

# Metric Entropy of Dynamical System

by

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We shall start by giving the definition of the entropy of dynamical system. Consider dynamical systems with discrete time. The phase space of dynamical system is denoted by  $M$ . It is equipped with  $\sigma$ -algebra  $\mathcal{M}$  and a probability measure  $\mu$  defined on  $\mathcal{M}$ . In the general ergodic theory dynamics is given by a measurable transformation  $T$  of  $M$  onto itself preserving the measure  $\mu$ . It is enough for many applications to assume that  $M$  is the Lebesgue space, i.e., it is isomorphic (as a measure space) to the unit interval with the usual Lebesgue measure. The concept of Lebesgue space was introduced in the works of Halmos, von Neumann and Rokhlin and now is widely used. For many applications of ergodic theory, it is sufficient to consider Lebesgue spaces.

Take a finite partition  $\xi = \{C_1, C_2, \dots, C_r\}$  of  $M$ . It generates a stationary random process of probability theory with values  $1, 2, \dots, r$  if one uses the formula

$$w_k(x) = j \text{ if } x \in T^{-k} C_j, -\infty < k < \infty.$$

Thus, each  $x$  generates a realization of the random process  $w(x) = \{\dots w_{-n}(x), \dots, w_0(x), w_1(x), \dots, w_m(x) \dots\}$ . The so-called Shannon-MacMillan theorem tells us that there exists the limit

$$h(T, \xi) = \lim_{n \rightarrow \infty} \frac{1}{n} \sum_{i_1, \dots, i_n} \mu(T^{-1}C_{i_1} \cap \dots \cap T^{-n}C_{i_n}) \ln \mu(T^{-1}C_{i_1} \cap \dots \cap T^{-n}C_{i_n}).$$

**Definition 1.** Entropy of dynamical system  $h(T) = \sup_{\xi} h(T, \xi)$  where  $\sup$  is taken over all finite partitions  $\xi$ .

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It is clear from the definition that this entropy is a metric invariant of dynamical system. The following theorem is the main tool which allows to compute  $h(T)$ . It uses the notion of generating partition.

**Definition 2.** A partition  $\xi$  is called generating partition (or generator) of the dynamical system  $(M, \mathcal{M}, \mu, T)$  if the smallest  $\sigma$ -algebra containing all  $T^n C_j, -\infty < n < \infty, 1 \leq j \leq r$ , is  $\mathcal{M}$ .

**Theorem 1.** *If  $\xi$  is a generating partition then  $h(T) = h(T, \xi)$ .*

This theorem was proven by Kolmogorov in his lecture for Bernoulli partitions. It is based upon the formula for entropy of Bernoulli shifts. The proof of this theorem for general case was given in [S1]. It uses an inequality for conditional entropies which is the equality in the Bernoulli case. However, at that time the transition from equality to inequality was a serious step. The discussions with M.S. Pinsker about general properties of entropy were very useful.

Entropy can be defined for dynamical systems with continuous time because  $h(T^t) = |t|h(T^1), -\infty < t < \infty$ . It has many useful properties. For example, if  $h(T) > 0$  then the spectrum of the unitary operator corresponding to  $T$  has a component of countable Lebesgue spectrum.

The exposition of entropy theory of dynamical systems can be found in many monographs and textbooks, see e.g., [B], [CFS], [P], [W]. Now many examples of dynamical systems with positive entropy are known even within the class of deterministic dynamical systems. Entropy plays an important role in the theory of deterministic chaos or chaos theory because it characterizes the intrinsic instability of dynamics and the speed of divergence of nearby trajectories.

The notion of Metric Entropy of Dynamical System or Kolmogorov Entropy of Dynamical System, or Kolmogorov-Sinai Entropy of Dynamical System, appeared in the paper by Kolmogorov ([K1]). This was time when Kolmogorov was interested and worked on several problems from information theory, dimension of functional spaces and so on. The basis theorem of KAM-theory appeared in the works of Kolmogorov a little bit earlier. In 1957 Kolmogorov led a seminar on dynamical systems which was attended by such people as Alexeev, Arnold, Tikhomirov, Pinsker, Meshalkin, the author of the present paper and others.

The problem of metric isomorphism of dynamical systems was certainly one of the most often discussed. In his lectures accompanying the seminar, Kolmogorov presented a probabilistic proof of the von Neumann theorem on isomorphism of dynamical systems with pure point spectrum. The main point of view at that time was that dynamical systems arising in

probability theory are different even from the metric point of view from dynamical systems generated by ODE and PDE. Motivated by all these ideas, Kolmogorov proposed the notion of entropy about which it was believed that it will allow to distinguish “probabilistic” dynamical systems and “deterministic” dynamical systems. The first announcement of the entropy was done by Kolmogorov in one of his lectures. It contained the metric invariant for Bernoulli shifts and gave the proof that 2-shifts and 3-shifts are metrically non-isomorphic. However, in the text prepared for publication the exposition was quite different. Kolmogorov introduced a new class of dynamical systems which he called quasi-regular and defined the notion of entropy only for quasi-regular systems.

Quasi-regular dynamical systems resembled regular stationary processes of probability theory which were studied earlier in the theory of random processes. Later, for some time, quasi-regular dynamical systems were called Kolmogorov systems. However, at some moment Kolmogorov asked to change this terminology because he hoped to work in this area and it would be inconvenient for him to use the words like “Kolmogorov system.” The change was done and the term  $K$ -system is now commonly accepted. However, Kolmogorov did not return to this field. The notion of  $k$ -system plays an important role in ergodic theory.

Having written the text and submitting it for publication, Kolmogorov left from Moscow to Paris where he spent the whole semester.

At that time I was already a graduate student and Kolmogorov was my advisor. I started to think about the notion of entropy which could be applied to all dynamical systems and came to the definition which was given above. At that time however, there were no non-trivial examples of dynamical systems to which this definition could be applied. During this time I met V.A. Rokhlin and explained to him Kolmogorov’s paper and his general definition of entropy. Rokhlin became very excited and proposed to compute the entropy of the automorphism of the two-dimensional torus. Following the main point of view at that time, I tried to prove that the entropy is zero because the automorphism of the torus is certainly a purely “deterministic” dynamical system. I couldn’t provide the proof and showed my drawings to Kolmogorov. He immediately said that the entropy must be positive. After that I derived very quickly the needed result and it became clear that there are enough reasons to publish my definition of entropy together with the formula for the entropy of the torus automorphism. This was done in [S1] and the title of the paper was “On the notion of entropy of dynamical system.” Some time later, Rokhlin found an example which showed that the entropy introduced by Kolmogorov is not a metric invariant of dynamical system. This example was reproduced in the paper by Kolmogorov (see [K2]). Now there are many examples of this kind. (See the paper [LPS] by E. Lindenstrauss, Y. Peres, W. Schlag). However, the result proven by Kolmogorov in his lecture was correct!

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