

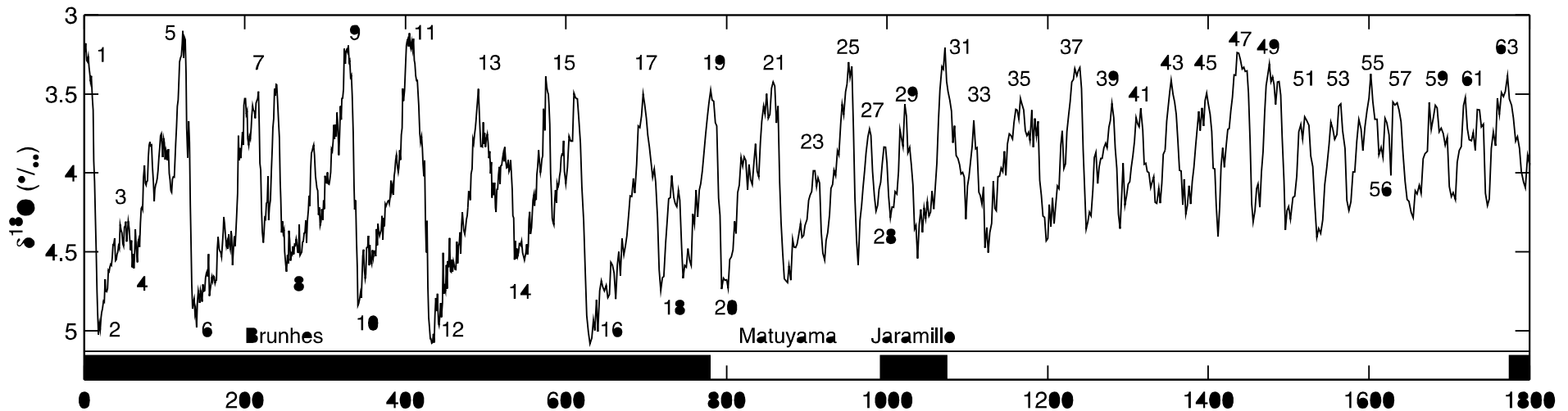
Meta-stability in stochastic partial differential equations induced by Lévy noise

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1. Paleoclimatic time series



Lisiecki, Raymo, *Paleoceanography* 2005 concentration variation of ^{18}O to ^{16}O taken from marine sediments at 57 globally distributed sites (e.g. Brunhes, Matuyama, Jaramillo):

global average temperature time series

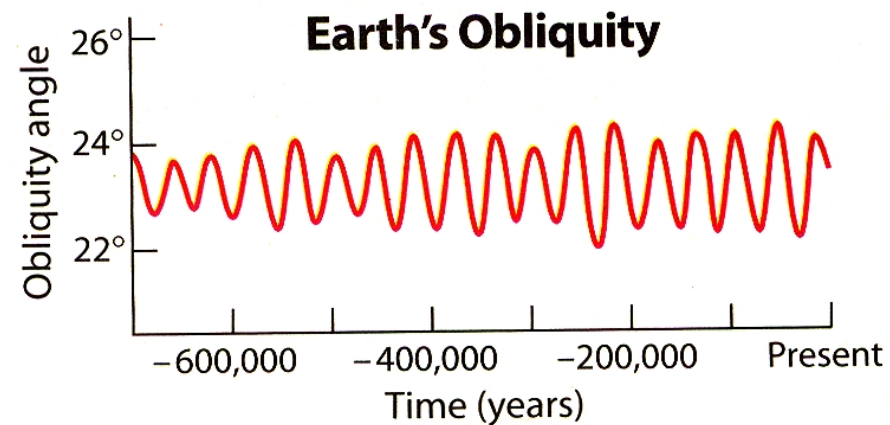
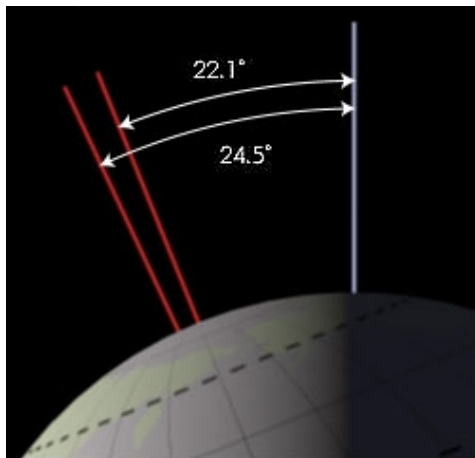
basic feature:

- from 0 to -1 Myr **periodicity $\sim 100\,000\text{ y}$**
- from -1 Myr to -1.8 Myr **periodicity $\sim 44\,000\text{ y}$**

2. Milankovich cycles

Milankovich (1920): astronomical perturbations of earth's trajectory give rise to basically three cycles: **precession**, **obliquity**, **eccentricity**

obliquity (axial tilt) (41 000 y)

