

## Time, Structure, and Fluctuations

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The problem of time ( $t$ ) in physics and chemistry is closely related to the formulation of the second law of thermodynamics. Therefore, another possible title of this lecture could have been "The Macroscopic and Microscopic Aspects of the Second Law of Thermodynamics."

It is the main thesis of this lecture that we are only at the beginning of a new development of theoretical chemistry and physics in which thermodynamic concepts will play an even more basic role. Because of the complexity of the subject, I shall limit myself here mainly to conceptual problems. The conceptual

*Summary.* Fundamental conceptual problems that arise from the macroscopic and microscopic aspects of the second law of thermodynamics are considered. It is shown that nonequilibrium may become a source of order and that irreversible processes may lead to a new type of dynamic states of matter called "dissipative structures." The thermodynamic theory of such structures is outlined. A microscopic definition of irreversible processes is given, and a transformation theory is developed that allows one to introduce nonunitary equations of motion that explicitly display irreversibility and approach to thermodynamic equilibrium. The work of the group at the University of Brussels in these fields is briefly reviewed. In this new development of theoretical chemistry and physics, it is likely that thermodynamic concepts will play an ever-increasing role.

The second law of thermodynamics has played a fundamental role in the history of science far beyond its original scope. Suffice it to mention Boltzmann's work on kinetic theory, Planck's discovery of quantum theory, and Einstein's theory of spontaneous emission, all of which were based on the second law of thermodynamics.

problems have both macroscopic and microscopic aspects. For example, from the macroscopic point of view classical thermodynamics has largely clarified the concept of equilibrium structures such as crystals.

Thermodynamic equilibrium may be characterized by the minimum of the Helmholtz free energy, usually defined by

$$F = E - TS \quad (1)$$

where  $E$  is the internal energy,  $T$  is the absolute temperature, and  $S$  is the entropy. Are most types of "organizations" around us of this nature? One need only ask such a question to see that the answer is no. Obviously in a town or in a living system we have a quite different type of functional order. To obtain a thermodynamic theory for this type of

structure we have to show that nonequilibrium may be a source of order. Irreversible processes may lead to a new type of dynamic states of matter which I have called "dissipative structures." I discuss the thermodynamic theory of such structures in the sections on entropy production, thermodynamic stability theory, and application to chemical reactions.

These structures are of special interest today in chemistry and biology. They manifest a coherent, supermolecular character which leads to new, quite spectacular manifestations, for example, in biochemical cycles involving oscillatory enzymes.

How do such coherent structures appear as the result of reactive collisions? This question is briefly discussed in the section on the law of large numbers. I would emphasize that conventional chemical kinetics corresponds to a "mean field" theory very similar to the van der Waals theory of the equation of state or Weiss's theory of ferromagnetism. Exactly as in these cases, the mean field theory breaks down near the instability where the new dissipative structures originate. Here (as in equilibrium theory) fluctuations play an essential role.

In the last two sections I shall turn to the microscopic aspects and review the recent work done by our group at the University of Brussels in this direction. This work leads to a microscopic definition of irreversible processes. However, this development is only possible through a transformation theory which allows one to introduce new nonunitary equations of motion that explicitly display irreversibility and approach to thermodynamic equilibrium.

The inclusion of thermodynamic elements leads to a reformulation of (classical or quantum) dynamics. This is a most surprising feature. Since the beginning of this century we were prepared to find new theoretical structures in the micro-world of elementary particles or in the macroworld of cosmological dimensions. We see now that even for phenomena on our own level the incorporation of thermodynamic elements leads to new theoretical structures. This is the price we

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must pay for a formulation of theoretical methods in which time appears with its full meaning associated with irreversibility or even with "history" and not merely as a geometric parameter associated with motion.

### Entropy Production

At the very core of the second law of thermodynamics we find the basic distinction between "reversible" and "irreversible" processes ( $I$ ). This leads ultimately to the introduction of  $S$  and the formulation of the second law of thermodynamics. The classical formulation due to Clausius refers to isolated systems exchanging neither energy nor matter with the outside world. The second law then merely ascertains the existence of a function,  $S$ , which increases monotonically until it reaches its maximum at the state of thermodynamic equilibrium,

$$\frac{dS}{dt} \geq 0 \quad (2)$$

It is easy to extend this formulation to systems which exchange energy and matter with the outside world (Fig. 1). We have then to distinguish in the entropy change  $dS$  two terms: the first,  $d_e S$ , is the transfer of entropy across the boundaries of the system; the second,  $d_i S$ , is the entropy produced within the system. The second law assumes that the  $S$  production inside the system is positive (or zero)

$$d_i S \geq 0 \quad (3)$$

The basic distinction here is between reversible processes and irreversible processes. Only irreversible processes contribute to entropy production. Obviously, the second law expresses the fact that irreversible processes lead to the one-sidedness of time. The positive time direction is associated with the increase of  $S$ . Let me emphasize the strong and very specific way in which the one-sidedness of time appears in the second law. The formulation of this law implies the existence of a function having quite specific properties, as expressed by the fact that for an isolated system the function can only increase in time. Such functions play an important role in the modern theory of stability as initiated by the classic work of Lyapounov. For this reason they are called Lyapounov functions (or functionals).

Entropy is a Lyapounov function for isolated systems. Thermodynamic potentials such as the Helmholtz or Gibbs free energy are also Lyapounov functions for other "boundary conditions"

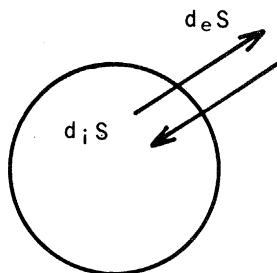


Fig. 1. The exchange of entropy between the outside and the inside.

(such as imposed values of temperature and volume).

In all these cases the system evolves to an equilibrium state characterized by the existence of a thermodynamic potential. This equilibrium state is an "attractor" for nonequilibrium states. This is an essential aspect that was rightly emphasized by Planck ( $I$ ).

However, thermodynamic potentials exist only for exceptional situations. The inequality in Eq. 3, which does not involve the total differential of a function, does not in general permit one to define a Lyapounov function. Before we come back to this question, I should emphasize that 150 years after its formulation the second law of thermodynamics still appears to be more a program than a well-defined theory in the usual sense, as nothing precise (except the sign) is said about the  $S$  production. Even the range of validity of this inequality is left unspecified. This is one of the main reasons why the applications of thermodynamics were essentially limited to equilibrium processes.

