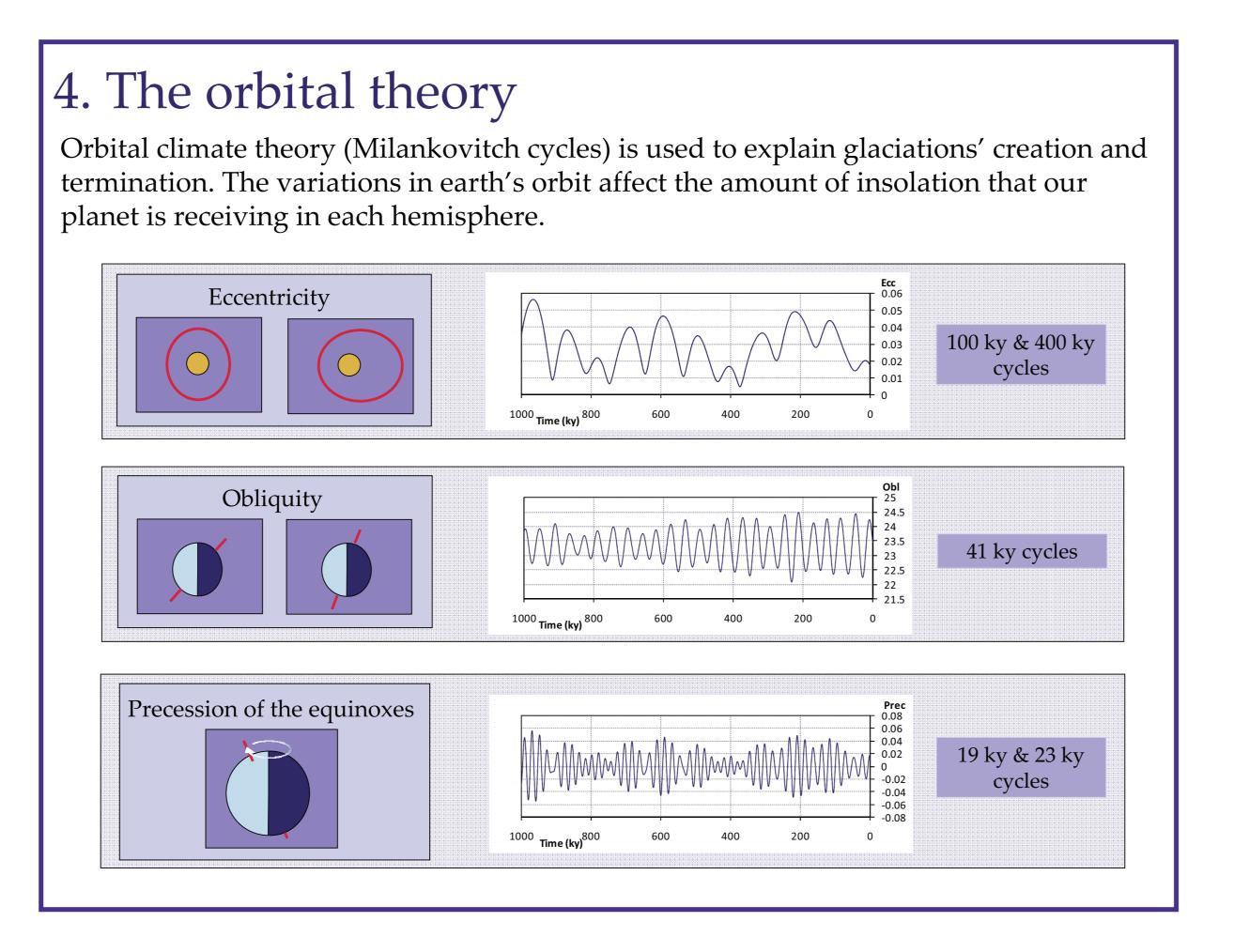
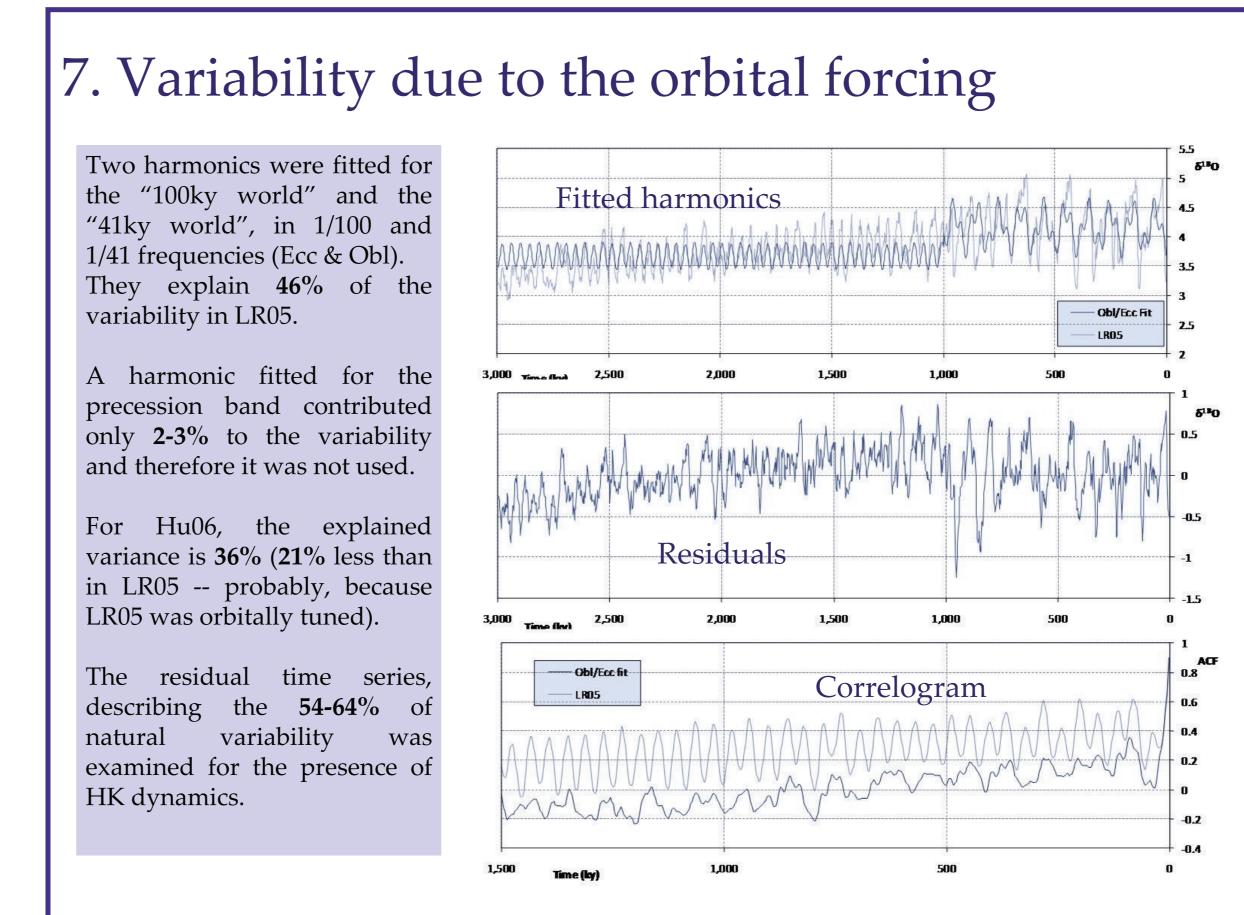
# Orbital climate theory and Hurst-Kolmogorov dynamics

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### 1. Abstract

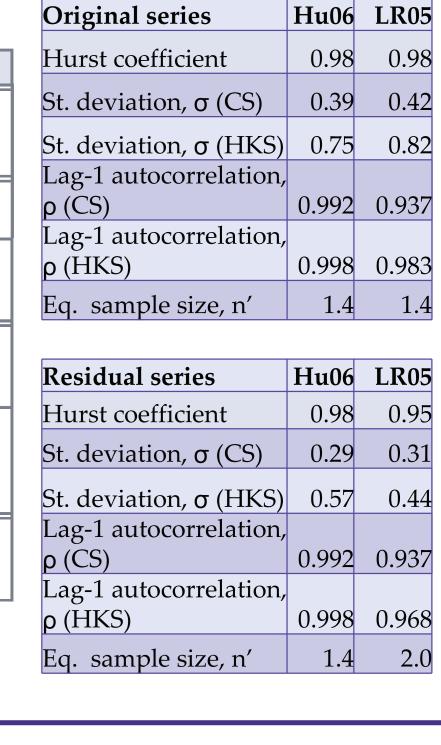
Orbital climate theory, based mainly on the work of Milankovitch, is used to explain some features of long-term climate variability, especially those concerning the ice-sheet extent. The paleoclimatic time series, which describe the climate-orbital variability relationship, exhibit Hurst-Kolmogorov dynamics, also known as long-term persistence. This stochastic dynamics provides an appropriate framework to explore