



Size Distributions Reveal Regime Transition of Dominant Driving Force in Lake Systems





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1. Research Background

Significance: The power law size distribution discovered in natural lakes indicates that lakes are complex systems with characteristics of scale-invariance, critical tipping and selforganization.

Knowledge gaps:

Q1: Power law distribution is not sufficient to describe the whole size range of lakes, with deviations at both ends. What is the full size distribution of lakes?

Q2: What is the driving mechanism underlying the power law distribution observed in lake systems?

2. Methodology

2.1 Statistical analysis

Power law distribution

$$p(X \ge x) = (rac{x}{x_{min}})^{-b}$$
 (Clauset et al., 2009)

 $- \ge x_{min}$ power law

 $< x_{min} | exponential <math>p(x) = C_1 e^{-c_1 x}$ stretched-exponential $p(x) = C_2 x^{\beta-1} e^{-c_2 x^{\beta}}$

2.2 Phase properties quantification

- Coefficient of variation: $CV = \sigma/\mu$ (Loreau & Mazancourt, 2013)
- Entropy: $AE = \frac{1}{N} \left[-\sum_{i=1}^{N} n_i p_i(x) \log_2 p_i(x) \right]$ (Lesne, 2014)

2.3 Power spectrum analysis

- Power spectrum: $S(\varphi) = \int dx \frac{xp(x)}{1+(\varphi x)^2} \propto \varphi^{\gamma}$ $(\gamma = -3 + b)$ (Bak et al., 1987)
- Hurst exponent: $H = \frac{\gamma 1}{2} + 1$ (Womell, 1993)
- Autocorrelation: $\gamma > 0$, $R(\tau) \approx \frac{1}{\pi \tau} \varphi^{\gamma} sin(\varphi \tau) |_{\varphi \to +\infty} (diverge)$



Fig. 1 Study sites: 11 hydroclimatic zones in China.

(Kubo&Hashitsume, 2012)

3.3 Power law phase and system resilience • "Blue" shift in size power spectrum Autocorrelation diverges Endogenic force: topography and topographic processes Exogenic force: other factors and non-topographic processes Reduced system resilience 3. Results **3.4 Conceptual model** Human impacts Lake size distribution **Driving forces** Phase boundary Stretched-Shoulder component: stretched-exponential or exponential distribution Exponential exponential Body and tail components: power law distributions $CCDF \propto e^{-cx}$ $CCDF \propto x^{\beta-1}e^{-cx^{\beta}}$ **Exogenic force regime Mixing Zone** Endogenic Disorder Random CCDF: complementary cumulative distribution function $b_1 < 1, \gamma < 0, H < 0.5$ x_{min} Non-topographic processes x_{max} $b_1 > 1, \gamma > 0, H > 0.5$ γ : the exponent of size power spectrum *H*: *Hurst* exponent 4. Conclusions Phase boundary Phase III Phase I or II $(R = \frac{N2}{N1 + N2})$ $(WR = \frac{N1}{N1 + N2})$ C1: *b*₁<1, γ<0, *H*<0.5 stretched-exponential : WR≥60% and power C2: *b*₁>1, γ>0, *H*>0.5 [] : WR<60% critical scale Shoulder orderliness. Lake size (x) x_{max} R=100% Xmin=50.75(km²) r² r²=1.00 RMSE=0.00 stretched-exponential and further to exponential. NWM: observed lakes Stretched exponential) -----> Endogenic force xogenic force (94.19%) (94.07%) b1=0.78 R=86.33% Xmin=0.14(km²) y=9765.96x^3.59exp(-38232.85x^4 r²=0.99 RMSE=0.00 Fig. 3 Lake size distribution phases (a), its properties (b)

2.4 Isolation of driving factors and processes • Potential lake simulation: $TWI = \log(\frac{AS}{tan\beta})$ (Hu et al., 2017) Comparison between observed and simulated lakes & satellite images • Driving forces: 3.1 Full size distribution of lakes —— [Fig. 2] • Three components and three phases 3.2 Phase transition and dominant driving force change -- [Fig. 3] • Power law : heterogeneous and ordered; endogenic force dominated • Exponential: random; exogenic force dominated Stretched-exponential: homogeneous and disordered; joint control



Fig. 2 Lake size distribution consists of three phases featured by distinct distribution functions.

and dominant driving forces (c).





Fig. 5 A conceptual model of the driving mechanism underlying lake size distribution.

• Full size distribution of lakes contains exponential, with phases law successively increasing degrees of heterogeneity and

 Dominant driving force changed from endogenic to exogenic shifts the size distribution from power law to

• Exogenic force tends to shrink the power law phase and increase its scaling exponent, leading to the loss of resilience in lake systems.