To extend thermodynamics to nonequilibrium processes, we need an explicit expression for the  $S$  production. Progress has been achieved along this line by supposing that even outside equilibrium  $S$  depends only on the same variables as at equilibrium. This is the assumption of "local" equilibrium (2). Once this assumption is accepted, we obtain for  $P$ , the entropy production per unit time,

$$P = \frac{d_i S}{dt} = \sum_{\rho} J_{\rho} X_{\rho} \geq 0 \quad (4)$$

where the  $J_{\rho}$  are the rates of the various irreversible processes  $\rho$  involved (chemical reactions, heat flow, diffusion) and the  $X_{\rho}$  are the corresponding generalized forces (affinities, gradients of temperature, gradients of chemical potential). Equation 4 is the basic formula of macroscopic thermodynamics of irreversible processes.

I have used supplementary assumptions to derive the explicit expression

(Eq. 4) for the  $S$  production. This formula can only be established in some neighborhood of equilibrium [see (3)]. This neighborhood defines the region of local equilibrium, which I shall discuss from the point of view of statistical mechanics in the section on nonunitary transformation theory.

At thermodynamic equilibrium we have simultaneously for all irreversible processes

$$J_{\rho} = 0 \quad (5a)$$

and

$$X_{\rho} = 0 \quad (5b)$$

It is therefore quite natural to assume, at least near equilibrium, linear homogeneous relations between the flows and the forces. Such a scheme automatically includes empirical laws such as Fourier's law, which expresses that the flow of heat is proportional to the gradient of temperature, or Fick's law for diffusion, which states that the flow of diffusion is proportional to the gradient of concentration. We obtain in this way the linear thermodynamics of irreversible processes characterized by the relations (4)

$$J_{\rho} = \sum_{\rho'} L_{\rho\rho'} X_{\rho'} \quad (6)$$

Linear thermodynamics of irreversible processes is dominated by two important results. The first is expressed by the Onsager reciprocity relations (5), which state that

$$L_{\rho\rho'} = L_{\rho'\rho} \quad (7)$$

When the flow  $J_{\rho}$  corresponding to the irreversible process  $\rho$  is influenced by the force  $X_{\rho'}$  of the irreversible process  $\rho'$ , then the flow  $J_{\rho'}$  is also influenced by the force  $X_{\rho}$  through the same coefficient.

The importance of the Onsager relations resides in their generality. They have been subjected to many experimental tests. Their validity has shown that nonequilibrium thermodynamics leads, as does equilibrium thermodynamics, to general results independent of any specific molecular model. The discovery of the reciprocity relations corresponds really to a turning point in the history of thermodynamics.

A second interesting theorem valid near equilibrium is the theory of minimum  $S$  production (6), which states that for steady states sufficiently close to equilibrium  $S$  production reaches its minimum. Time-dependent states (corresponding to the same boundary conditions) have a higher  $S$  production. The theorem of minimum  $S$  production requires even more restrictive conditions

than the linear relations (Eq. 6). It is valid in the frame of a strictly linear theory in which the deviations from equilibrium are so small that the phenomenological coefficients  $L_{pp'}$  may be treated as constants.

The theorem of minimum  $S$  production expresses a kind of "inertial" property of nonequilibrium systems. When given boundary conditions prevent the system from reaching thermodynamic equilibrium (that is, zero  $S$  production), the system settles down to the state of "least dissipation."

It has been clear since the formulation of this theorem that this property is strictly valid only in the neighborhood of equilibrium. For many years great efforts were made to generalize this theorem to situations further away from equilibrium. It came as a great surprise when it was finally shown that far from equilibrium the thermodynamic behavior could be quite different, in fact, even opposite to that indicated by the theorem of minimum  $S$  production.

It is remarkable that this new type of behavior appears in typical situations that have been studied in classical hydrodynamics. An example that was first analyzed from this point of view is the so-called "Bénard instability." Consider a horizontal layer of fluid between two infinite parallel planes in a constant gravitational field. Let us maintain the lower boundary at temperature  $T_1$  and the higher boundary at temperature  $T_2$  with  $T_1 > T_2$ . For a sufficiently large value of the "adverse" gradient  $(T_1 - T_2)/(T_1 + T_2)$ , the state of rest becomes unstable and convection starts. The entropy production is then increased as the convection provides a new mechanism of heat transport. Moreover, the state of flow, which appears beyond the instability, is a state of organization as compared to the state of rest. Indeed, a macroscopic number of molecules has to move in a coherent fashion over macroscopic times to realize the flow pattern.

We have here a good example of the fact that nonequilibrium may be a source of order. We shall see in the sections on thermodynamic stability theory and application to chemical reactions that this situation is not limited to hydrodynamic situations but also occurs in chemical systems when well-defined conditions are imposed on the kinetic laws.

It is interesting that Boltzmann's order principle as expressed by the canonical distribution would assign almost zero probability to the occurrence of Bénard convection. Whenever new coherent states occur far from equilibrium, the very concept of probability, as implied in

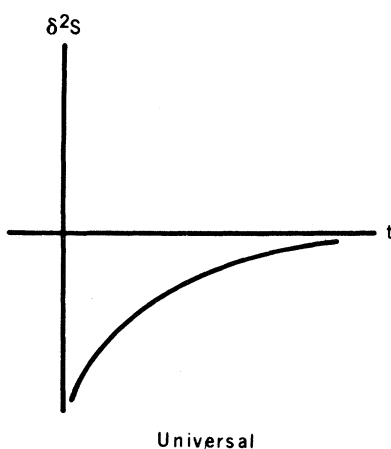


Fig. 2. Time evolution of second-order excess entropy  $(\delta^2 S)_{eq}$  around equilibrium.

the counting of the number of complexions, breaks down. In the case of Bénard convection, we may imagine that there are always small convection currents appearing as fluctuations from the average state; but, below a certain critical value of the temperature gradient, these fluctuations are damped and disappear. However, above some critical value, certain fluctuations are amplified and give rise to a macroscopic current. A new supermolecular order appears which corresponds basically to a giant fluctuation stabilized by exchanges of energy with the outside world. This is the order characterized by the occurrence of dissipative structures.

Before discussing further the possibility of dissipative structures, I would like to review some aspects of thermodynamic stability theory in relation to the theory of Lyapounov functions.

### Thermodynamic Stability Theory

The states corresponding to thermodynamic equilibrium, or the steady states corresponding to a minimum of  $S$  production in linear nonequilibrium thermodynamics, are automatically stable. I have already introduced the concept of a Lyapounov function. According to the theorem of minimum  $S$  production, the  $S$  production is precisely such a Lyapounov function in the strictly linear region around equilibrium. If the system is perturbed, the  $S$  production will increase but the system reacts by coming back to the minimum value of the  $S$  production.

