



**The Abdus Salam  
International Centre for Theoretical Physics**



**2265-20**

**Advanced School on Understanding and Prediction of Earthquakes and  
other Extreme Events in Complex Systems**

*26 September - 8 October, 2011*

**Multi-Parametric Description of Earthquake Sequences**

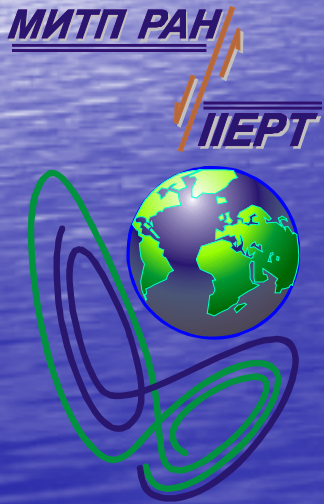
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# Multi-Parametric Description of Earthquake Sequences



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The Abdus Salam ICTP  
Miramare ♦ 27/09/2011

Advanced School on Understanding and Prediction of Earthquakes and  
other Extreme Events ♦ Adriatico GH Kastler Lecture Hall ♦ 11:10-12:00

**И.М. Гельфанд**

**ДВА АРХЕТИПА В ПСИХОЛОГИИ ЧЕЛОВЕЧЕСТВА**

1989 Лекция при вручении премии INAMORI FOUNDATION

(Киото, Япония)

Izrail M. Gelfand, Two archetypes in the psychology of Man. Nonlinear Sci. Today 1 (1991), no. 4, 11

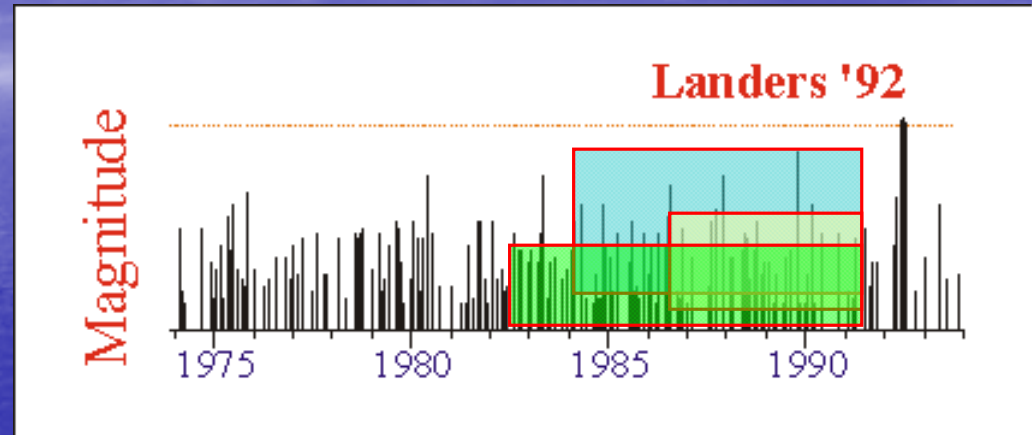
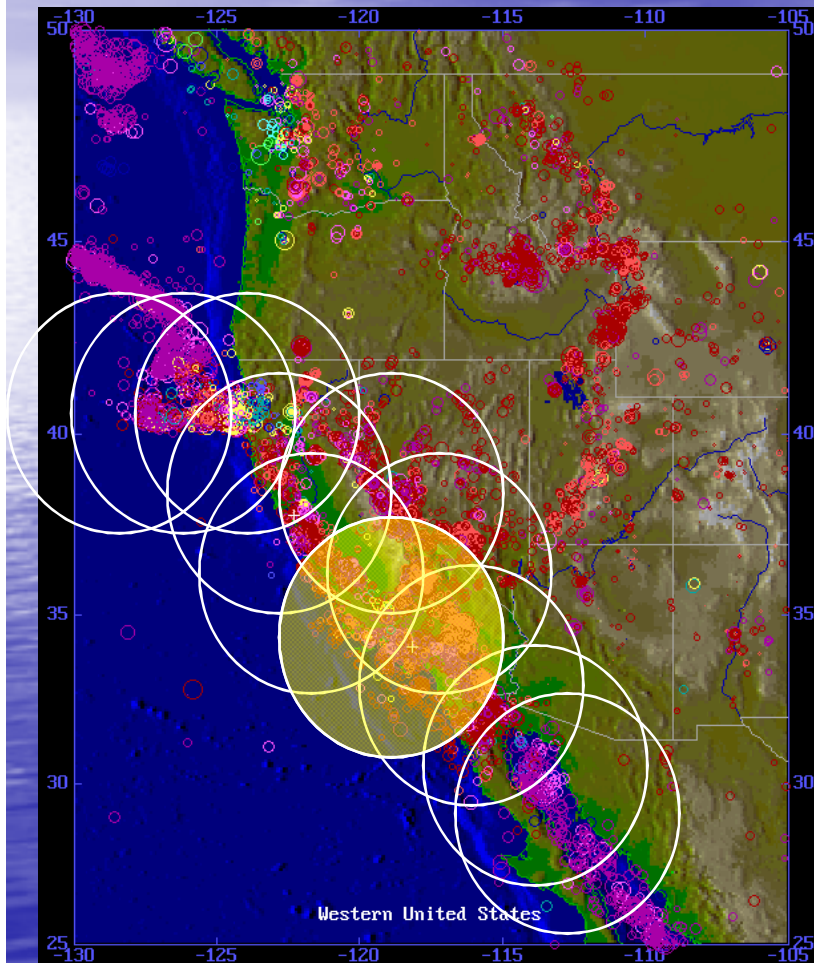