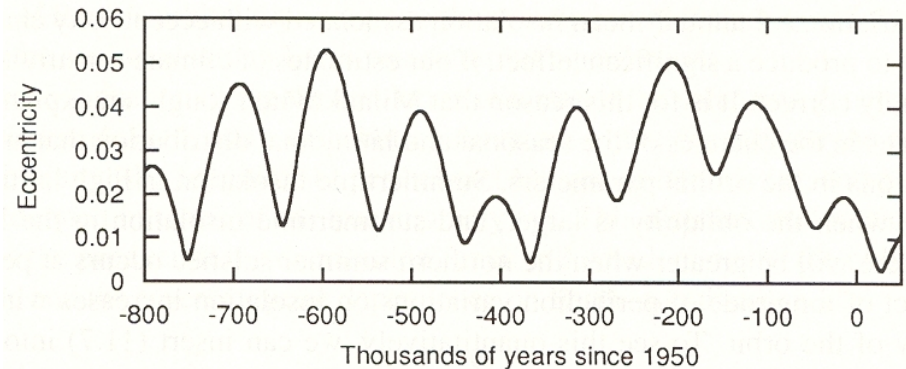
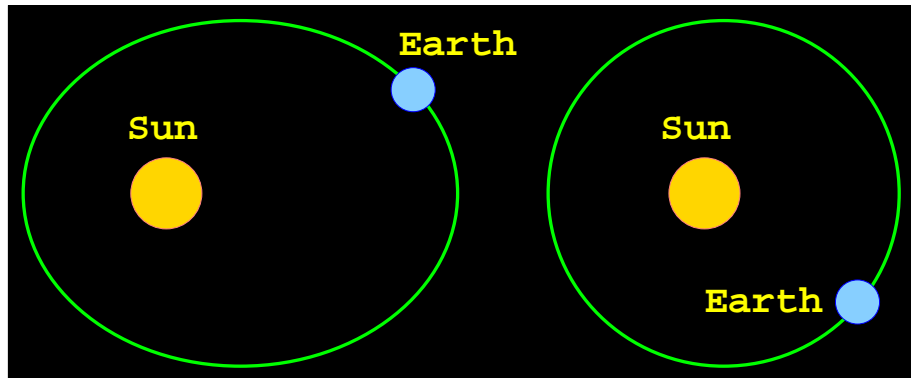


periodic wobbling of Earth's rotation axis: 2.4 deg change in tilt of axis with respect to plane of orbit; periodicity: 41 000 y; present tilt: 23.4 deg.

increase of obliquity: increase of amplitude of seasonal cycle in insolation, **summers** receiving **more radiative flux**, **winters less**

3. Milankovich cycles

eccentricity (100 000 y)



eccentricity: measure of deviation of ellipse from circularity; periodic variation between 0.005 and 0.058; reason: interactions with gravitational fields of Jupiter and Saturn; periodicity 100,000 y; present eccentricity: 0.017.

Orbital mechanics: eccentricity extreme means seasons on far side of orbit last substantially longer.

4. EBM: Gaussian SDE model; noise induced transitions

C. Nicolis; Benzi et al. 80'

Energy Balance Model for global Earth temperature X : attempt of simple explanation of time series

$$c \frac{dX(t)}{dt} = R_{\text{in}} - R_{\text{out}}$$

Gaussian SDE

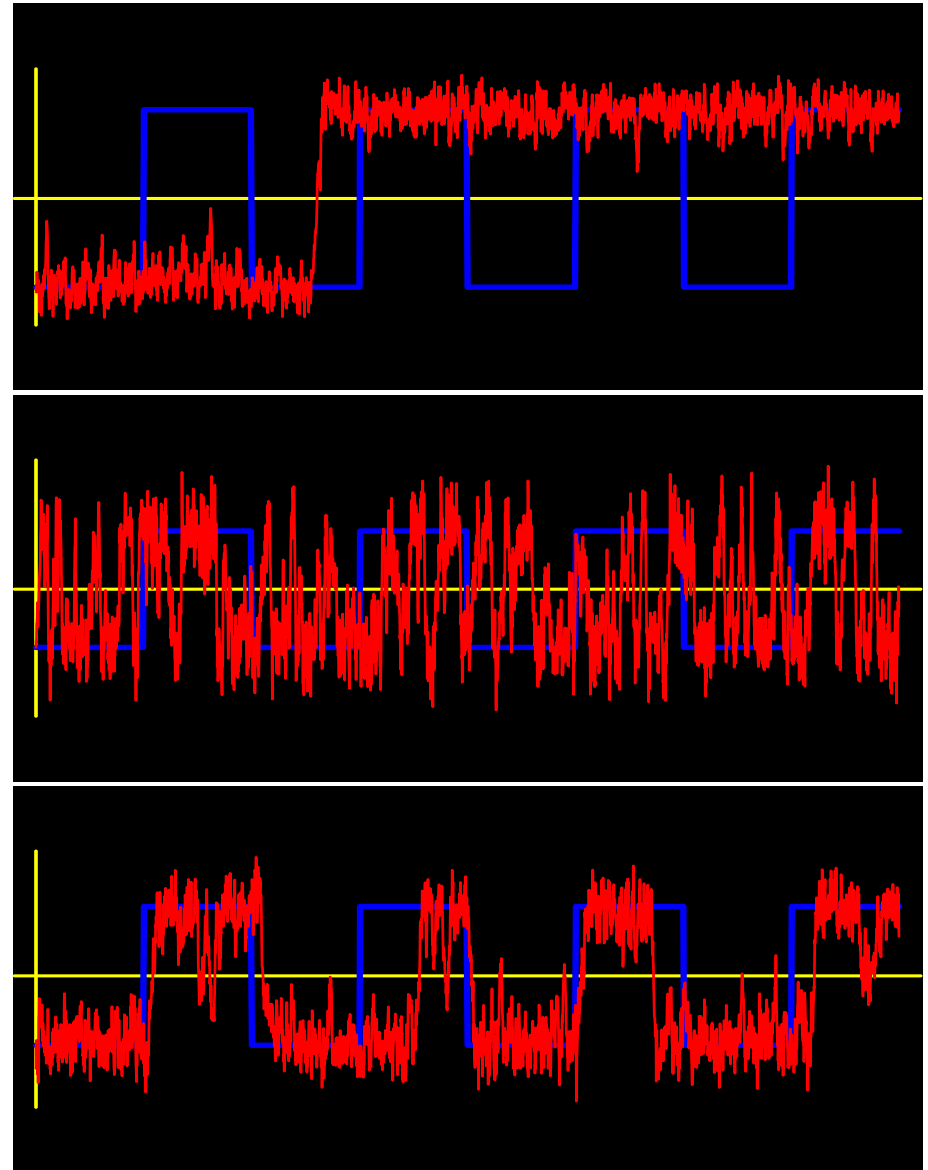
$$dX(t) = -U' \left(\frac{t}{T}, X(t) \right) dt + \varepsilon dW(t)$$