Similarly, closed equilibrium states are stable when corresponding to the maximum of  $S$ . If we perturb the system around its equilibrium value, we obtain

$$S = S_0 + \delta S + \frac{1}{2} \delta^2 S \quad (8)$$

where  $S_0$  is the equilibrium entropy. However, because the equilibrium state was a maximum, the first-order term vanishes and therefore the stability is given by the sign of the second-order term  $\delta^2 S$ .

As Glansdorff and Prigogine have shown,  $\delta^2 S$  is a Lyapounov function in the neighborhood of equilibrium independently of the boundary conditions (3). With classical thermodynamics it is possible to calculate explicitly this important expression. One obtains (3)

$$T\delta^2 S = -\left[\frac{C_v}{T} (\delta T)^2 + \frac{\rho}{\chi} (\delta v)_{N_\gamma}^2 + \sum_{\gamma\gamma'} \mu_{\gamma\gamma'} \delta N_\gamma \delta N_{\gamma'}\right] < 0 \quad (9)$$

Here  $C_v$  is the specific heat at constant volume,  $\rho$  is the density,  $v = 1/\rho$  is the specific volume (the index  $N_\gamma$  means that the composition is maintained constant in the variation of  $v$ ),  $\chi$  is the isothermal compressibility,  $N_\gamma$  is the mole fraction of component  $\gamma$ , and  $\mu_{\gamma\gamma'}$  is the derivative

$$\mu_{\gamma\gamma'} = \left(\frac{\partial \mu_\gamma}{\partial N_{\gamma'}}\right)_{pT} \quad (10)$$

where  $p$  is pressure.

The basic stability conditions of classical thermodynamics first formulated by Gibbs are as follows:

$$C_v > 0 \text{ (thermal stability)}$$

$$\chi > 0 \text{ (mechanical stability)}$$

$$\sum_{\gamma\gamma'} \mu_{\gamma\gamma'} \delta N_\gamma \delta N_{\gamma'} > 0 \text{ (stability with respect to diffusion)}$$

These conditions imply that  $\delta^2 S$  is a negative quadratic function. Moreover, it can be shown by elementary calculations that the time derivative of  $\delta^2 S$  is related to  $P$  through (3) (see Eq. 4)

$$\frac{1}{2} \frac{\partial}{\partial t} \delta^2 S = \sum J_\rho \chi_\rho = P > 0 \quad (11)$$

It is precisely because of the inequalities in Eqs. 9 and 11 that  $\delta^2 S$  is a Lyapounov function. The existence of the Lyapounov function ensures the damping of all fluctuations. That is the reason why near equilibrium a macroscopic description for large systems is sufficient. Fluctuations can only play a subordinate role, appearing as corrections to the macroscopic laws which can be neglected for large systems (Fig. 2).

We are now prepared to investigate the fundamental questions: Can we extrapolate this stability property further away from equilibrium? Does  $\delta^2 S$  play the role of a Lyapounov function when we consider larger deviations from equilibrium but still in the frame of macro-

scopic description? We again calculate the perturbation  $\delta^2 S$  but now around a nonequilibrium state. The inequality in Eq. 9 still remains valid in the range of macroscopic description. However, the time derivative of  $\delta^2 S$  is no longer related to the total  $S$  production as in Eq. 11 but is related to the perturbation of this  $S$  production. In other words, we now have (3)

$$\frac{1}{2} \frac{\partial}{\partial t} \delta^2 S = \sum_p \delta J_p \delta X_p \quad (12)$$

The right side of Eq. 12 is what Glandsdorff and Prigogine have called the "excess entropy production." I should emphasize that  $\delta J_p$  and  $\delta X_p$  are the deviations from the values  $J_p$  and  $X_p$  at the stationary state, the stability of which we are testing through a perturbation. Now, contrary to what happens for equilibrium or near-equilibrium situations, the right side of Eq. 12 corresponding to the excess  $S$  production generally has no well-defined sign. If for all  $t$  larger than  $t_0$ , where  $t_0$  is the starting time of the perturbation, we have

$$\sum_p \delta J_p \delta X_p \geq 0 \quad (13)$$

then  $\delta^2 S$  is indeed a Lyapounov function and stability is ensured (see Fig. 3). In the linear range, the excess  $S$  production has the same sign as the  $S$  production itself and we recover the same result as with the theorem of minimum  $S$  production. However, the situation changes in the range far from equilibrium. There the form of chemical kinetics plays an essential role.

In the next section I shall consider a few examples. For appropriate types of chemical kinetics the system may become unstable. This result shows that there is an essential difference between the laws of equilibrium and the laws far away from equilibrium. The laws of equilibrium are universal. However, far from equilibrium the behavior may become very specific. This is, of course, a welcome circumstance, because it permits us to introduce a distinction in the behavior of physical systems that would be incomprehensible in an equilibrium world.

All these considerations are very general. They may be extended to systems in which macroscopic motion may be generated to problems of surface tension or the effect of an external field (7). For example, in the case in which we include macroscopic motion, we have to consider the expression [see (3)]

$$\delta^2 Z = \delta^2 S - \frac{1}{2} \int \frac{\rho u^2}{T} dV \leq 0 \quad (14)$$

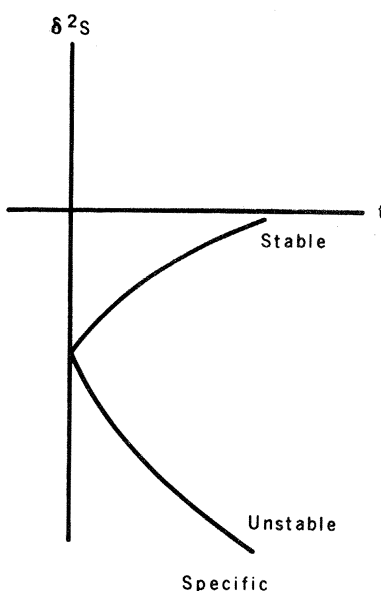
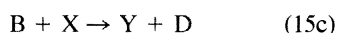


Fig. 3. Time evolution of second-order excess entropy ( $\delta^2 S$ ) in cases of (asymptotically) stable, marginally stable, and unstable situations.

where  $Z$  is a Lyapounov function which defines the excess entropy, and  $\mathbf{u}$  is the macroscopic convection velocity. I have integrated over the volume  $V$  to take into account the space dependence of all  $\mathbf{u}$ . We may again calculate the time derivative of  $\delta^2 Z$ , which now takes a more complicated form. As the result may be found elsewhere (3), I shall not reproduce it here. I would only mention that spontaneous excitation of internal convection cannot be generated from a state at rest which is at thermodynamic equilibrium. This applies, of course, as a special case to the Bénard instability.