**Izrail Moiseevich Gelfand  
(1913-2009)**

Mathematics is one of the highest achievements of the human spirit and at the same time, a very accurate and adequate language, without which the physics and many other fields would have been impossible. And the first side of liability of mathematicians is of using the experience and achievements of mathematics, especially mathematics of XX century, to expand significantly an opportunity for creating adequate languages in other branches of science. First and foremost, to help in identifying the structures and, if possible, to develop an adequate language for living systems - various areas of biology, economics, psychology, etc.



# General scheme



↓  
 $F(t)$

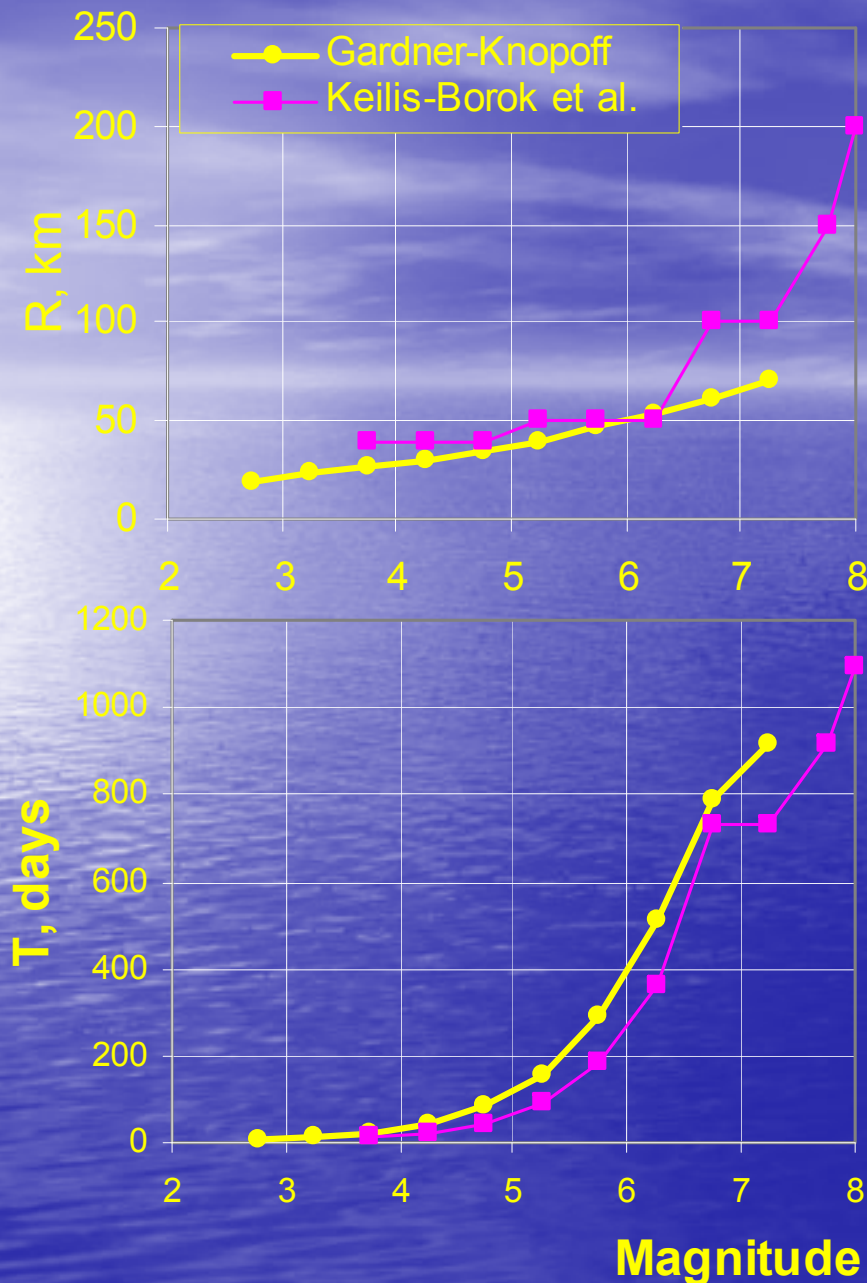
