered about the effect of initial conditions on the predictability of atmospheric flows.

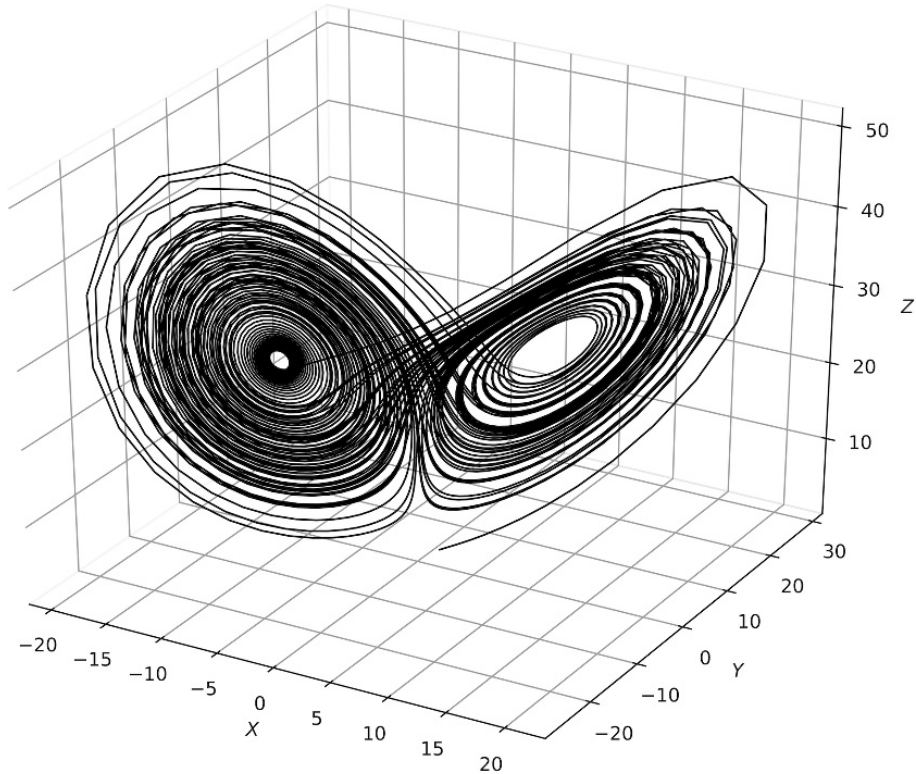


Figure 1.4 The Lorenz attractor appears when we plot the function $f(X, Y, Z)$ over time, with $X(t)$, $Y(t)$, and $Z(t)$ given by solving the Lorenz system.

river currents), astrophysical flows (sun, solar wind, interstellar cloud), biological (blood), quantum (superfluid), or industrial flows (aeronautical, hydraulic, chemical). Despite this diversity, these turbulent flows have a number of common properties.

Probably the most familiar example of turbulent flow is that of a river encountering an obstacle, such as a rock. Downstream, there is a random movement of water characterized by the presence of eddies of different sizes. As we will see in Chapter 2, the eddy is the central concept in the analysis of strong turbulence and, in particular, in the phenomenological description of the cascade of energy to spatial scales that are generally smaller. In Figure 1.5, one can see schematically how such a flow moves from the laminar regime with a low Reynolds number R_e , to the fully developed turbulence regime with a Reynolds number that exceeds 1000. In particular, during this transition a Kármán vortex street is formed for $R_e \sim 100$. Historically, it was Reynolds who was the first to study the transition between these two regimes in 1883 and who gave his name to the dimensionless parameter – the Reynolds number – measuring the degree of turbulence of a flow.