the reliability of statistical inferences, based on such time series, about the consistency of suggestions of the modern orbital theory. Our analysis tries to shed light on some doubts raised from the contradictions between the orbital climate theory and paleoclimatic data.





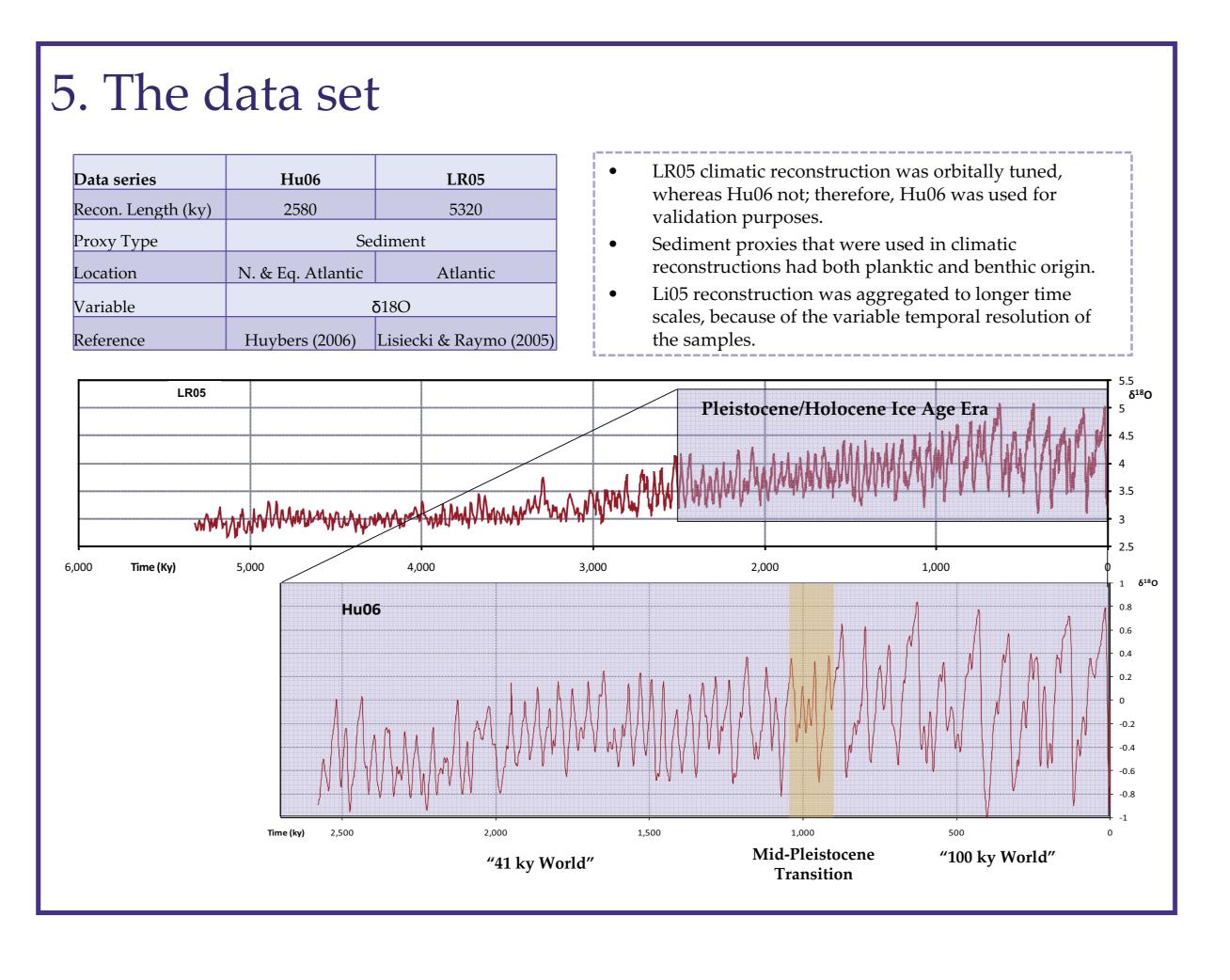
## 10. Comparison of Hurst-Kolmogorov statistics (HKS) and classical statistics (CS)

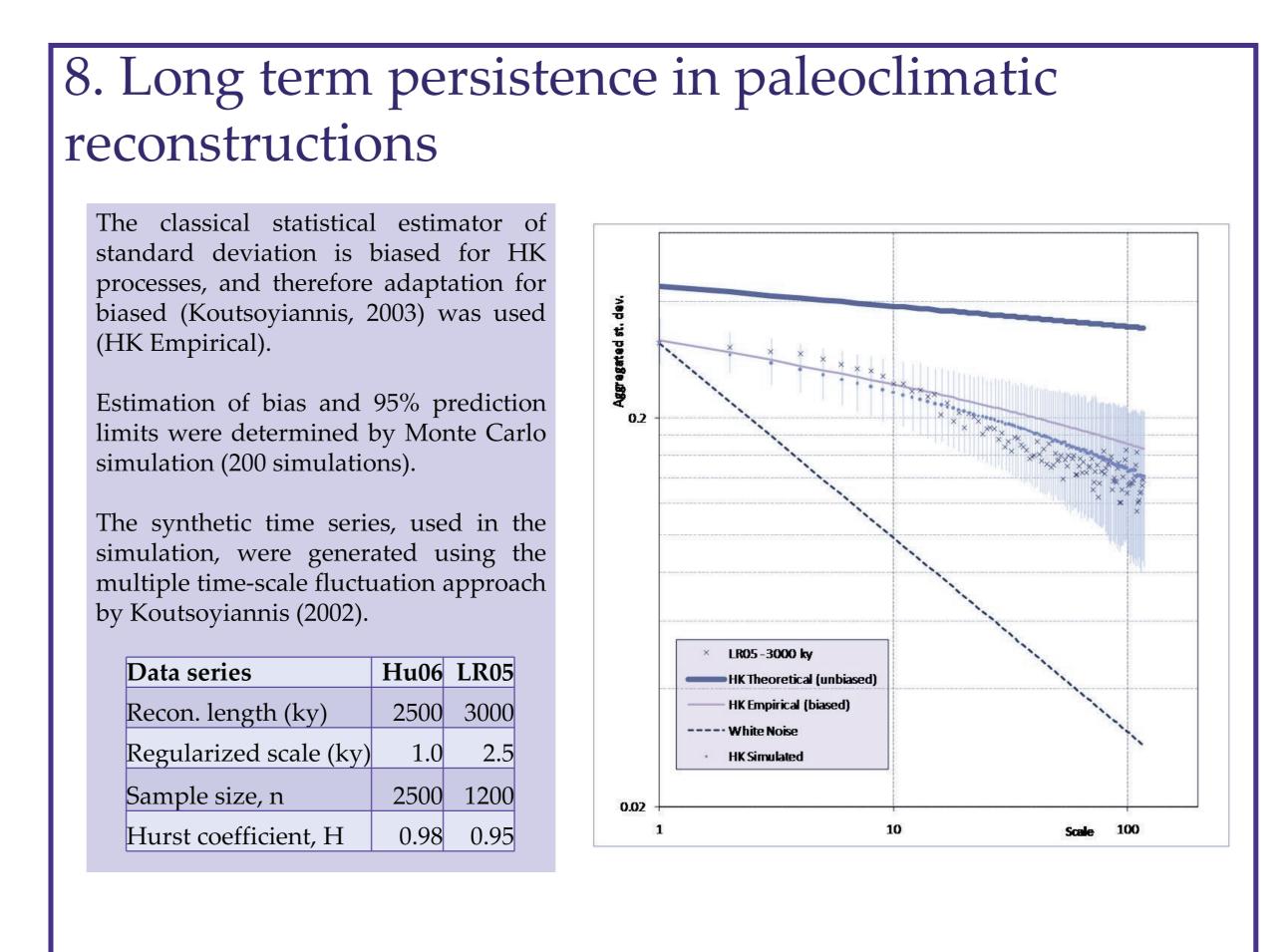
True values $\rightarrow$	Mean, $\mu$	Standard deviation, $\sigma$	Autocorrelation $\rho_l$ for lag
Standard estimator	$\overline{\underline{x}} := \frac{1}{n} \sum_{i=1}^{n} \underline{x}_{i}$	