# The general scheme, as applied today (e.g., in existing earthquake prediction algorithms)

- Is restricted to seismic data and remains open to other relevant observations.
- Reduces information on spatial correlations at scales exceeding the linear dimension of an area of investigation in course independent analysis of sampled areas.
- Uses simple (if not oversimplified) and natural counts as descriptors.

# Earthquakes or main shocks?

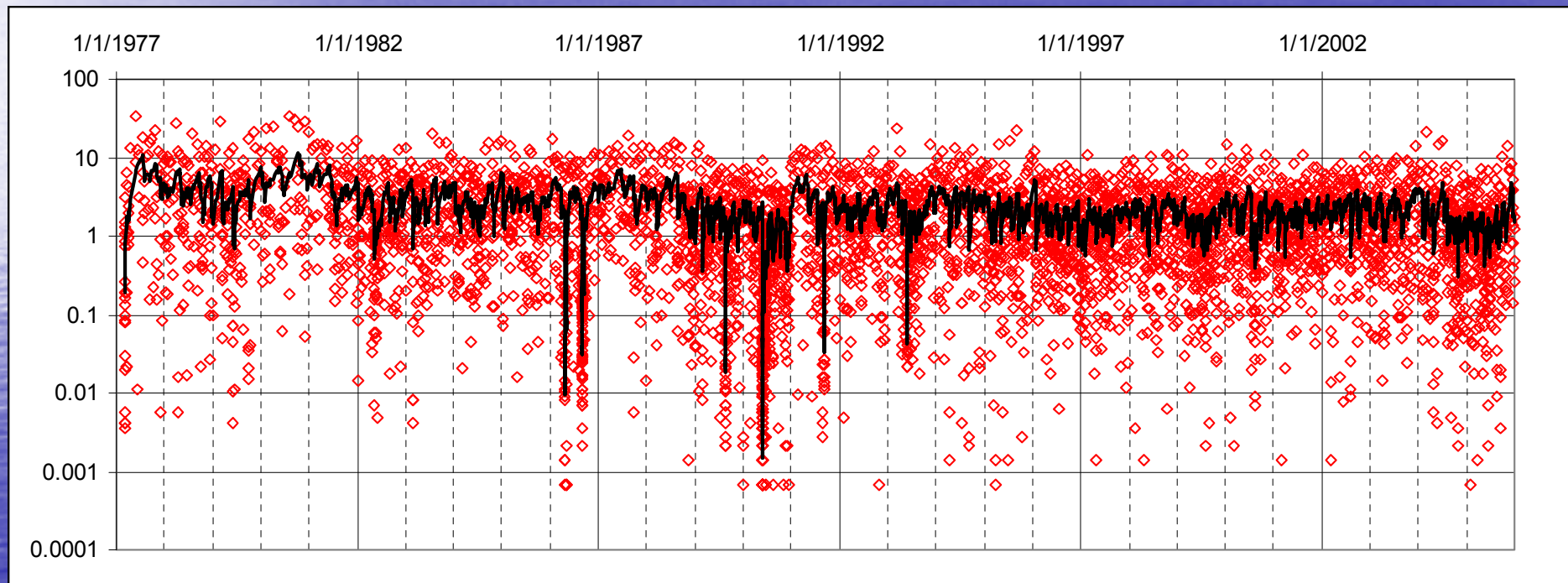
Earthquakes cluster in space and time and aftershocks of a single event may obscure characterization of seismic dynamics in the area of investigation. To avoid it aftershocks should not be counted when simple counts are derived from a given sequence of earthquakes.