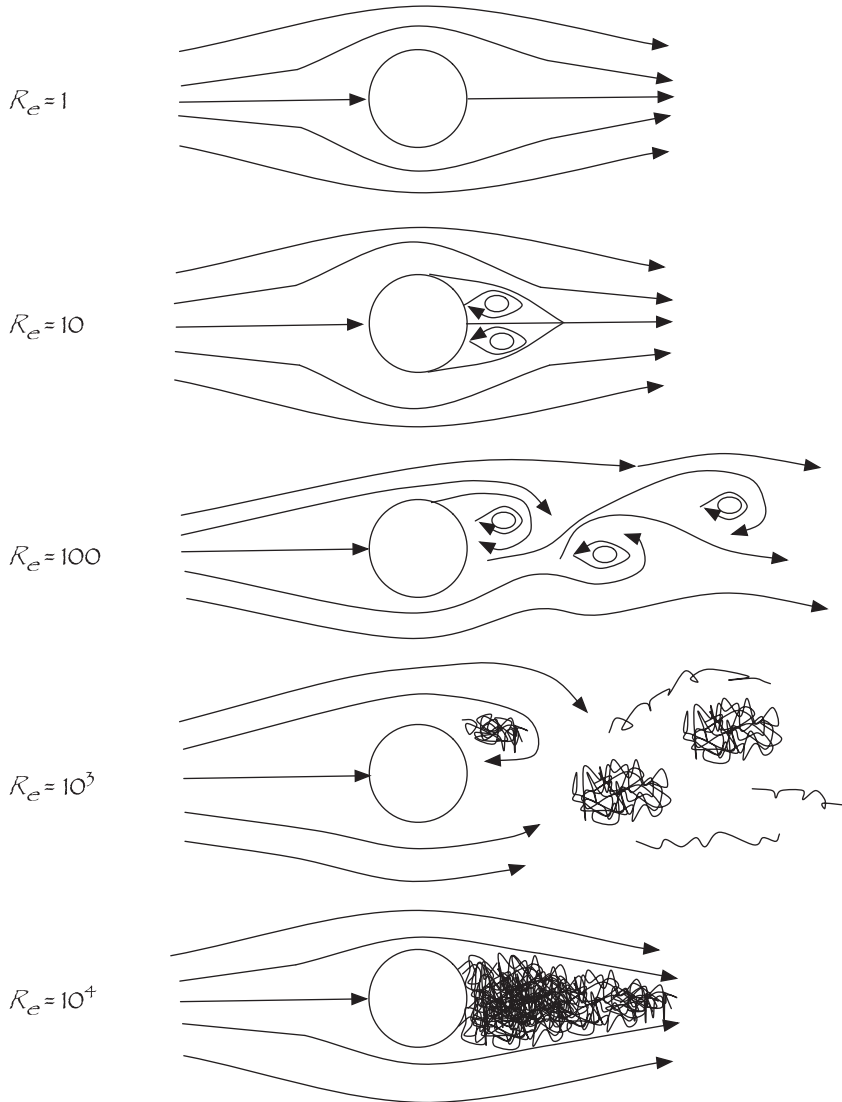


Figure I.5 Transition between laminar (top) and turbulent (bottom) regimes as a function of the Reynolds number R_e for a flow coming from the left and encountering an obstacle (symbolized by a disc). Figure adapted from Feynman et al. (1964).

This number reflects the relative importance of nonlinear versus dissipative effects in the Navier–Stokes equations and is written as follows:

$$R_e = \frac{UL}{\nu}, \quad (1.6)$$

with U and L a velocity and a characteristic length of the flow respectively, while ν is the kinematic viscosity.

I.4 Statistical Tools and Symmetries

We have mentioned the importance of approaching the physics of turbulence with statistical tools in order to better understand its random nature. In this section, we recall some of these tools that are generally introduced in the course of statistical physics.