Double-well potential with periodically varying wells' depths

$$U'(t, \pm 1) = U'(t, 0) = 0$$

Period T – large; noise ε – small.

Different **noise intensities** lead to different regimes.



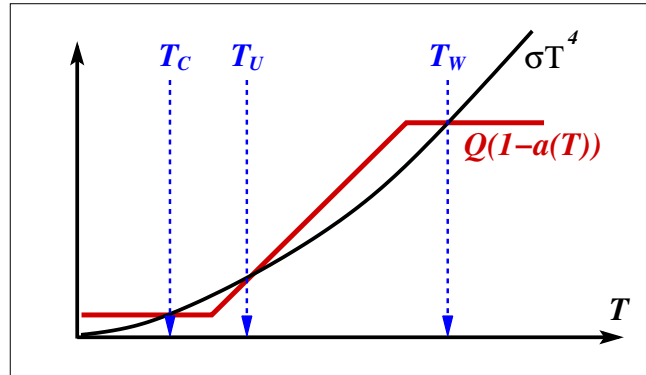
5. Gaussian transition times

simplest model

slowly time varying potential gradient

$$U'(t, x) = Q_t(1 - a(x)) - \sigma x^4,$$

first omit time variation; double well potential U ;



consider sde

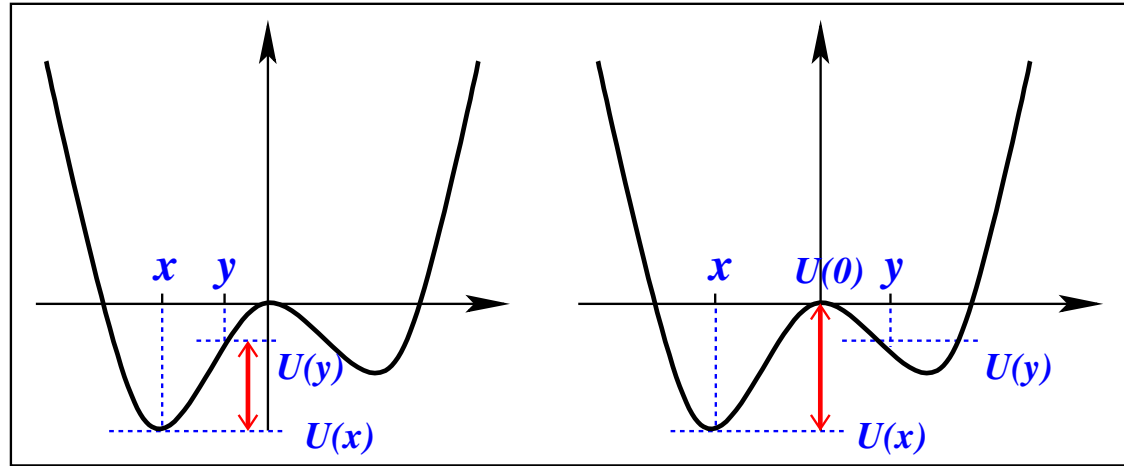
$$dX^\varepsilon(t) = -U'(X^\varepsilon(t))dt + \varepsilon dW(t)$$

Under which conditions transitions can be expected?

How long do they take in the small noise limit?

6. Gaussian transition times

action functional \Rightarrow pseudopotential $V(x, y) = 2[\text{work } x \rightarrow y]$,



$$V(x, y) = 2[U(y) - U(x)]^+ \quad V(x, y) = 2[U(0) - U(x)]^+$$

$$\tau_y^\varepsilon = \inf\{t \geq 0 : X^\varepsilon(t) = y\} \quad \text{transition time}$$