Algorithms that de-cluster earthquake catalogs exist (although are far from the ideal).

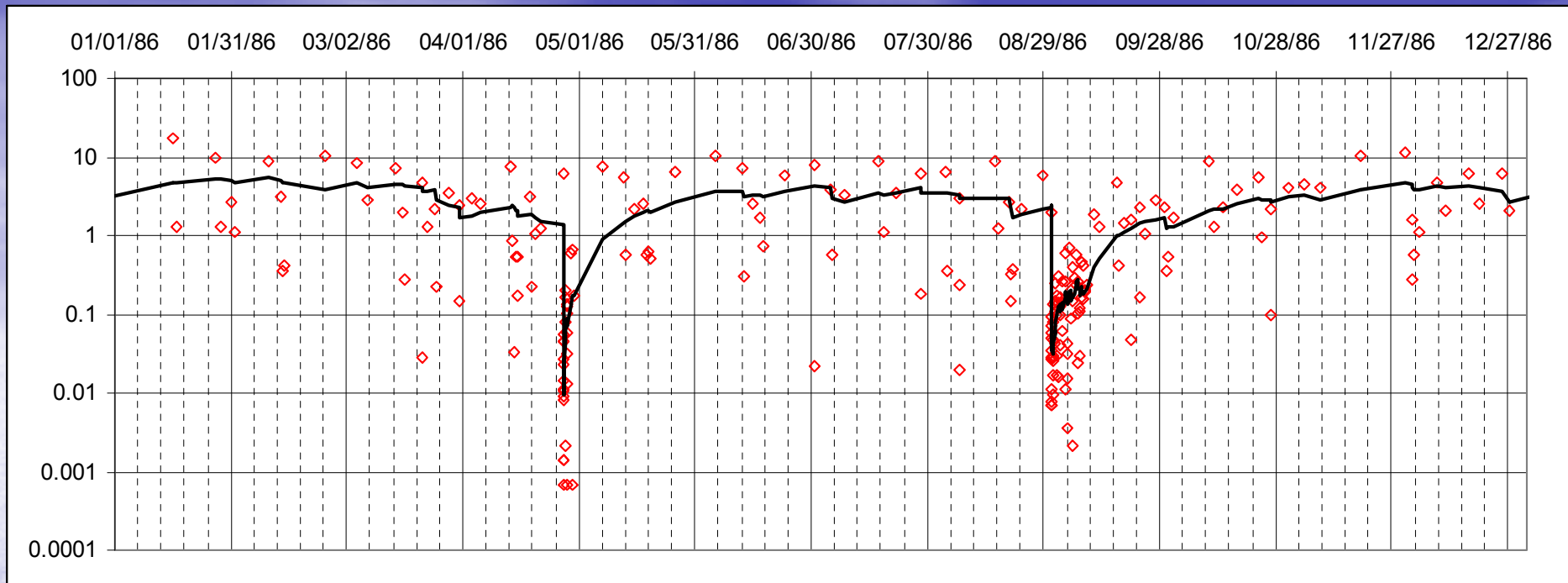




# ROMPLUS catalog of earthquakes (Vrancea region, Romania): Inter-event Time vs. Time (M2.5+, 1977-2005)



Black line marks 10 events trailing average



The local inter-event times after strong, moderate, and light earthquakes in Vrancea, when analyzed in detail, suggest shorter time span for aftershock sequences:

i.e., 2 days for M2.5-5.0, 4 days for M5.0-5.5, 8 days for M5.5-6.0,  
16 days for M6.0-6.5, 32 days for M6.5-7.0, 64 days for M7.0-9.0.

These limits resulted about 70% of M2.5+ events as mainshocks

(doubling of the limits for  $M > 4.5$  does not change much - comes with 68%)

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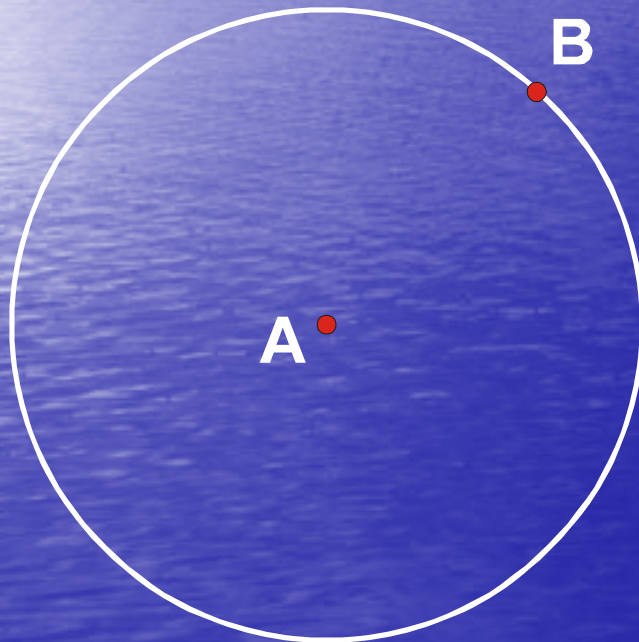
# An Alternative to Aftershocks:

An innovative approach aimed at better understanding earthquake sequences and their scaling properties, in particular, is suggested by