I.4.1 Ensemble Average

The ensemble average $\langle X \rangle$ of a quantity X is a statistical average performed on N independent realizations (with $N \rightarrow +\infty$) where we measure this quantity:

$$\langle X \rangle = \lim_{N \rightarrow +\infty} \frac{1}{N} \sum_{n=1}^N X_n. \quad (1.7)$$

If the averaged quantity is, for example, the velocity field, one has:

$$\langle \mathbf{u}(\mathbf{x}, t) \rangle = \lim_{N \rightarrow +\infty} \frac{1}{N} \sum_{n=1}^N \mathbf{u}_n(\mathbf{x}, t). \quad (1.8)$$

The average operation commutes with derivatives of different kinds, for example:

$$\left\langle \frac{\partial \mathbf{u}(\mathbf{x}, t)}{\partial \mathbf{x}} \right\rangle = \frac{\partial \langle \mathbf{u}(\mathbf{x}, t) \rangle}{\partial \mathbf{x}}. \quad (1.9)$$

The ensemble average operator is analogous to the one used in statistical thermodynamics. Generally, this is not equivalent to a spatial or temporal average, except under special conditions. For example, when turbulence is statistically homogeneous, the ergodic hypothesis can be used to calculate an ensemble average as a spatial average (Galanti and Tsinober, 2004). Note that, to date, no proof of the ergodic theorem is known for the Navier–Stokes equations.

I.4.2 Autocorrelation

To characterize the disorder in a signal $u(x, t)$, one uses the concept of correlation. The simplest correlation function is the autocorrelation:

$$R(x, t, T) = \langle u(x, t)u(x, t + T) \rangle, \quad (1.10)$$

which measures the resemblance of the function to itself, here at two different instants. The quantity $u(x, t)$ (for example, a velocity component) is a random function. To get statistical independence between $u(x, t)$ and $u(x, t + T)$, T cannot be too small, because the fundamental laws of turbulence lead us to expect a certain memory of the signal: T must therefore be larger than a value T_c , which is called the correlation time. A similar analysis can be done for two measurement points not in time, but in space. In this case, we arrive at the notion of correlation

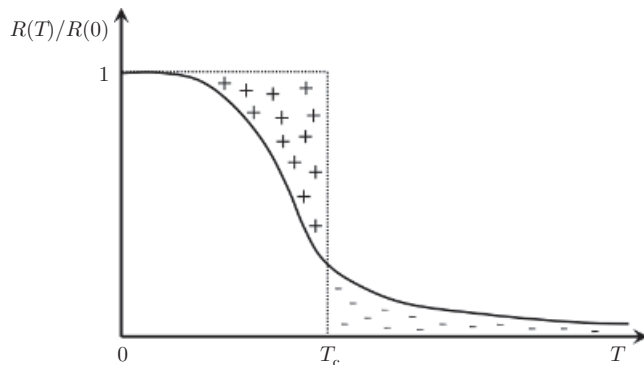


Figure 1.6 Illustration of the meaning of the correlation scale T_c from a given auto-correlation function: the surface + is by definition equal to the surface – (see relation (1.11)).

length L_c (also called the integral scale). Thus, a random flow is characterized by a spatiotemporal memory whose horizon is measured by T_c and L_c . The turbulence study consists in extracting information on the spatiotemporal memory of the flow which can thus be revealed only if we place ourselves on relatively small spatiotemporal correlation scales. Figure 1.6 illustrates the notion of correlation time; by definition we have:

$$T_c \equiv \frac{1}{R(0)} \int_0^{+\infty} R(T) dT, \quad (1.11)$$

where the dependence in t has been forgotten under the assumption of statistical homogeneity.

1.4.3 Probability Distribution and PDF

Let us define $F_y(x)$ as the probability of finding a fluctuation of the random variable y in the interval $]-\infty, x]$: the function F_y is by definition a probability distribution. From this definition one has:

- $F_y(x)$ is an increasing function,
- $F_y(x)$ is a continuous function,
- $F_y(-\infty) = 0$ and $F_y(+\infty) = 1$.

If this function is differentiable then $F'_y(x)$ defines a probability density function (PDF), that is, $F'_y(x)$ is the probability of finding y in the interval $]x, x + dx]$. In the framework of intermittency (Chapter 2) we will see that the normal (or Gaussian) and Poisson PDFs play a central role.