$\underline{\underline{s}} := \sqrt{\frac{1}{n-1}} \sqrt{\sum_{i=1}^{n} (\underline{x}_i - \overline{\underline{x}})^2}$	$r_{l} := \frac{1}{(n-1)\underline{s}^{2}} \sum_{i=1}^{n-l} (\underline{x}_{i} - \overline{\underline{x}}) (\underline{x}_{i+l})$
Relative bias of estimation, CS	0	≈ 0	≈ 0
Relative bias of estimation, HKS	0	$\approx \sqrt{1 - \frac{1}{n'}} - 1 \approx -\frac{1}{2n'}$	$\approx -\frac{1/\rho_l - 1}{n' - 1}$
Standard deviation of estimator, CS	$\frac{\sigma}{\sqrt{n}}$	$\approx \frac{\sigma}{\sqrt{2(n-1)}}$	
Standard deviation of estimator, HKS	$\frac{\sigma}{\sqrt{n'}}$	$\approx \frac{\sigma \sqrt{(0.1 \ n + 0.8)^{\lambda(H)}(1 - n^{2H - 2})}}{\sqrt{2(n - 1)}}$ where $\lambda(H) := 0.088 \ (4H^2 - 1)^2$	
results in the sai	me uncertain	valent" or "effective" sample size ty of the mean as a sample with oyiannis & Montanari, 2006).	*



#### 2. Motivation

- There is an on-going debate about the consistency of orbital climate theory, based on some contradictions between the results of this theory and paleoclimatic data.
- In this debate, extensive use of the well-known rules of classical statistics is typically made. The Hurst-Kolmogorov approach provides a better representation of the basic statistical properties of empirical data, such as variance over different scales and autocorrelation function, as long as long-term persistence exists.
- The comparison between the statistical estimators of classical statistics (CS) and Hurst-Kolmogorov statistics (HKS), has shown that in these cases the variance and, therefore, the system uncertainty is underestimated by the CS (Koutsoyiannis & Montanari, 2007). This difference becomes quite serious as the Hurst coefficient, which is the index of long-term persistence strength, approaches 1.
- Temperature reconstructions of shorter scales exhibit this kind of behaviour as demonstrated e.g. by Koutsoyiannis (2003); therefore, we seek possible HK behaviour in longer time scales and examine the consequences in the implied uncertainty.