### Application to Chemical Reactions

Let us now return to the case of chemical reactions. A general result is that to violate the inequality in Eq. 13 we need autocatalytic reactions. More precisely, autocatalytic steps are necessary (but not sufficient) conditions for the breakdown of the stability of the thermodynamic branch. Let us consider a simple example, the so-called "Brusselator," which corresponds to the scheme of reaction (8),



The initial reactants and final products are  $A$ ,  $B$ ,  $D$ , and  $E$ , which are maintained constant while the concentrations of the two intermediate components,  $X$

and  $Y$ , may change in time. Putting the kinetic constants equal to unity, we obtain the system of equations

$$\frac{dX}{dt} = A + X^2 Y - BX - X \quad (16a)$$

and

$$\frac{dY}{dt} = BX - X^2 Y \quad (16b)$$

which admits the steady state

$$X_0 = A, Y_0 = \frac{B}{A} \quad (17)$$

where  $X_0$  and  $Y_0$  are the concentrations of  $X$  and  $Y$  at the steady state. Using the thermodynamic stability criterion or normal mode analysis, we may show that the solution (Eq. 17) becomes unstable whenever

$$B > B_c = 1 + A^2 \quad (18)$$

Beyond this critical value of  $B$  ( $B_c$ ) we have a "limit cycle," that is, any initial point in the space  $X, Y$  tends to the same periodic trajectory. The important point is therefore that, in contrast with oscillating chemical reactions of the Lotka-Volterra type, the frequency of oscillation is a well-defined function of the macroscopic variables such as concentrations and temperatures. The chemical reaction leads to coherent time behavior; it becomes a chemical clock. In the literature this is often called a Hopf bifurcation.

When diffusion is taken into account, the variety of instabilities becomes properly enormous. For this reason the reaction scheme in Eq. 15 has been studied by many investigators over the past years. In the presence of diffusion, the reaction scheme in Eq. 15 becomes

$$\frac{\partial X}{\partial t} = A + X^2 Y - BX - X + D_x \frac{\partial^2 X}{\partial r^2} \quad (19a)$$

$$\frac{\partial Y}{\partial t} = BX - X^2 Y + D_y \frac{\partial^2 Y}{\partial r^2} \quad (19b)$$

where  $D_x$  and  $D_y$  are the diffusion coefficients of components  $X$  and  $Y$ . In addition to the limit cycle, we now have the possibility of nonuniform steady states. We may call it the Turing bifurcation, as Turing was the first to notice the possibility of such bifurcations in chemical kinetics in his classic paper on morphogenesis in 1952 (9). In the presence of diffusion, the limit cycle may also become space-dependent and lead to chemical waves.

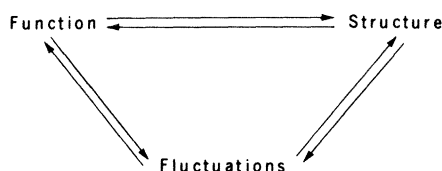
Some order can be brought into the re-

sults if we consider as the basic solution the one corresponding to the thermodynamic branch. Other solutions may then be obtained as successive bifurcations from this basic one, or as higher order bifurcations from a nonthermodynamic branch, taking place when the distance from equilibrium is increased.

A general feature of interest is that dissipative structures are very sensitive to global features which characterize the environment of chemical systems, such as their size and form, the boundary conditions imposed on their surface, and so on. All these features influence in a decisive way the types of instabilities that lead to dissipative structures.

Far from equilibrium, there appears an unexpected relation between chemical kinetics and the "space-time structure" of reacting systems. It is true that the interactions which determine the values of the relevant kinetic constants and transport coefficients result from short-range interactions (valency forces, hydrogen bonds, van der Waals forces). However, the solutions of the kinetic equations depend, in addition, on global characteristics. This dependence, which on the thermodynamic branch, near equilibrium, is rather trivial, becomes decisive in chemical systems under conditions far from equilibrium. For example, the occurrence of dissipative structures generally requires that the system's size exceed some critical value. The critical size is a complex function of the parameters describing the reaction-diffusion processes. Therefore, we may say that chemical instabilities involve long-range order through which the system acts as a whole.

There are three aspects that are always linked in dissipative structures: the function as expressed by the chemical equations; the space-time structure, which results from the instabilities; and the fluctuations, which trigger the instabilities. The interplay between these three aspects leads to most unexpected phenomena, including "order through fluctuations," which I shall analyze below.



Generally we have successive bifurcations when we increase the value of some characteristic parameter (such as the bifurcation parameter  $B$  in the Brusselator scheme). In Fig. 4 we have a single solution for the value  $\lambda_1$

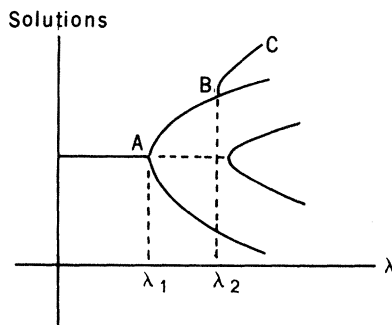


Fig. 4. Successive bifurcations.

but multiple solutions for the value  $\lambda_2$ .

It is interesting that bifurcation introduces, in a sense, "history" into physics. Suppose that observation shows us that the system whose bifurcation diagram is represented by Fig. 4 is in the state C and came there through an increase in the value of  $\lambda$ . The interpretation of this state  $X$  implies the knowledge of the prior history of the system, which had to go through the bifurcation points A and B. In this way we introduce in physics and chemistry a historical element, which until now seemed to be reserved only for sciences dealing with biological, social, and cultural phenomena.

Every description of a system which has bifurcations will imply both deterministic and probabilistic elements. As we shall see in more detail in the next section, the system obeys deterministic laws, such as the laws of chemical kinetics, between two bifurcation points, whereas in the neighborhood of the bifurcation points fluctuations play an essential role and determine the branch that the system will follow.

I shall not go here into the theory of bifurcations and its various aspects such as, for example, the theory of catastrophes due to Thom (10). These questions are discussed in the recent monograph of Nicolis and Prigogine (8). I shall also not enumerate the examples of coherent structures in chemistry and biology that are known at present. Many examples may be found in (8).