Thm 1 (Freidlin, transition law)
for all δ

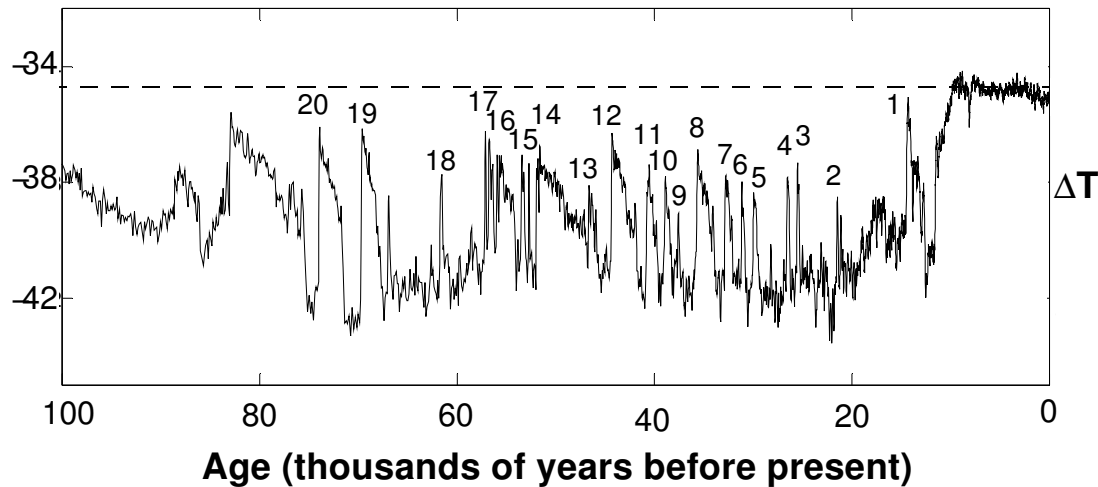
$$\mathbf{P}_x \left[\exp \left(\frac{V(x, y) - \delta}{\varepsilon^2} \right) \leq \tau_y^\varepsilon \leq \exp \left(\frac{V(x, y) + \delta}{\varepsilon^2} \right) \right] \xrightarrow{\varepsilon \rightarrow 0} 1$$

interprets **Kramers-Eyring law:** $E_x(\tau_y^\varepsilon) \sim \exp\left(\frac{V(x, y)}{\varepsilon^2}\right)$

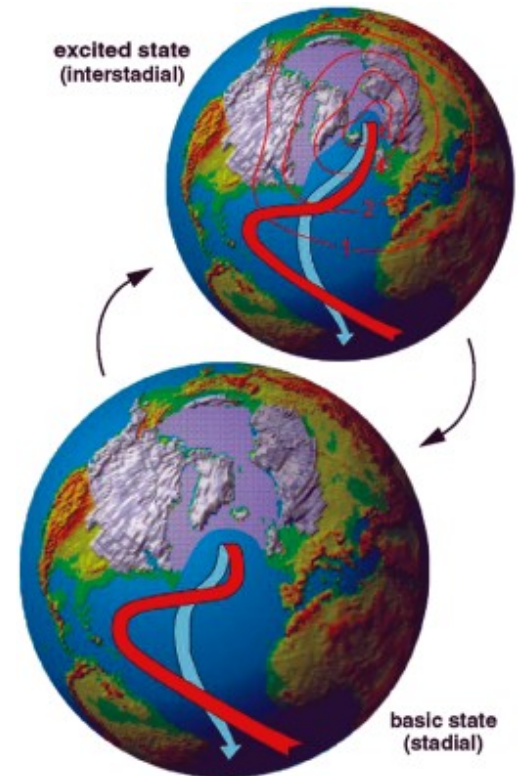
7. Dansgaard-Oeschger events

temperature indicators: ^{18}O , ^{16}O , methane, calcium etc.

GRIP ice core data: 20 abrupt changes in climate of Greenland during last ice age (-91 000 to -11 000 y) (D/O events).



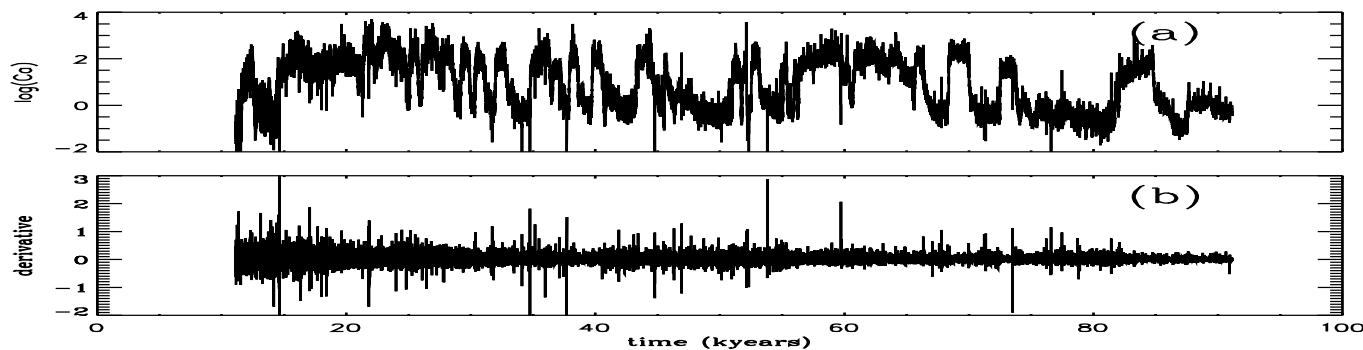
- rapid warming by $5\text{-}10^\circ\text{C}$ within one decade
- subsequent slower cooling within a few centuries
- fast return to stable cold ground state



simulations: Ganopolsky/Rahmstorf,
Potsdam Institute for Climate Impact
Research

8. Dansgaard-Oeschger events. Statistical analysis

Calcium signal from GRIP: about 80 000 samples for 80 000 y



typical waiting time between D/O events: 1000 – 2000 y,
waiting times between D/O events: multiples of ~ 1470 years.

What triggers the transitions?

modeling by Langevin equation:

$$dX(t) = -U'(t, X(t))dt + \text{NOISE}$$

U — multi well potential, wells correspond to climate states

P. Ditlevsen (*Geophys. Res. Lett.* 1999): power spectrum analysis of time series:

NOISE contains strong α -stable component with $\alpha \approx 1.75$.

