

Ergodicity Test of the Eddy Correlation Method

Jinbei CHEN^{1,2} Yinqiao HU^{2,*} Ye YU^{1,2} Shihua LÜ¹

¹ Key Laboratory of Land Surface Processes and Climate Change in Cold and Arid Regions; Cold and Arid Regions Environment and Engineering Institute, Chinese Academy of Sciences, Lanzhou 730000, P R China.

² Pingliang Land Surface Process & Severe Weather Research Station, Chinese Academy of Science, Pingliang 744015, P R China.

E-mail: chenjinbei@lzb.ac.cn

* Corresponding author: hyq@ns.lzb.ac.cn

Abstract

The ergodic hypothesis is a basic hypothesis in atmospheric turbulent experiment. The ergodic theorem of the stationary random processes is introduced first into the turbulence in atmospheric surface layer (ASL) to analyze and verify the ergodicity of atmospheric turbulence measured by the eddy covariance system with two sets of field observational data of the ASL. The results show that eddies of atmospheric turbulence, of which the scale is smaller than the scale of atmospheric boundary layer (ABL), i.e., the spatial scale is less than 1,000 m and temporal scale is shorter than 10 min, can effectively satisfy the ergodic theorems. Therefore, the finite time average can be used to substitute for the ensemble average of atmospheric turbulence. Whereas, eddies are larger than ABL's scale, cannot satisfy the mean ergodic theorem. Consequently, when the finite time average is used to substitute for the ensemble average, the eddy correction method would occur a large error rate due to the losing low frequency information of the larger eddies. The multi-station observation is compared with the single-station, and then the scope that satisfies the ergodic theorems is expanded from the smaller scale about 1000 m of ABL's scale to about 2000 m, even it exceeds ABL's scale. Therefore, the calculation of average, variance and fluxes of the turbulence can effectively satisfy the ergodic assumption, and the results are more approximate to the actual values. Regardless of vertical velocity or temperature, the variance of eddies in different scales can more efficiently follow Monin-Obukhov Similarity Theory (MOST) if the ergodic theorem can be satisfied; or else it deviates from MOST. The ergodicity exploration of the atmospheric turbulence is doubtlessly helpful to understanding the issues in atmospheric turbulent observation and provides a theoretical basis for overcoming related difficulties.

Please rewrite,
I do not understand
this sentence.

Keywords: Ergodic hypothesis; eddy-correlation method; Monin-Obukhov similarity theory (MOST); atmospheric surface layer (ASL); high-pass filtering

1 Introduction

The basic principle of average of the turbulence measurement is the ensemble average of space, time and state. However, it is impossible that an actual turbulence measurement with numerous observational instruments in space for enough time to obtain all states of turbulent eddies to achieve the goal of ensemble average. Therefore, based on the ergodic hypothesis, the time average at one spatial point, which is long enough for observation, is used to substitute for the ensemble average for temporally steady and spatially homogeneous surface (Stull 1988; Wyngaard 2010; Aubinet 2012). The ergodic hypothesis is a basic assumption in atmospheric turbulence experiment of the atmospheric boundary layer (ABL) and atmospheric surface layer (ASL). The stationarity, homogeneity, and ergodicity are routinely used to link the ensemble statistics (mean and higher-order moments) of field observational experiments in the ABL. Many authors habitually refer to the ergodicity assumption with as some descriptions such as “when satisfying ergodic hypothesis,” or “something indicates that ergodic hypothesis is satisfied”. Though the success of Monin-Obukhov Similarity Theory (MOST) for unstable and near-neutral conditions is just an evidence of ergodic hypothesis validity in the ASL, however it is only a necessary condition for ergodicity in the ASL experiments, does not prove ergodicity (Katul et al., 2004). MOST success is under the conditions of stationary and homogeneous surface. It implies that the stationarity and homogeneity are the important conditions of ASL ergodicity. Therefore, many ABL experiments focus on seeking ideal homogeneous surface as much as possible. And some test procedures of availability are widely applied to establish stationarity (Foken and Wichura 1996; Vickers and Mahrt 1997). Katul et al. (2004) qualitatively analyzed the ergodicity problems in regarding atmospheric turbulence, and believed that it is common for the neutral and unstable stratification in ASL to reach ergodicity, while it is difficult to reach ergodicity for the stable layer. Eichinger et al. (2001) indicate that LIDAR (Light Detection and Ranging) technique opens up new possibilities for atmospheric measurements and analysis by providing spatial and temporal atmospheric information with simultaneous high-resolution. The stationarity and ergodicity can be

68 tested for such ensembles of experiments. Recent advances in LIDAR measurements
69 offers a promising first step for direct evaluation of such hypotheses for ASL flows
70 (Higgins et al., 2013). Higgins et al. (2013) applied LIDAR of water vapor
71 concentration to investigate the ergodic hypothesis of atmospheric turbulence for the
72 first time. It is clear all the same that there is a need to reevaluate turbulence
73 measurement technology, to test the ergodicity of atmospheric turbulence
74 quantitatively by means of observation experiments.