### The Law of Large Numbers and the Statistics of Chemical Reactions

Let us now turn to the statistical aspects of the formation of dissipative structures. Conventional chemical kinetics is based on the calculation of the average number of collisions and more specifically on the average number of reactive collisions. These collisions occur at random. However, how can such a chaotic behavior ever give rise to coher-

ent structures? Obviously, a new feature has to be introduced. Briefly, this is the breakdown of the conditions of validity of the law of large numbers; as a result, the distribution of reactive particles near instabilities is no longer a random distribution.

First, I shall indicate what is meant by the law of large numbers. To do so I consider a typical probability description of great importance in many fields of science and technology, the Poisson distribution. This distribution involves a variable  $X$  which may take integral values  $X = 0, 1, 2, 3, \dots$ . According to the Poisson distribution, the probability that  $X = \langle X \rangle$  is given by

$$\text{pr}(X) = e^{-\langle X \rangle} \frac{\langle X \rangle^X}{X!} \quad (20)$$

In Eq. 20,  $\langle X \rangle$  corresponds to the average value of  $X$ . This law is found to be valid in a wide range of situations such as the distribution of telephone calls, waiting time in restaurants, and fluctuations of particles in a medium of given concentration. An important feature of the Poisson distribution is that  $\langle X \rangle$  is the only parameter that enters in the distribution. The probability distribution is entirely determined by its mean.

From Eq. 20, one obtains easily the so-called "variance," which gives the dispersion around the mean

$$\langle (\delta X)^2 \rangle = \langle (X - \langle X \rangle)^2 \rangle \quad (21)$$

The characteristic feature is that, according to the Poisson distribution, the dispersion is equal to the average itself

$$\langle (\delta X)^2 \rangle = \langle X \rangle \quad (22)$$

Let us consider a situation in which  $X$  is an extensive quantity proportional to the number of particles  $N$  (in a given volume) or to the volume  $V$ . We then obtain for the relative fluctuations the famous square root law

$$\frac{[\langle (\delta X)^2 \rangle]^{1/2}}{\langle X \rangle} = \frac{1}{\langle X \rangle^{1/2}} \sim \frac{1}{N^{1/2}} \text{ or } \frac{1}{V^{1/2}} \quad (23)$$

The order of magnitude of the relative fluctuation is inversely proportional to the square root of the average. Therefore, for extensive variables of order  $N$  we obtain relative deviations of order  $N^{-1/2}$ . This is the characteristic feature of the law of large numbers. As a result, we may disregard fluctuations for large systems and use a macroscopic description.

For other distributions the mean square deviation is no longer equal to the average as in Eq. 22. But, whenever the

law of large numbers applies, the order of magnitude of the mean square deviation is still the same, and we have

$$\frac{\langle(\delta X)^2\rangle}{V} \sim \text{finite for } V \rightarrow \infty \quad (24)$$

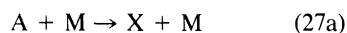
Let us now consider a stochastic model for chemical reactions. As has been done often in the past, it is natural to associate a Markov chain process of the "birth and death" type to a chemical reaction (11). This leads immediately to a master equation for the probability  $P(X, t)$  of finding  $X$  molecules of species  $X$  at time  $t$ ,

$$\begin{aligned} \frac{dP(X, t)}{dt} = & \sum_r W(X-r \rightarrow X) P(X-r, t) - \\ & \sum_r W(X \rightarrow X+r) P(X, t) \end{aligned} \quad (25)$$

where  $W$  is a transition probability corresponding to the jump from  $X-r$  molecules of species  $X$  to  $X$  molecules. On the right side of Eq. 25 we have a competition between gain and loss terms. A characteristic difference with the classical Brownian motion problem is that the transition probabilities,  $W(X-r \rightarrow X)$  or  $W(X \rightarrow X+r)$ , are nonlinear in the occupation numbers. Chemical games are nonlinear, and this leads to important differences. For example, it can be easily shown that the stationary distribution of  $X$  corresponding to the linear chemical reaction



is given by a Poisson distribution (for given average values of  $A$  and  $F$ ) (12). But it came as a great surprise when Nicolis and Prigogine showed in 1971 (13) that the stationary distribution of  $X$ , which appears as an intermediate in the chain



is no longer given by the Poisson distribution. This is very important from the point of view of the macroscopic kinetic theory. Indeed, as has been shown by Malek-Mansour and Nicolis (14), the macroscopic chemical equations generally must be corrected by terms associated with deviations from the Poisson distribution. This is the basic reason why today so much attention is being devoted to the stochastic theory of chemical reactions.

For example, the Schlögl reaction (15),

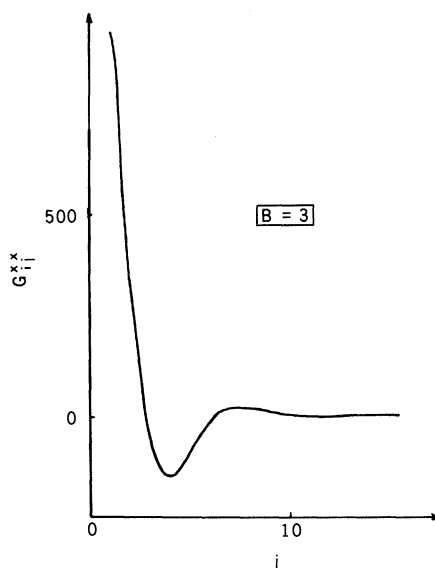
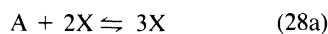


Fig. 5. Distance dependence of the spatial correlation function  $G_{ij}^{XX}$  well below the critical value of the bifurcation parameter  $B$ ;  $A = 2$ ,  $d_1 = 1$ ,  $d_2 = 4$  ( $d_1$  and  $d_2$  are the diffusion coefficients of  $A$  and  $B$ ).

has been studied extensively by Nicolis and Turner (16), who have shown that this model leads to a "nonequilibrium phase transition" quite similar to that described by the classical van der Waals equation. Near the critical point as well as near the coexistence curve, the law of large numbers as expressed by Eq. 24 breaks down, as  $\langle(\delta X)^2\rangle$  becomes proportional to a higher power of the volume. As in the case of equilibrium phase transitions, this breakdown can be expressed in terms of critical indices.