9. Simple system with Levy noise

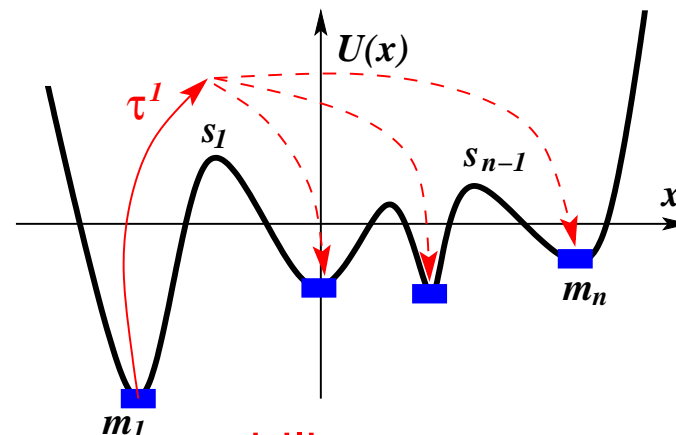
consider **SDE driven by α -stable Lévy noise** of small intensity

$$X^\varepsilon(t) = x - \int_0^t U'(X^\varepsilon(s-)) ds + \varepsilon L(t), \quad \varepsilon \downarrow 0.$$

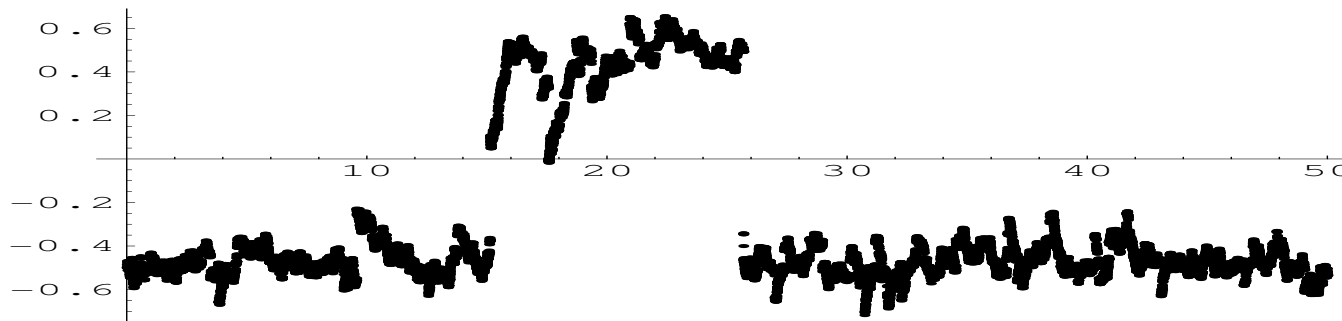
- L is α -stable symmetric Lévy process, $\alpha \in (0, 2)$

multi well potential U

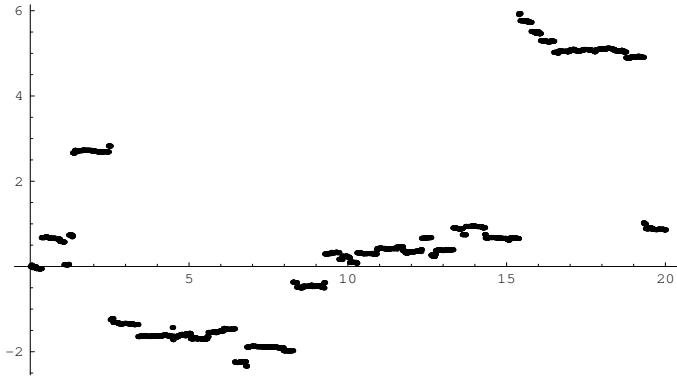
- n local minima m_i
- $n - 1$ local maxima s_i
- $U''(m_i) > 0, U''(s_i) < 0$



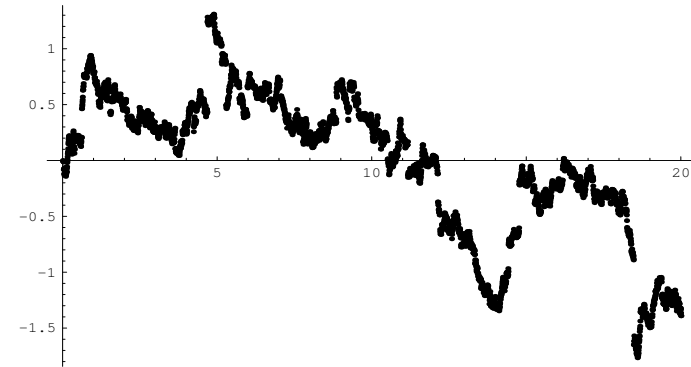
aim: investigate **exit and transition rates, meta-stability.**



10. The symmetric α -stable Lévy process L



$$\alpha = 0.75$$



$$\alpha = 1.75$$

Lévy measure $\nu(dy) = \frac{dy}{|y|^{1+\alpha}}$, trajectories have countably many (small) jumps on finite time interval, jump times dense.