75 The ergodic hypothesis was first proposed by Boltzmann (Boltzmann 1871; Uffink
76 2004) in his study of the ensemble theory of statistical dynamics. He argued that a
77 trajectory traverses *all* points on the energy hypersurface after a certain amount of
78 time. At the beginning of 20th century, Ehrenfest couple proposed the quasi-ergodic
79 hypothesis and changed the term "traverses *all* points" in aforesaid ergodic hypothesis
80 to "passes arbitrarily close to every point". The basic points of ergodic hypothesis or
81 quasi-ergodic hypothesis recognize that the macroscopic property of system in the
82 equilibrium state is the average of microcosmic quantity in a certain amount of time.
83 Nevertheless, the ergodic hypothesis or quasi-ergodic hypothesis were never proven
84 theoretically. The proof of ^{the} ergodic hypothesis in physics aroused the interest of
85 mathematicians. The famous mathematician, Neumann et al. (1932) first theoretically
86 proved the ergodic theorem in topological space (Birkhoff 1931, Krengel 1985).
87 Afterward, a banal ergodic theorem of stationary random processes was proved to
88 provide the necessary and sufficient conditions for the ergodicity of stationary random
89 processes. Mattingly (2003) reviewed research progress of the ergodicity of random
90 Navier-Stokes equations, and Galanti (Galanti et al. 2004), Lennaert et al. (2006) solved
91 the ~~random~~ Navier-Stokes equation by numerical simulation to prove that ~~the~~
92 turbulence which is temporally steady and spatially homogeneous is ergodic.
93 However, Galanti (2004) also indicated that such partially turbulent flows acting as
94 mixed layer, wake flow, jet flow, flow around the boundary layer may be non-ergodic
95 turbulence.

96 Obviously, the advances of research on the ergodicity in the mathematics and
97 physics have ^{led the way for} ~~precedence far over~~ the atmospheric science. We try firstly to introduce
98 the ergodic theorem of stationary random processes to atmospheric turbulence in ASL
99 in this paper. ~~And that~~ ^{The} ergodicity of different scale eddies of atmospheric
100 turbulence is directly analyzed and verified quantitatively on the basis of the field

observations obtained using the technique.

101 ~~observational data measured by the eddy covariance system.~~

102 2 Theories and methods

103 2.1 Ergodic theorems of stationary random processes

104 ~~The~~ stationary random processes are the processes which will not vary with time, i.e.,
105 for observed quantity A , its function of ~~spatial~~ ^{space} x_i and ~~temporal~~ ^{time} t_i satisfies the following
106 condition:

$$107 A(x_1, x_2, \dots, x_n; t_1, t_2, \dots, t_n) = A(x_1, x_2, \dots, x_n; t_1 + \tau, t_2 + \tau, \dots, t_n + \tau), \quad (1)$$

108 where τ is a time period, defined as the relaxation time.

109 The mean μ_A of ^a random variable A and autocorrelation function $R_A(\tau)$ are
110 respectively defined as following:

$$111 \mu_A = \lim_{T \rightarrow +\infty} \frac{1}{T} \int_0^T A(t) dt, \quad (2)$$

$$112 R_A(\tau) = \lim_{T \rightarrow +\infty} \frac{1}{T} \int_0^T A(t) A(t + \tau) dt. \quad (3)$$

113 The autocorrelation function $R_A(\tau)$ is a temporal second-order moment. In the case of
114 $\tau=0$, the autocorrelation function $R_A(\tau)$ is the variance of random variable. ~~The~~ ^A
115 necessary and sufficient conditions ~~that~~ ^{for a} stationary random processes ^{to} satisfy the mean
116 ergodicity are the mean ergodic function $Ero(A)$ to zero (Papoulis et al. 1991), as
117 shown below:

$$118 Ero(A) = \lim_{T \rightarrow \infty} \frac{1}{T} \int_0^T \left(1 - \frac{\tau}{2T}\right) [R_A(\tau) - \mu_A^2] d\tau = 0. \quad (4)$$

119 The mean ergodic function $Ero(A)$ is a time integral of variation between the
120 autocorrelation function $R_A(\tau)$ of variable A and its mean square, μ_A^2 . If the mean
121 ergodic function $Ero(A)$ converges to zero, then the stationary random processes will
122 be ergodic. In other words, if the autocorrelation function $R_A(\tau)$ of variable A
123 converges to its mean square, μ_A^2 , the stationary random processes are mean ergodic.
124 The Eq. (4) is namely the mean ergodic theorem to be called as well as ergodic
125 theorem of the *weakly* stationary processes in mathematics. For discrete variables, Eq.
126 (4) can be rewritten as the following:

$$127 Ero(A) = \lim_{n \rightarrow \infty} \sum_{i=0}^n \left(1 - \frac{\tau_i}{n}\right) [R_A(\tau_i) - \mu_A^2] = 0. \quad (5)$$

128 The Eq. (5) is the mean ergodic theorem of discrete variable. Hence, Eqs. (4) and (5)