I.4.4 Moments and Cumulants

The moments of a probability density function are the means of the powers:

$$M_n = \langle y^n \rangle = \int_{-\infty}^{+\infty} x^n F'_y(x) dx. \quad (1.12)$$

We may note that the moment of order one is the mean or expected value. The moments of $y - \langle y \rangle$ are said to be centered. The variance is the centered moment of order two:

$$\langle (y - \langle y \rangle)^2 \rangle, \quad (1.13)$$

while the mean quadratic deviation is the root of the variance.

Given any non-Gaussian random function of zero mean whose second-order moments are known, it is then possible to calculate the fictitious moments of order n that this function would have if it were a Gaussian function. The difference between the actual n th-order moment of the function and the corresponding Gaussian value is called the n th-order cumulant. Then, the odd cumulants are equal to the moments (since the odd moments of a Gaussian are zero) and by definition all the cumulants are zero for a Gaussian function. We will come back to moments, and cumulants in particular, in Chapter 4, when the asymptotic closure of wave turbulence is introduced.

I.4.5 Structure Functions

A structure function of order n of a quantity $f(\mathbf{x})$ is by definition:

$$S_n = \langle (f(\mathbf{x}_1) - f(\mathbf{x}_2))^n \rangle = \langle (\delta f)^n \rangle, \quad (1.14)$$

where \mathbf{x}_1 and \mathbf{x}_2 are two points of the space. We will see in Chapter 2 that the first rigorous law established in turbulence by Kolmogorov (1941a) involves the velocity structure function of order three.

I.4.6 Symmetries

In order to simplify the analytical study of turbulence, we often impose certain symmetries on the flow. Unless explicitly stated, the symmetries below are taken in the statistical sense.

- **Homogeneity:** This is the space translation invariance. It is the most classical assumption that is satisfied at the heart of turbulence, that is, far from the walls of an experiment. This assumption is essential in the theoretical treatment of turbulence insofar as it brings important simplifications both in physical space and in Fourier space. For a homogeneous turbulence the ergodic hypothesis allows one to calculate an ensemble average as a spatial average.

- **Stationarity:** This is the time translation invariance. It is a very classical hypothesis insofar as a system generally finds its balance between the external forces and the dissipation which occurs at a small scales by viscous friction. For stationarity turbulence the ergodic hypothesis allows one to calculate an ensemble average as a time average.
- **Isotropy:** This is an invariance under any arbitrary rotation. It is a classical assumption in hydrodynamics, which is less justified in presence of an external agent like, for example, rotation or stratification.
- **Mirror symmetry:** This is the invariance under any plane symmetry. It corresponds to an invariance when the sign of all vectors ($\mathbf{x} \rightarrow -\mathbf{x}$, $\mathbf{u} \rightarrow -\mathbf{u}$, etc.) is changed. It allows the removal of quantities such as the kinetic helicity. One speaks of strong isotropy when turbulence is both isotropic and mirror symmetric. Throughout the book we shall use the word *isotropy* in the weak sense to indicate invariance under rotations, but not necessarily under reflexions of the frame of reference.
- **Scale invariance:** This is the (nonstatistical) invariance by a transformation of the type $\mathbf{u}(\mathbf{x}, t) \rightarrow \lambda^h \mathbf{u}(\lambda \mathbf{x}, \lambda^{1-h} t)$. The solutions of the Navier–Stokes equations satisfy this symmetry if $h = -1$. If the viscosity is zero then h can be anything. In practice, this symmetry can be found in the turbulent regime if the scales considered are much greater than those at which the viscosity acts.

The statistical symmetries we have just defined can emerge in a fluid when the Reynolds number is large enough. A return to Figure 1.5 is instructive: comparison of the five images actually shows that the initial symmetries of the fluid disappear at an intermediate Reynolds number to reveal other symmetries at large Reynolds number.