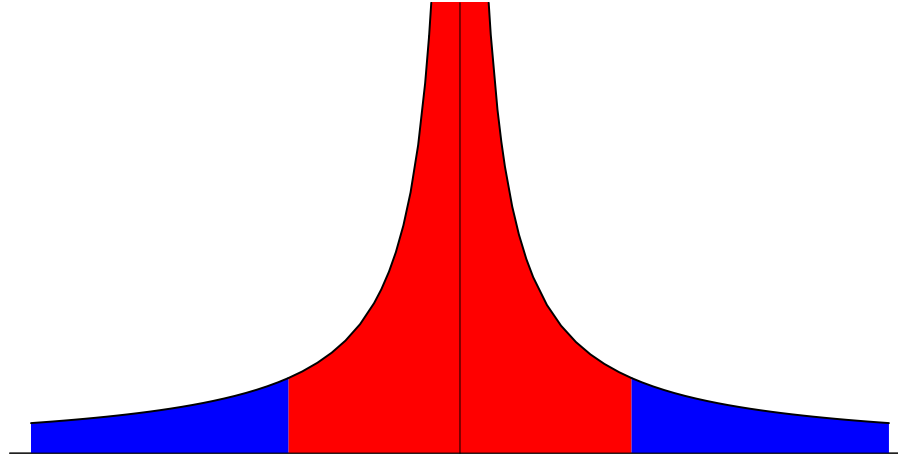
$$\mathbf{E}e^{i\lambda L(t)} = \exp\{-c(\alpha)|\lambda|^\alpha t\}, \quad c(\alpha) = 2 \int_0^\infty \frac{1 - \cos y}{y^{1+\alpha}} dy.$$

$\alpha = 1$	Cauchy process	$\frac{1}{\pi} \frac{1}{1+x^2}$
$\alpha = 2$	Brownian motion	$\frac{1}{\sqrt{2\pi}} e^{-\frac{x^2}{2}}$

In physics: *anomalous diffusion* or *Lévy flights*

11. Probabilistic approach of exit times

$$L(t) = \xi^\varepsilon(t) + \eta^\varepsilon(t)$$



$$\nu_\xi^\varepsilon = \nu|_{[-\frac{1}{\sqrt{\varepsilon}}, \frac{1}{\sqrt{\varepsilon}}]},$$

$$\nu_\eta^\varepsilon = \nu|_{[-\frac{1}{\sqrt{\varepsilon}}, \frac{1}{\sqrt{\varepsilon}}]^c}$$

$$\nu_\xi^\varepsilon(\mathbb{R}) = \infty$$

$$\nu_\eta^\varepsilon(\mathbb{R}) = \frac{2}{\alpha} \varepsilon^{\alpha/2} = \beta_\varepsilon$$

$\varepsilon\xi^\varepsilon$ sum of ε -BM and **small jump** ($\leq \sqrt{\varepsilon}$) **process**

$\varepsilon\eta^\varepsilon$ **big jump** ($\geq \sqrt{\varepsilon}$) **compound Poisson process**

big jumps at τ_k , inter-jump time T_k with exponential law

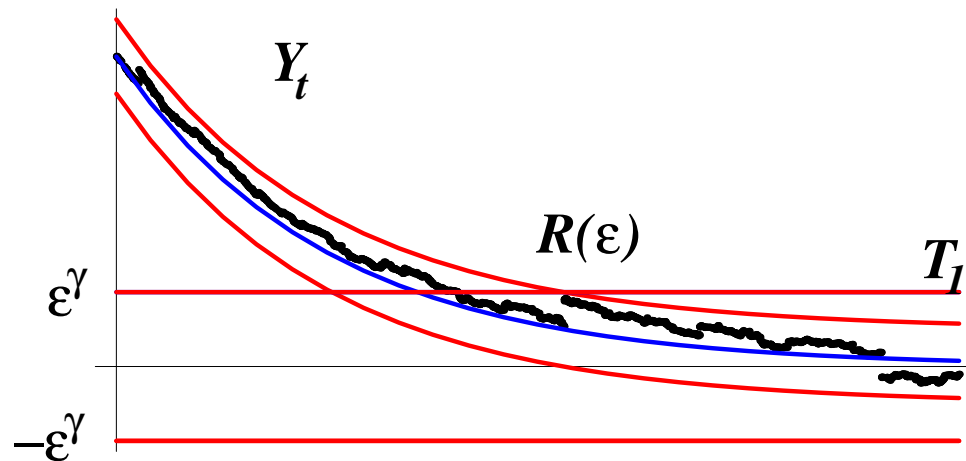
$$E(T_k) = (\beta^\varepsilon)^{-1} = \frac{\alpha}{2} \varepsilon^{-\alpha/2}$$

12. The small and large jump parts

U with **stable state 0**, exit from $[-b, a]$ for $a, b > 0$

between big jumps X^ε is Y perturbed by $\varepsilon\xi^\varepsilon$

$$X^\varepsilon(t) = x - \int_0^t U'(X^\varepsilon(s-)) ds + \varepsilon\xi^\varepsilon(t), \quad t \in [0, T_1), \quad Y(t) = x - \int_0^t U'(Y(s)) ds$$



deviation
$$\mathbf{P} \left(\sup_{[0, T_1)} |X^\varepsilon(t) - Y(t)| \geq \frac{\varepsilon^\gamma}{2} \right) \leq \mathbf{P} \left(\sup_{[0, T_1)} |\varepsilon\xi^\varepsilon(t)| \geq \frac{\varepsilon^\gamma}{C} \right) \leq e^{-1/\varepsilon^\delta}$$

relaxation
$$T(x, \varepsilon) = \int_{\varepsilon^{\gamma/2}}^x \frac{dy}{|U'(y)|} \approx \int_\delta^x \frac{dy}{|U'(y)|} + \int_{\varepsilon^{\gamma/2}}^\delta \frac{dy}{My}$$