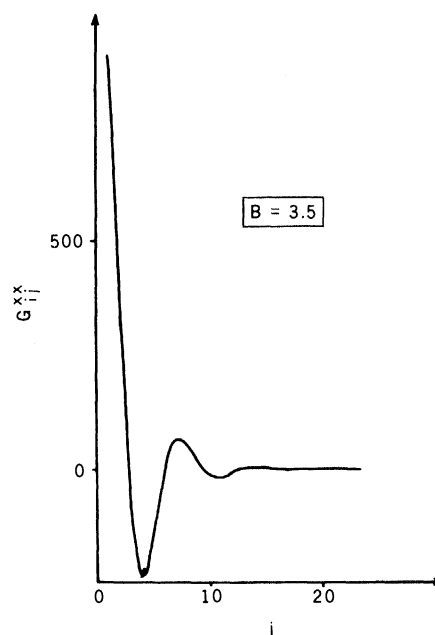


Fig. 6. As the bifurcation parameter  $B$  approaches the critical value, the range of  $G_{ij}^{XX}$  increases slightly with respect to the behavior shown in Fig. 5.

In the case of equilibrium phase transitions, fluctuations near the critical point not only have a large amplitude but also extend over large distances. Lemarchand and Nicolis (17) have investigated the same problem for nonequilibrium phase transitions. To make the calculations possible, they considered a sequence of boxes. In each box the Brusselator type of reaction (Eq. 15) is taking place. In addition, there is diffusion between one box and the other. Using the Markov method, they then calculated the correlation between the occupation numbers of  $X$  in two different boxes. One would expect that chemical inelastic collisions together with diffusion would lead to a chaotic behavior. But that is not the case. In Figs. 5 through 7 the correlation functions for below and near the critical state are represented graphically. It is clear that near the critical point we have long-range chemical correlations. Like the earlier systems that I have considered, this system acts as a whole in spite of the short-range character of the chemical interactions. Chaos gives rise to order. Moreover, numerical simulations indicate that it is only in the limit of the number of particles,  $N \rightarrow \infty$ , that we tend to "long-range" temporal order.

To understand this result at least qualitatively, let us consider the analogy with phase transitions. When we cool down a paramagnetic substance, we come to the so-called Curie point, below which the system behaves like a ferromagnet. Above the Curie point, all directions play the same role. Below the Curie point, there is a privileged direction corresponding to the direction of magnetization.

Nothing in the macroscopic equation determines which direction the magnetization will take. In principle, all directions are equally likely. If the ferromagnet would contain a finite number of particles, this privileged direction would not be maintained in time. It would rotate. However, if we consider an infinite system, then no fluctuations whatsoever can shift the direction of the ferromagnet. The long-range order is established once and for all.

There is a striking similarity between the ferromagnetic system and the case of oscillating chemical reactions. When we increase the distance from equilibrium, the system begins to oscillate. It will move along the limit cycle. The phase on the limit cycle is determined by the initial fluctuation and plays the same role as the direction of magnetization. If the system is finite, fluctuations will progressively take over and perturb the rotation. However, if the system is infinite, then we

may obtain a long-range temporal order very similar to the long-range space order in the ferromagnetic system. We see, therefore, that the appearance of a periodic reaction is a process that breaks time symmetry exactly as ferromagnetism is a process that breaks space symmetry.

### The Dynamic Interpretation of the Lyapounov Function

I shall now consider more closely the dynamic meaning of the entropy and more specifically the Lyapounov function  $\delta^2 S$  that I have used above.

Let us start with a very brief summary of Boltzmann's approach to this problem. Even today, Boltzmann's work appears as a milestone. It is well known that an essential element in Boltzmann's derivation of the  $\mathcal{H}$ -theorem was the replacement of the exact dynamic equations (as expressed by the Liouville equation to which I shall return later) by the kinetic equation for the velocity distribution function  $f$  of the molecules,

$$\frac{\partial f}{\partial t} + v \frac{\partial f}{\partial x} = \int dw dv_1 \sigma [f' f'_1 - f f_1] \quad (29)$$

where  $dw$  is the effective solid angle in the collision,  $\sigma$  is the cross section, and  $v$  is the velocity.

Once this equation is admitted, it is easy to show that Boltzmann's  $\mathcal{H}$ -quantity,

$$\mathcal{H} = \int dv f \log f \quad (30)$$

satisfies the inequality

$$\frac{d\mathcal{H}}{dt} \leq 0 \quad (31)$$

and thus plays the role of a Lyapounov function.

The progress achieved through Boltzmann's approach is striking. Still, many difficulties remain (18). First, we have practical difficulties, as, for example, the difficulty of extending Boltzmann's results to more general situations (for example, dense gases). Kinetic theory has made striking progress in the last few years; yet, when one examines recent texts on kinetic theory or nonequilibrium statistical mechanics, one does not find anything similar to Boltzmann's  $\mathcal{H}$ -theorem, which remains valid in more general cases. Therefore, Boltzmann's result remains quite isolated, in contrast to the generality we attribute to the second law of thermodynamics.

In addition, we have theoretical difficulties. The most serious is probably

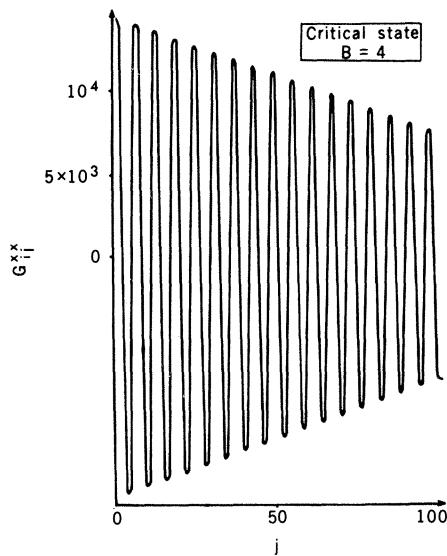


Fig. 7. Critical behavior of the spatial correlation function  $G_{ij}^{xx}$  for the same values of parameters as in Fig. 5. The correlation function displays both linear damping with distance and spatial oscillations with wavelength equal to that of the macroscopic concentration pattern.

Loschmidt's reversibility paradox. In brief, if we reverse the velocities of the molecules, we come back to the initial state. During this approach to the initial state Boltzmann's  $\mathcal{H}$ -theorem (Eq. 31) is violated. We have "antithermodynamic behavior." This conclusion can be verified, for example, by computer simulations.

The physical reason for the violation of Boltzmann's  $\mathcal{H}$ -theorem lies in the long-range correlations introduced by the velocity inversion. One would like to argue that such correlations are exceptional and may be disregarded. However, how should one find a criterion to distinguish between abnormal correlations and normal correlations, especially when dense systems are considered?