References

- Alexakis, A., and Biferale, L. 2018. Cascades and transitions in turbulent flows. *Phys. Rep.*, **767**, 1–101.
- Batchelor, G. K. 1946. Double velocity correlation function in turbulent motion. *Nature*, **158**(4024), 883–884.
- Batchelor, G. K. 1953. *The Theory of Homogeneous Turbulence*. Cambridge University Press.
- Biferale, L. 2003. Shell models of energy cascade in turbulence. *Ann. Rev. Fluid Mech.*, **35**(35), 441–468.
- Boussinesq, M. J. 1897. *Théorie de l'écoulement tourbillonnant et tumultueux des liquides dans les lits rectilignes à grande section*, vol. 1. Gauthier-Villars.
- Burgers, J. M. 1925. The motion of a fluid in the boundary layer along a plane smooth surface. In C. B. Biezeno and J. M. Burgers (eds.) *Proceedings of the First International Congress for Applied Mechanics, Delft 1924* (pages 113–128). J. Waltman, Jr.
- Chandrasekhar, S. 1955. A theory of turbulence. *Proc. Roy. Soc. Lond. Series A*, **229**(1176), 1–19.

- Chertkov, M., Connaughton, C., Kolokolov, I., and Lebedev, V. 2007. Dynamics of energy condensation in two-dimensional turbulence. *Phys. Rev. Lett.*, **99**(8), 084501.
- Davidson, P. A., Kaneda, Y., Moffatt, K., and Sreenivasan, K. R. 2011. *A Voyage through Turbulence*. Cambridge University Press.
- Feynman, R. P., Leighton, R. B., and Sands, M. 1964. *The Feynman Lectures on Physics*, vol. 2: *Mainly Electromagnetism and Matter*. Addison-Wesley.
- Fjørtoft, R. 1953. On the changes in the spectral distribution of kinetic energy for two-dimensional, non-divergent flow. *Tellus*, **5**, 225–230.
- Fox, D. G., and Lilly, D. K. 1972. Numerical simulation of turbulent flows. *Rev. Geophys. Space Phys.*, **10**, 51–72.
- Frisch, U. 1995. *Turbulence*. Cambridge University Press.
- Frisch, U., Pouquet, A., Liorat, J., and Mazure, A. 1975. Possibility of an inverse cascade of magnetic helicity in magnetohydrodynamic turbulence. *J. Fluid Mech.*, **68**, 769–778.
- Frisch, U., Sulem, P. L., and Nelkin, M. 1978. A simple dynamical model of intermittent fully developed turbulence. *J. Fluid Mech.*, **87**, 719–736.
- Galanti, B., and Tsinober, A. 2004. Is turbulence ergodic? *Phys. Lett. A*, **330**, 173–180.
- Galtier, S. 2014. Weak turbulence theory for rotating magnetohydrodynamics and planetary flows. *J. Fluid Mech.*, **757**, 114–154.
- Galtier, S. 2016. *Introduction to Modern Magnetohydrodynamics*. Cambridge University Press.
- Galtier, S., and Nazarenko, S. V. 2017. Turbulence of weak gravitational waves in the early universe. *Phys. Rev. Lett.*, **119**(22), 221101.
- Grant, H. L., Stewart, R. W., and Moilliet, A. 1962. Turbulence spectra from a tidal channel. *J. Fluid Mech.*, **12**(2), 241–268.
- Heisenberg, W. 1948. Zur statistischen Theorie der Turbulenz. *Zeit. Physik*, **124**(7–12), 628–657.
- Hénon, M. 1976. A two-dimensional mapping with a strange attractor. *Comm. Math. Physics*, **50**(1), 69–77.
- Iyer, K. P., Sreenivasan, K. R., and Yeung, P. K. 2019. Circulation in high Reynolds number isotropic turbulence is a bifractal. *Phys. Rev. X*, **9**(4), 041006.
- Kaner, É. A., and Yakovenko, V. M. 1970. Weak turbulence spectrum and second sound in a plasma. *J. Exp. Theor. Phys.*, **31**, 316–330.
- Kolmogorov, A. N. 1941a. Dissipation of energy in locally isotropic turbulence. *Dokl. Akad. Nauk SSSR*, **32**, 16–18.
- Kolmogorov, A. N. 1941b. The local structure of turbulence in incompressible viscous fluid for very large Reynolds number. *C. R. Acad. Sci. URSS*, **30**, 301–305.
- Kolmogorov, A. N. 1962. A refinement of previous hypotheses concerning the local structure of turbulence in a viscous incompressible fluid at high Reynolds number. *J. Fluid Mech.*, **13**, 82–85.
- Kraichnan, R. H. 1957. Relation of fourth-order to second-order moments in stationary isotropic turbulence. *Phys. Rev.*, **109**(5), 1407–1422.
- Kraichnan, R. H. 1958. Irreversible statistical mechanics of incompressible hydromagnetic turbulence. *Phys. Rev.*, **111**(6), 1747 (1 page).
- Kraichnan, R. H. 1959. The structure of isotropic turbulence at very high Reynolds numbers. *J. Fluid Mech.*, **5**, 497–543.
- Kraichnan, R. H. 1966. Isotropic turbulence and inertial-range structure. *Phys. Fluids*, **9**(9), 1728–1752.
- Kraichnan, R. H. 1967. Inertial ranges in two-dimensional turbulence. *Phys. Fluids*, **10**(7), 1417–1423.
- Landau, L. D., and Lifshitz, E. M. 1987. *Fluid Mechanics*. Pergamon Press.
- Lee, T. D. 1951. Difference between turbulence in a two-dimensional fluid and in a three-dimensional fluid. *J. Appl. Phys.*, **22**(4), 524 (1 page).