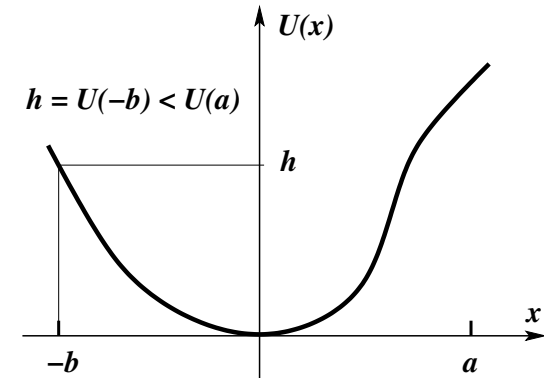
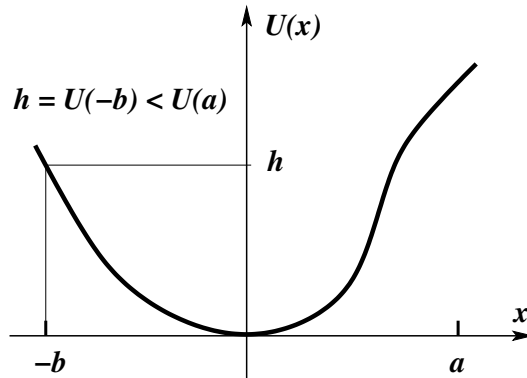
$$\approx \text{Const} + \frac{\gamma}{M} |\ln \varepsilon| \leq R(\varepsilon) = \mathcal{O}(|\ln \varepsilon|)$$

asymptotically, **big jumps** coincide with **exits**

13. Exit times: comparison of Gaussian and Lévy dynamics

$$\hat{\sigma} = \inf\{t \geq 0 : \hat{X}^\varepsilon(t) \notin [-b, a]\}$$

$$\sigma = \inf\{t \geq 0 : X^\varepsilon(t) \notin [-b, a]\}$$



$$\hat{X}^\varepsilon(t) = x - \int_0^t U'(\hat{X}^\varepsilon(s)) ds + \varepsilon W(t)$$

$$X^\varepsilon(t) = x - \int_0^t U'(X^\varepsilon(s-)) ds + \varepsilon L(t)$$

Thm 1 (Freidlin-Wentzell):

$$\mathbf{P}_x(e^{(2h-\delta)/\varepsilon^2} < \hat{\sigma} < e^{(2h+\delta)/\varepsilon^2}) \rightarrow 1$$

Thm 2

$$\mathbf{P}_x\left(\frac{1}{\varepsilon^{\alpha-\delta}} < \sigma < \frac{1}{\varepsilon^{\alpha+\delta}}\right) \rightarrow 1$$

Kramers' law ('40, Williams, Bovier et al.):

$$\mathbf{E}_x \hat{\sigma} \approx \frac{\varepsilon \sqrt{\pi}}{|U'(-b)| \sqrt{U''(0)}} e^{2h/\varepsilon^2}$$

$$\mathbf{E}_x \sigma \approx \frac{1}{\varepsilon^\alpha} \left(\int_{\mathbb{R} \setminus [-b, a]} \frac{dy}{|y|^{1+\alpha}} \right)^{-1}$$

Exponential law (Day, Bovier et al.)

$$\mathbf{P}_x\left(\frac{\hat{\sigma}}{\mathbf{E}_x \hat{\sigma}} > u\right) \sim \exp(-u)$$

$$\mathbf{P}_x\left(\frac{\sigma}{\mathbf{E}_x \sigma} > u\right) \sim \exp(-u)$$

14. p -Variation as test statistic

Ditlevsen's analysis: power spectrum of residua of time series

Problem: Stationarity?

Aim: better test statistics than peaks of power spectrum.

Model assumption: with some U interpret data as

$$X^\varepsilon(t) = x - \int_0^t U'(X^\varepsilon(s-)) ds + \varepsilon L(t) = Y^\varepsilon(t) + L^\varepsilon(t)$$

L Lévy process containing α -stable component with unknown α , Y^ε of bounded variation; test α

Idea: p -variation characteristic for fluctuation behavior of noise processes.

$$V_t^{p,n}(X) = \sum_{i=1}^{[nt]} \left| X\left(\frac{i}{n}\right) - X\left(\frac{i-1}{n}\right) \right|^p, \quad V_t^p = \lim_{n \rightarrow \infty} V_t^{p,n}$$

15. Stable Processes and their p -Variation

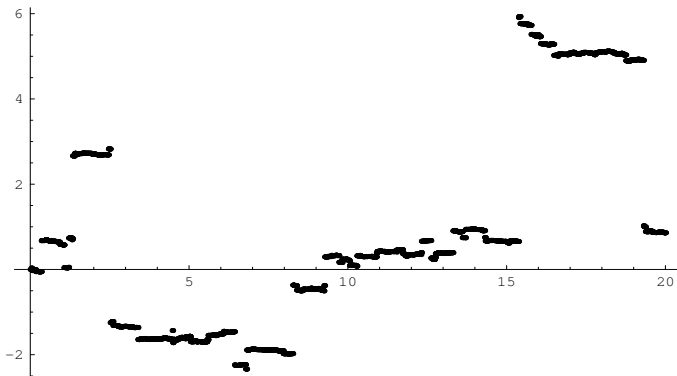
L Lévy process with characteristics (d, γ, ν) iff

$$E(\exp(iuL(t))) = \exp\left(t\left(-\frac{1}{2}du^2 + i\gamma u + \int_{\mathbf{R}} [e^{iuy} - 1 - iuy1_{\{|y|\leq 1\}}] \nu(dy)\right)\right), \quad u \in \mathbf{R}, t \geq 0,$$