#### 11. Conclusions

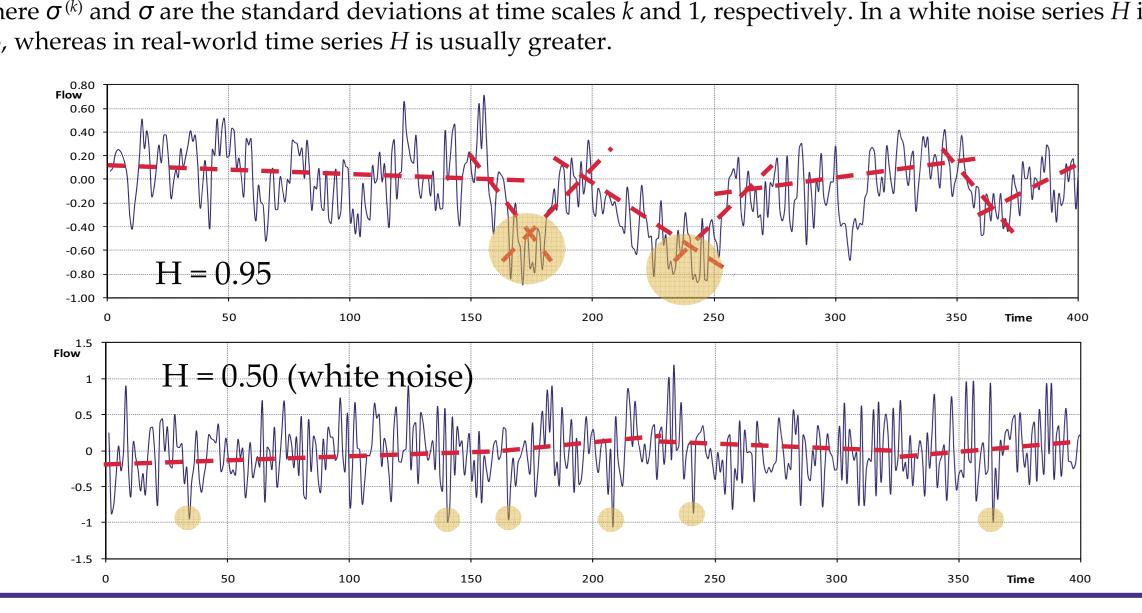
- The Hurst-Kolmogorov dynamics, also known as long-term persistence, has been detected in paleo-climate reconstructions, dating back to 3,000
- Only a portion (36-46%) of natural variance can be described by the orbital forcing. The impact of precession of equinoxes in this portion is
- Hurst coefficient, *H*, demonstrates high values (approx. 0.95-0.98 for each reconstruction), which results in serious differences between the estimation of the statistical properties of the data using CS or HKS. Hurst coefficient is almost the same for the reconstruction data and the residual time series.
- The empirical data lie within the prediction limits of the HK process. Strong estimation bias is evident.
- The residual time series, describing the 54-64% of natural variance can be described as an HK processes. This is **not** white noise.
- The decline of the mean temperature during the last 3,000 ky could be explained as an intrinsic characteristic of HK process and **not** a deterministic trend.
- The comparison of statistical analysis between CS and HKS results in serious differences in the estimation of the data variability.