- Leith, C. E. 1967. Diffusion approximation to inertial energy transfer in isotropic turbulence. *Phys. Fluids*, **10**(7), 1409–1416.
- Leith, C. E. 1968. Diffusion approximation for two-dimensional turbulence. *Phys. Fluids*, **11**(3), 671–672.
- Lorenz, E. N. 1963. Deterministic nonperiodic flow. *J. Atmos. Sciences*, **20**, 130–141.
- Mandelbrot, B.B. 1974. Intermittent turbulence in self-similar cascades: Divergence of high moments and dimension of the carrier. *J. Fluid Mech.*, **62**, 331–358.
- Millionschikov, M. D. 1939. Decay of homogeneous isotropic turbulence in a viscous incompressible fluid. *Dokl. Akad. Nauk SSSR*, **22**, 236–240.
- Millionschikov, M. D. 1941. Theory of homogeneous isotropic turbulence. *Dokl. Akad. Nauk SSSR*, **22**, 241–242.
- Monin, A. S., and Yaglom, A. M. 1971. *Statistical Fluid Mechanics*, Vol. I. MIT Press.
- Monin, A. S., and Yaglom, A. M. 1975. *Statistical Fluid Mechanics*, Vol. 2. MIT Press.
- Motzfeld, H. 1938. Frequenzanalyse turbulenter Schwankungen. *Z. Angew. Math. Mech.*, **18**(6), 362–365.
- Obukhov, A. M. 1941. Spectral energy distribution in a turbulent flow. *Izv. Akad. Nauk SSSR Ser. Geogr. Geofiz.*, **5**, 453–466.
- Obukhov, A. M. 1962. Some specific features of atmospheric turbulence. *J. Fluid Mech.*, **13**, 77–81.
- Ogura, Y. 1963. A consequence of the zero-fourth-cumulant approximation in the decay of isotropic turbulence. *J. Fluid Mech.*, **16**, 33–40.
- Onsager, L. 1945. The distribution of energy in turbulence. *Phys. Rev.*, **68**(11–12), 286 (1 page).
- Orszag, S. A. 1970. Analytical theories of turbulence. *J. Fluid Mech.*, **41**, 363–386.
- Orszag, S. A., and Patterson, G. S. 1972. Numerical simulation of three-dimensional homogeneous isotropic turbulence. *Phys. Rev. Lett.*, **28**(2), 76–79.
- Paret, J., and Tabeling, P. 1997. Experimental observation of the two-dimensional inverse energy cascade. *Phys. Rev. Lett.*, **79**(21), 4162–4165.
- Patterson, G. S., Jr., and Orszag, S. A. 1971. Spectral calculations of isotropic turbulence: Efficient removal of aliasing interactions. *Phys. Fluids*, **14**(11), 2538–2541.
- Poincaré, H. 1890. *Sur le problème des trois corps et les équations de la dynamique Acta Mathematica*, **13**, 1–270.
- Pope, S. B. 2000. *Turbulent Flows*. Cambridge University Press.
- Pouquet, A., and Patterson, G. S. 1978. Numerical simulation of helical magnetohydrodynamic turbulence. *J. Fluid Mech.*, **85**, 305–323.
- Pouquet, A., Lesieur, M., Andre, J. C., and Basdevant, C. 1975. Evolution of high Reynolds number two-dimensional turbulence. *J. Fluid Mech.*, **72**, 305–319.
- Pouquet, A., Frisch, U., and Leorat, J. 1976. Strong MHD helical turbulence and the nonlinear dynamo effect. *J. Fluid Mech.*, **77**, 321–354.
- Pouquet, A., Rosenberg, D., Stawarz, J. E., and Marino, R. 2019. Helicity dynamics, inverse, and bidirectional cascades in fluid and magnetohydrodynamic turbulence: A brief review. *Earth Space Science*, **6**(3), 351–369.
- Reynolds, O. 1883. An experimental investigation of the circumstances which determine whether the motion of water shall be direct or sinuous and the law of resistance in parallel channels. *Phil. Trans. Roy. Soc.*, **174**, 935–982.
- Richardson, L. F. 1922. *Weather Predictions by Numerical Process*. Cambridge University Press.
- Richardson, L. F. 1926. Atmospheric diffusion shown on a distance-neighbour graph. *Proc. Roy. Soc. Lond. Series A*, **110**(756), 709–737.
- Rosby, C. G., and collaborators. 1939. Relation between variations in the intensity of the zonal circulation of the atmosphere and the displacements of the semi-permanent centers of action. *J. Marine Res.*, **2**, 38–55.