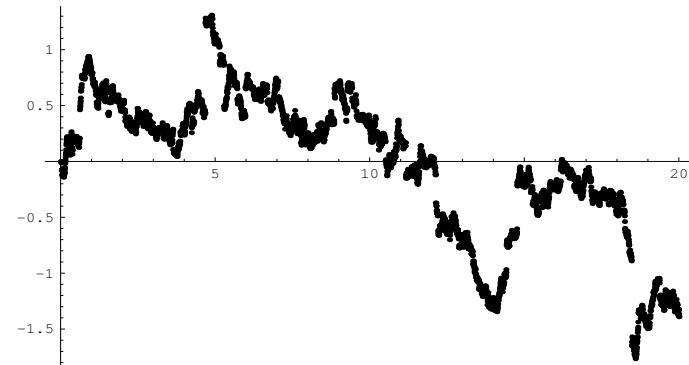
ν measure on Borel sets in \mathbf{R} with $\nu(\{0\}) = 0$, $\int_{\mathbf{R}} [|y|^2 \wedge 1] \nu(dy) < \infty$.

L α -stable symmetric Lévy process if

$$E(\exp(iuL(t))) = \exp(-c(\alpha)t|u|^\alpha), \quad \nu(dy) = \frac{1}{|y|^{\alpha+1}} dy, \quad u, y \in \mathbf{R}.$$



$\alpha = 0.75$



$\alpha = 1.75$

16. p -Variation and the Blumenthal-Gettoor Index

L α -stable process with jump measure ν ; then p -variation identified by
Blumenthal-Gettoor index

$$\beta_L = \inf\{s \geq 0 : \int_{\{|y| \leq 1\}} |y|^s \nu(dy) < \infty\}$$

$$\gamma_L = \inf\{p > 0 : V_1^p(L) < \infty\}$$

Thm 1

L symmetric α -stable. Then

$$\gamma_L = \beta_L = \alpha.$$

Problem: How to read $\gamma_L = \alpha$ off the sequence $(V_t^{p,n}(L))_{n \in \mathbb{N}}$?

Calls for results about the asymptotic behavior of the sequence.

17. The case $\alpha = 2$: Brownian motion

For $n \in \mathbf{N}$ $V_1^{p,n}(W)$ consists of n independent increments and

$$E(V_1^{p,n}(W)) = n^{1-\frac{p}{2}} E(|W(1)|^p)$$

Thm 2 (LLN type)

$$n^{-1+\frac{p}{2}} V_t^{p,n}(W) \rightarrow t E(|W(1)|^p) \quad \text{in probability,}$$

Y of bounded variation. Then also

$$n^{-1+\frac{p}{2}} V_t^{p,n}(W + Y) \rightarrow t E(|W(1)|^p) \quad \text{in probability.}$$

Thm 3 (CLT type)

$$\begin{aligned} (n^{\frac{1}{2}} [n^{-1+\frac{p}{2}} V_t^{p,n}(W) - t E(|W(1)|^p)])_{t \geq 0} &= (n^{-\frac{1}{2}+\frac{p}{2}} V_t^{p,n}(W) - n^{\frac{1}{2}} t E(|W(1)|^p))_{t \geq 0} \\ &\rightarrow ((\text{var}(|W(1)|^p))^{\frac{1}{2}} \tilde{W}(t))_{t \geq 0} \end{aligned}$$

weakly with respect to the Skorokhod metric, and an independent Brownian motion \tilde{W} .

18. The case $\alpha < 2$

(Lit: Corcuera, Nualart, Wörner '07; case $p < \alpha$ for LLN type, $p < \frac{\alpha}{2}$ for CLT type)

Problem: $p < \frac{\alpha}{2} < 1$ not satisfactory for **paleo-climatic data!** Beyond $\frac{\alpha}{2}$ no CLT type result available, no asymptotic normality, but **asymptotically of different type.**

Thm 4 (LT type)

L α -stable with $\alpha \in]0, 2[$. Then

$$(V_t^{p,n}(L) - B_t^n(\alpha, p))_{t \geq 0} \rightarrow \tilde{L}$$

weakly with respect to the Skorokhod metric, and an **independent $\frac{\alpha}{p}$ -stable process \tilde{L} .** Here

$$B_t^n(\alpha, p) = \begin{cases} n^{1-\frac{p}{\alpha}} t E(|L(1)|^p), & \frac{\alpha}{2} < p < \alpha, \\ nt^2 E(\sin((nt)^{-1} |L(1)|^p)), & p = \alpha, \\ 0, & \alpha < p. \end{cases}$$

Same result with $L + Y$ instead of L if Y is of finite p -variation and $\frac{\alpha}{2} < p < 1$ or $p > \alpha$.

19. Methods of Proof

- show that $(|L(n) - L(n-1)|^p)_{n \in \mathbf{N}}$ is in **domain of attraction of $\frac{\alpha}{p}$ -stable law**; use tails and characteristic functions

- use **Aldous' criterion for tightness of sequence $(X^n)_{n \in \mathbf{N}}$** in Skorokhod metric:

$$(i) \lim_{K \rightarrow \infty} \sup_{n \in \mathbf{N}} P(\sup_{t \geq N} |X^n(t)| > K) = 0 \quad \text{for all } N \geq 0,$$

$$(ii) \lim_{\theta \downarrow 0} \limsup_{n \rightarrow \infty} \sup_{S \leq T \leq S + \theta} P(|X^n(T) - X^n(S)| \geq \varepsilon) = 0, \quad \text{for all } N \geq 0, \varepsilon > 0$$

S, T stopping times

- adding **processes of smaller variation**: new notion of Lipschitz continuity on large sets; comparison of small and large jumps