The situation becomes even worse when we consider, instead of the velocity distribution, a Gibbs ensemble corresponding to phase density  $\rho$ . Its time evolution is given by the Liouville equation,

$$i \frac{\partial \rho}{\partial t} = L\rho \quad (32)$$

where  $L\rho$  is the Poisson bracket  $i\{H, \rho\}$  in classical dynamics and is the commutator  $[H, \rho]$  in quantum mechanics ( $H$  is the Hamiltonian). If we consider positive convex functionals such as

$$\Omega = \int \rho^2 dp dq > 0 \quad (33)$$

where  $q$  is the coordinate and  $p$  is the momentum conjugate to  $q$ , or in quantum mechanics

$$\Omega = \text{tr} \rho^+ \rho > 0 \quad (34)$$

it is easily shown that, as a consequence of Liouville's equation (Eq. 32),

$$\frac{d\Omega}{dt} = 0 \quad (35)$$

Therefore,  $\Omega$  as defined in Eqs. 33 or 34 is not a Lyapounov function, and the laws of classical or quantum dynamics seem to prevent us from constructing a Lyapounov functional that would play the role of the entropy.

For this reason it has often been stated that irreversibility can only be introduced into dynamics through a supplementary approximation such as coarse-graining added to the laws of dynamics (19). I have always found it difficult to accept this conclusion, especially because of the constructive role of irreversible processes. Can dissipative structures be the result of mistakes?

We obtain a hint about the direction in which the solution of this paradox may lie by inquiring why Boltzmann's kinetics permits one to derive an  $\mathcal{H}$ -theorem whereas the Liouville equation does not. Liouville's equation (Eq. 32) is obviously  $Lt$ -invariant. If we reverse both the sign of the Liouville operator  $L$  (this can be done in classical dynamics by velocity inversion) and the sign of  $t$ , the Liouville equation remains invariant. On the other hand, it can be easily shown (18) that the collision term in the Boltzmann equation breaks the  $Lt$ -symmetry as it is even in  $L$ . We may therefore rephrase our question by asking: How can we break the  $Lt$ -symmetry inherent in classical or quantum mechanics? Our point of view has been that the dynamic and thermodynamic descriptions are, in a certain sense, "equivalent" representations of the evolution of the system connected by a nonunitary transformation. Let me briefly indicate how we may proceed. The method that I follow has been developed in close collaboration with my colleagues in Brussels and Austin (20-22).

### Nonunitary Transformation Theory

As Eq. 34 has proved inadequate, we start with a Lyapounov function of the form

$$\Omega = \text{tr} \rho^+ M \rho \geq 0 \quad (36)$$

(where  $M$  is a positive operator) with a nonincreasing time derivative

$$\frac{d\Omega}{dt} \leq 0 \quad (37)$$

This is certainly not always possible. In simple dynamic situations when the motion is periodic in either classical or

quantum mechanics, no Lyapounov function may exist as the system returns after some time to its initial state. The existence of  $M$  is related to the type of spectrum of the Liouville operator. In the frame of classical ergodic theory this question has recently been studied by Misra (23). I shall pursue here certain consequences of the possible existence of the operator  $M$  in Eq. 36, which may be considered as a "microscopic representation of entropy." As this quantity is positive, a general theorem permits us to represent it as a product of an operator, say  $\Lambda^{-1}$ , and its hermitian conjugate  $(\Lambda^{-1})^+$  (this corresponds to taking the "square root" of a positive operator)

$$M = (\Lambda^{-1})^+ \Lambda^{-1} \quad (38)$$

Inserting this in Eq. 36, we obtain

$$\Omega = \text{tr } \tilde{\rho}^+ \tilde{\rho} \quad (39)$$

with

$$\tilde{\rho} = \Lambda^{-1} \rho \quad (40)$$

This is a most interesting result, because Eq. 39 is precisely the type of equation we were looking for in the first place. But we see that this expression can only exist in a new representation related to the preceding by the transformation in Eq. 40.

First let us write the new equations of motion. Taking into account Eq. 40, we obtain

$$i \frac{\partial \tilde{\rho}}{\partial t} = \Phi \tilde{\rho} \quad (41)$$

with

$$\Phi = \Lambda^{-1} L \Lambda \quad (42)$$

Now let us use the solution of the equations of motion (Eq. 32). We may replace Eqs. 36 and 37 by the more explicit inequalities

$$\Omega(t) = \text{tr } \rho^+(o) e^{iLt} M e^{-iLt} \rho(o) \leq 0$$

and

$$\frac{d\Omega}{dt} = -\text{tr } \rho^+(o) e^{iLt} \times i (ML - LM) e^{-iLt} \rho(o) \leq 0 \quad (44)$$

The microscopic "entropy operator"  $M$  can therefore not commute with  $L$ . The commutator represents precisely what could be called the "microscopic entropy production."

We are, of course, reminded of Heisenberg's uncertainty relations and Bohr's complementarity principle. It is most interesting to find here also a non-commutativity, but now between dynamics as expressed by the operator  $L$  and "thermodynamics" as expressed by  $M$ . We therefore have a new and most

interesting type of complementarity between dynamics, which implies the knowledge of trajectories or wave functions, and thermodynamics, which implies entropy.

When the transformation to the new representation is performed, we obtain for the entropy production (Eq. 44)

$$\frac{d\Omega}{dt} = -\text{tr } \tilde{\rho}^+(o) e^{i\Phi^+ t} i (\Phi - \Phi^+) e^{-i\Phi t} \tilde{\rho}(o) \leq 0 \quad (45)$$

This result implies that the difference between  $\Phi$  and its hermitian adjoint  $\Phi^+$  does not vanish,

$$i(\Phi - \Phi^+) \geq 0 \quad (46)$$

Therefore, we reach the important conclusion that the new operator of motion which appears in the transformed Liouville equation (Eq. 41) can no longer be hermitian as was the Liouville operator  $L$ . This shows that we have to leave the usual class of unitary (or antiunitary) transformations and proceed to an extension of the symmetry of quantum mechanical operators. Fortunately, it is easy to determine the class of transformations that we have to consider now. Average values can be calculated both in the old and in the new representation. The result should be the same; in other words, we require that

$$\langle A \rangle = \text{tr } A^+ \rho = \text{tr } \bar{A}^+ \tilde{\rho} \quad (47)$$

Moreover, we are interested in transformations which will depend explicitly on the Liouville operator. This is indeed the very physical motivation of the theory. We have seen that the Boltzmann type equations have a broken  $Lt$ -symmetry. We want to realize precisely this new symmetry through our transformation (20). This can only be done by considering  $L$ -dependent transformations  $\Lambda(L)$ . Using finally the fact that the density  $\rho$  and the observables have the same equations of motion, but with  $L$  replaced by  $-L$ , we obtain the basic condition

$$\Lambda^{-1}(L) = \Lambda^+(-L) \quad (48)$$

which replaces here the usual condition of unitarity imposed on quantum mechanical transformations.