- Taylor, G. I. 1935. Statistical theory of turbulence. *Proc. Roy. Soc. Lond. Series A*, **151**(873), 421–444.
- Taylor, G. I. 1938. The spectrum of turbulence. *Proc. Roy. Soc. Lond. Series A*, **164**(919), 476–490.
- von Kármán, T., and Howarth, L. 1938. On the statistical theory of isotropic turbulence. *Proc. Roy. Soc. Lond. Series A*, **164**(917), 192–215.
- Yaglom, A. M. 1949. Local structure of the temperature field in a turbulent flow. *Dokl. Akad. Nauk SSSR*, **69**, 743–746.
- Zakharov, V. E. 1967. Weak-Turbulence spectrum in a plasma without a magnetic field. *J. Exp. Theor. Phys.*, **24**, 455–459.
- Zakharov, V. E., and Filonenko, N. N. 1966. The energy spectrum for stochastic oscillations of a fluid surface. *Doclady Akad. Nauk. SSSR*, **170**, 1292–1295.
- Zakharov, V. E., and Filonenko, N. N. 1967. Energy spectrum for stochastic oscillations of the surface of a liquid. *Soviet Phys. Dokl.*, **11**, 881–884.
- Zaslavskii, M. M., and Zakharov, V. E. 1982. The kinetic equation and Kolmogorov spectra in the weak turbulence theory of wind waves. *Izv. Atmos. Ocean Phys.*, **18**, 747–753.