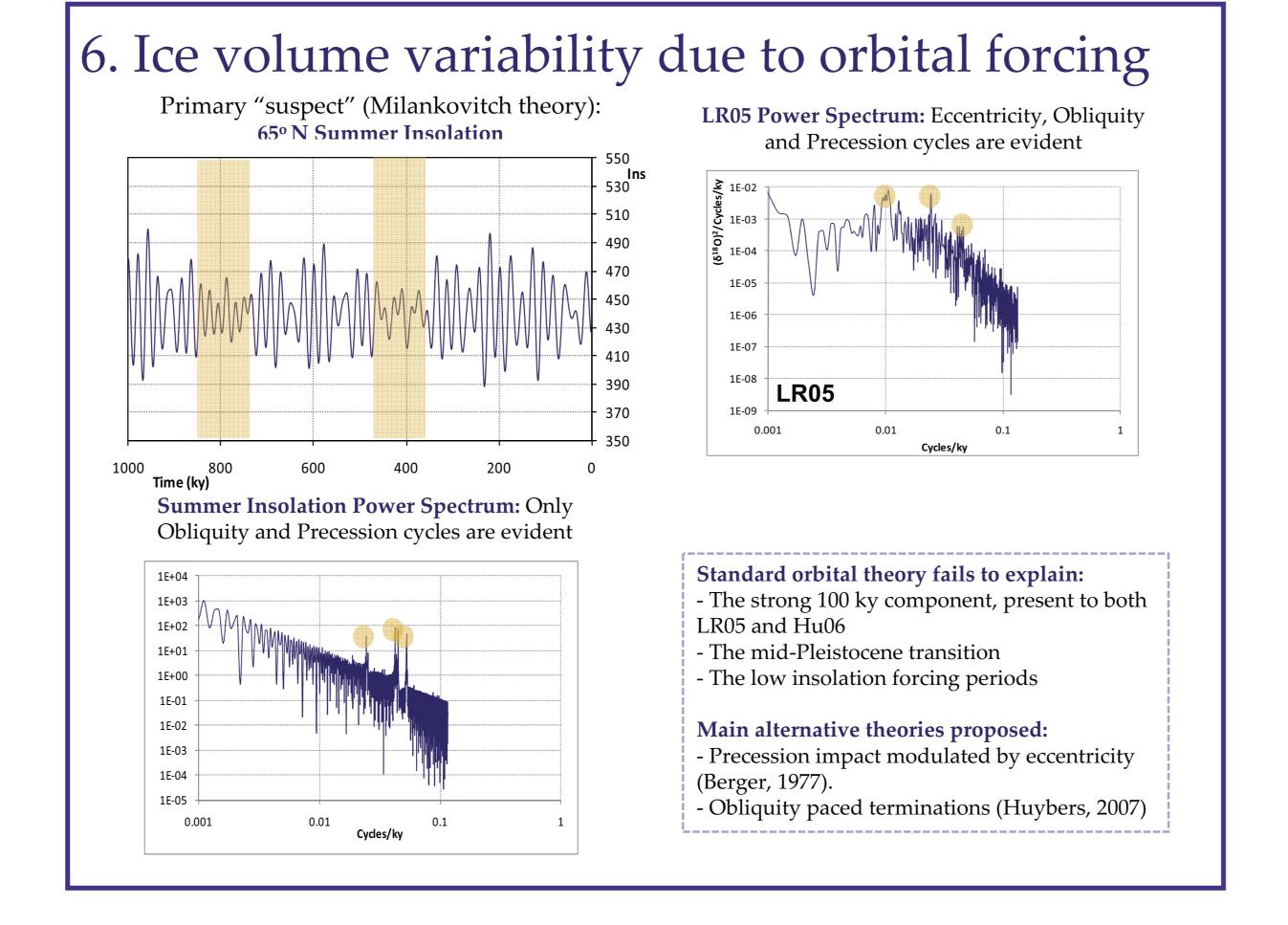
## 3. Hurst-Kolmogorov dynamics

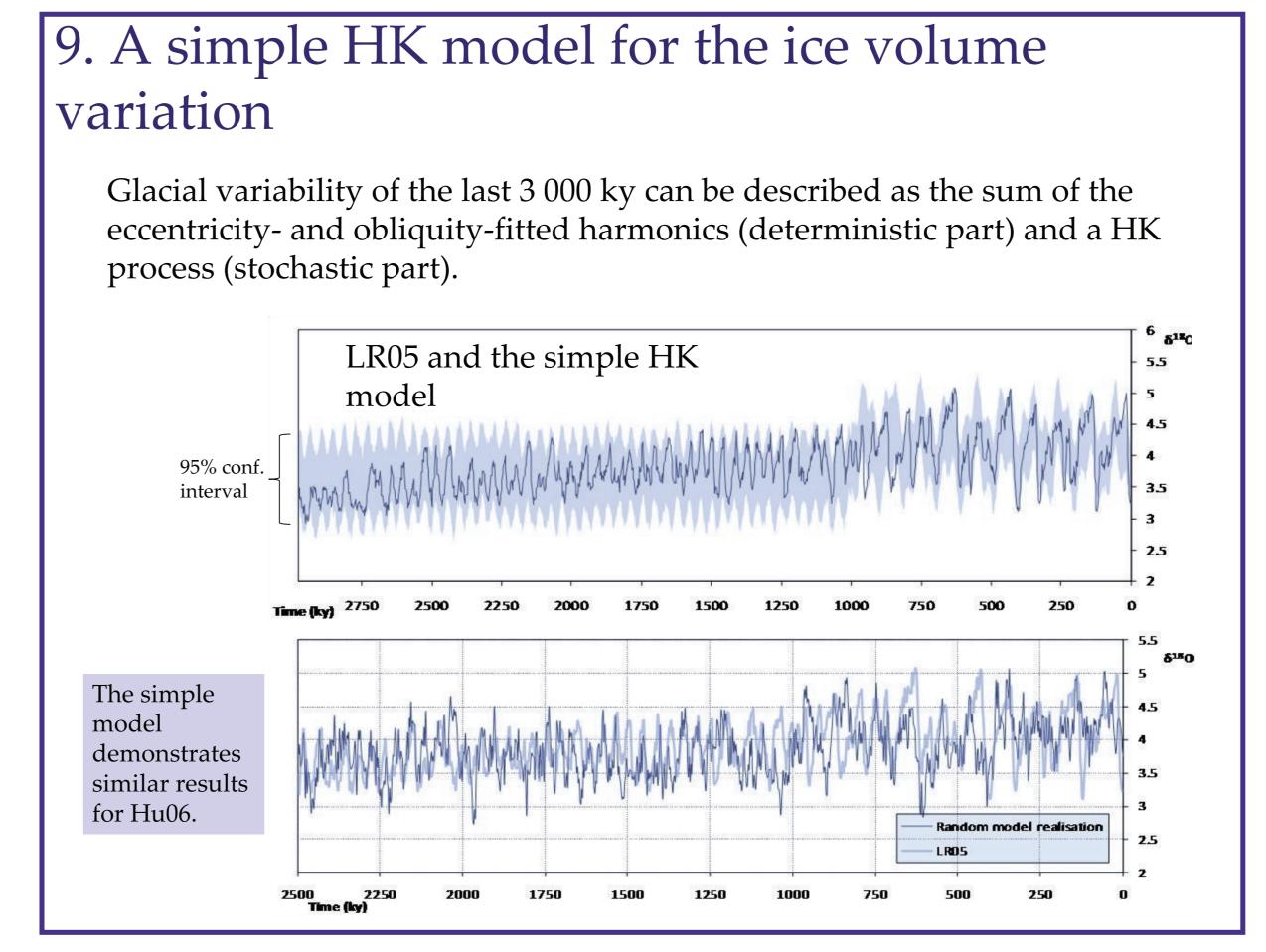
Hurst-Kolmogorov dynamics describes the scaling behaviour in natural processes. It can be perceived as the tendency of high or low values of natural events to group. Scaling behaviour can produce frequent and strong "trends" in a process, in contrast to white noise.

This behaviour is mathematically described in terms of invariance properties of the time series aggregated on different time scales, and therefore quantified through the so-called Hurst exponent, H, which is described by the relationship:

 $\sigma^{(k)} = k^{H-1} \sigma$ where  $\sigma^{(k)}$  and  $\sigma$  are the standard deviations at time scales k and 1, respectively. In a white noise series H is 0.5, whereas in real-world time series H is usually greater.







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