It is not astonishing that we do indeed find a nonunitary transformation law. Unitary transformations are very much like changes in coordinates, which do not affect the physics of the problem. Whatever the coordinate system, the physics of the system remains unaltered. But here we are dealing with quite a different problem. We want to go from one type of description, the dynamic one, to another, the "thermodynamic" one.

This is precisely the reason why we need a more drastic type of change in representation as expressed by the new transformation law (Eq. 48).

I have called this transformation a "star-unitary" transformation and introduced the notation

$$\Lambda^*(L) = \Lambda^+(-L) \quad (49)$$

I shall call  $\Lambda^*$  the "star-hermitian" operator associated with  $\Lambda$  (star always means the inversion  $L \rightarrow -L$ ). Then Eq. 48 shows that for star-unitary transformations the inverse of the transformation is equal to its star-hermitian conjugate.

Let us now consider Eq. 42. Using the fact that  $L$  as well as Eqs. 48 and 49 are hermitian, we obtain

$$\Phi^* = \Phi^+(-L) = -\Phi(L) \quad (50)$$

or

$$(i\Phi)^* = i\Phi \quad (51)$$

The operator of motion is a "star-hermitian," a most interesting result. To be a star-hermitian, an operator may be either even under  $L$ -inversion (that is, it does not change sign when  $L$  is replaced by  $-L$ ) or antihermitian and odd (odd means that it changes sign when  $L$  is replaced by  $-L$ ). A general star-hermitian operator can therefore be written as

$$i\Phi = (i\overset{e}{\Phi}) + (i\overset{o}{\Phi}) \quad (52)$$

Here the superscripts  $e$  and  $o$  refer respectively to the even and the odd part of the new time evolution operator  $\Phi$ . The condition of dissipativity (Eq. 46), which expresses the existence of a Lyapounov function  $\Omega$ , now becomes

$$i\overset{e}{\Phi} > 0 \quad (53)$$

It is the even part which gives the "entropy production."

Let me summarize what has been achieved. We obtain a new form of the microscopic equation (as is the Liouville equation in classical or quantum mechanics), which displays explicitly a part which may be associated with a Lyapounov function. In other words, the equation

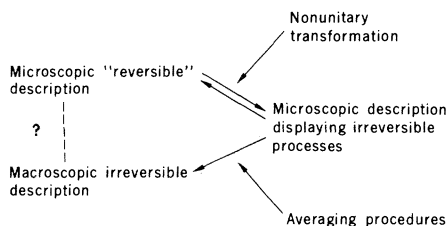
$$i \frac{\partial \tilde{\rho}}{\partial t} = (\overset{e}{\Phi} + \overset{o}{\Phi}) \tilde{\rho} \quad (54)$$

contains a "reversible" part,  $\overset{e}{\Phi}$ , and an "irreversible" part,  $\overset{o}{\Phi}$ . The symmetry of this new equation is exactly that of Boltzmann's phenomenological kinetic equation, as the flow term is odd and the collision term is even in  $L$ -inversion.

The macroscopic thermodynamic distinction between reversible and irreversible processes has in this way been trans-



posed into the microscopic description. We have obtained what could be considered as the "missing link" between microscopic reversible dynamics and macroscopic irreversible thermodynamics. The scheme is as follows:



The effective construction of the Lyapounov function  $\Omega$  (Eq. 36), through the transformation  $\Lambda$ , involves a careful study of the singularities of the resolvent corresponding to the Liouville operator (21).

For small deviations from thermodynamical equilibrium it can be shown, as has been done recently by Theodosopulu *et al.* (24), that the Lyapounov functional  $\Omega$  (Eq. 36) reduces precisely to the macroscopic quantity  $\delta^2 S$  (Eq. 9) when in addition only the time evolution of conserved quantities is retained. We therefore have now established in full generality the link between nonequilibrium thermodynamics and statistical mechanics at least in the linear region. This is the extension of the result that was obtained long ago in the frame of Boltzmann's theory, valid for dilute gases (25).

### Concluding Remarks

The inclusion of thermodynamic irreversibility through a nonunitary transformation theory leads to a deep alteration in the structure of dynamics. We are led from groups to semigroups, from trajectories to processes. This evolution is in line with some of the main changes in our description of the physical world during this century.

One of the most important aspects of Einstein's theory of relativity is that we cannot discuss the problems of space

and time independently of the problem of the velocity of light which limits the speed of propagation of signals. Similarly, the elimination of "unobservables" has played an important role in the basic approach to quantum theory initiated by Heisenberg.

The analogy between relativity and thermodynamics has often been emphasized by Einstein and Bohr. We cannot propagate signals with arbitrary speed, and we cannot construct a perpetual mobile forbidden by the second law.

From the microscopic point of view this last interdiction means that quantities that are well defined from the point of view of mechanics cannot be observables if the system satisfies the second law of thermodynamics. For example, the trajectory of the system as a whole cannot be an observable. If it were, we could at every moment distinguish two trajectories and the concept of thermal equilibrium would lose its meaning. Dynamics and thermodynamics limit each other.

It is interesting that there are other reasons which at the present time seem to indicate that the relation between dynamic interaction and irreversibility may play a deeper role than was conceived until now. In the classical theory of integrable systems, which has been so important in the formulation of quantum mechanics, all interactions can be eliminated by an appropriate canonical transformation. Is this really the correct prototype of dynamic systems to consider, especially when situations involving elementary particles and their interactions are included? Must we not first go to a noncanonical representation, which permits us to disentangle reversible and irreversible processes on the microscopic level and then only to eliminate the reversible part to obtain well-defined but still interacting units?

These questions will probably be clarified in the coming years. But already the development of the theory permits us to distinguish various levels of time: time as associated with classical or quantum dynamics, time associated with irreversibil-

ity through a Lyapounov function, and time associated with "history" through bifurcations. I believe that this diversification of the concept of time permits a better integration of theoretical physics and chemistry with disciplines dealing with other aspects of nature.

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26. This lecture gives a survey of results that have been obtained in close collaboration with my colleagues in Brussels and Austin. It is impossible to thank them all individually. I want, however, to express my gratitude to Prof. G. Nicolis and Prof. J. Mehra for their help in the preparation of the final version of this lecture.