Jörn Davidsen, Peter Grassberger, Maya Paczuski

in **Earthquake recurrence as a record breaking process**

GEOPHYSICAL RESEARCH LETTERS, VOL. 33, L11304, doi:10.1029/2006GL026122, 2006



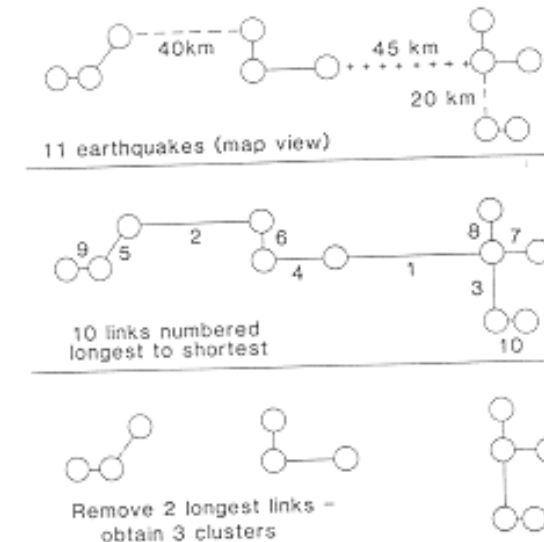
## 2. Method

The key advance we propose is to generalize the notion of a subsequent event to a record breaking event, one which is closer in space than all previous ones, up to that time. Consider a pair of events,  $A$  and  $B$ , occurring at times  $t_A < t_B$ . Earthquake  $B$  is a recurrence of  $A$  – or record with respect to  $A$  – if no intervening earthquake happens in the spatial disc centered on  $A$  with radius  $\overline{AB}$  during the time interval  $[t_A, t_B]$ . Each recurrence is characterized by the distance  $l = \overline{AB}$  and the time interval  $T = t_B - t_A$  between the two events. Since the spatial window is centered on the first event, any later recurrence to it is closer in space than all previous ones, and for that reason constitutes another record breaking event.<sup>1</sup> This gives rise to a hierarchical cascade of recurrences, where each recurrence is, by construction, a record. Note that each earthquake has its own sequence of records or recurrences that follow it in time.

# Single Link Cluster Analysis

Frohlich and Davis (1990) introduced SLC technique as a method to evaluate spatial and temporal properties of earthquake catalogues.

The SLC problem depends critically on the definition of distance between elements in a set, e.g., 3-D Euclidean or 4-D Einstein type ones.



**Figure 1.** Explanation of linkage and  $d$ -km clustering in single-link cluster analysis (SLC). Let each of the 11 earthquakes (circles) shown in map view be linked to its nearest neighbour (solid lines in top diagram), then let each group formed in this way be linked to its nearest neighbouring group, etc., (dashed and + + + lines) until all 11 events are joined by 10 links. If the two links larger than 20 km are removed (links 1 and 2 in middle diagram), the remaining linked groups form three 20-km clusters (bottom diagram). Within each 20-km cluster all events are within 20 km of another event in the cluster, and no events are within 20 km of any event in the other clusters. In general, for  $N$  events there will be  $N - 1$  links, and  $k + 1$  clusters will be formed when the  $k$  longest links are removed. If  $d_k$  and  $d_{k+1}$  are the lengths of the  $k$ th and  $(k + 1)$ th longest links, then the corresponding  $k + 1$  clusters are  $d$ -clusters for all  $d$  such that  $d_k > d > d_{k+1}$ .

# Single Link Cluster Analysis

“SLC provides a framework for arbitrary dividing our data into any number of clusters, or defining  $d$ -clusters for an arbitrarily chosen value of  $d$ . However, is there a particular number of clusters, or a particular value of  $d$  which is ‘natural’ for our data?”

Ask this question and find a positive confirmation before interpreting SLC-obtained results as

- naturally linked regionalization or
- adequately de-clustered data or
- representative of correlation length, etc.



# Counts on earthquake sequence

Thus, after reduction of space an earthquake sequence is denoted either as

$$\{t_i, m_i\} \text{ or } \{t_i, m_i, b_i(e)\},$$

where  $b_i(e)$  is the number of aftershocks attributed to the  $i$ -th main shock in the period from  $t_i$  to  $t_i - e$ .

Note that the number of aftershocks,  $b_i(e)$ , *per se* is one of the parameters of main shocks  $\{i\}$  inherited after de-clustering of a given earthquake catalog.

# Functions of seismic activity rate

$N(t | m, s)$  - the number of earthquakes

with  $M \geq m$  in time interval from  $(t-s)$  to  $t$ , i.e.,  
the number of events of certain size per unit  
time, *rate of activity*.

A dual function is the time that accommodates the  
most recent  $n$  events with  $M \geq m$ ,

$TI(t | m, n)$ .

# Function K

The increment of activity expressed by the difference between the number of earthquakes in the two successive intervals of time  $(t-s, t)$  and  $(t-2s, t-s)$

$$K(t | m, s) = N(t | m, s) - N(t-s | m, s)$$

has a physical meaning of *acceleration*.



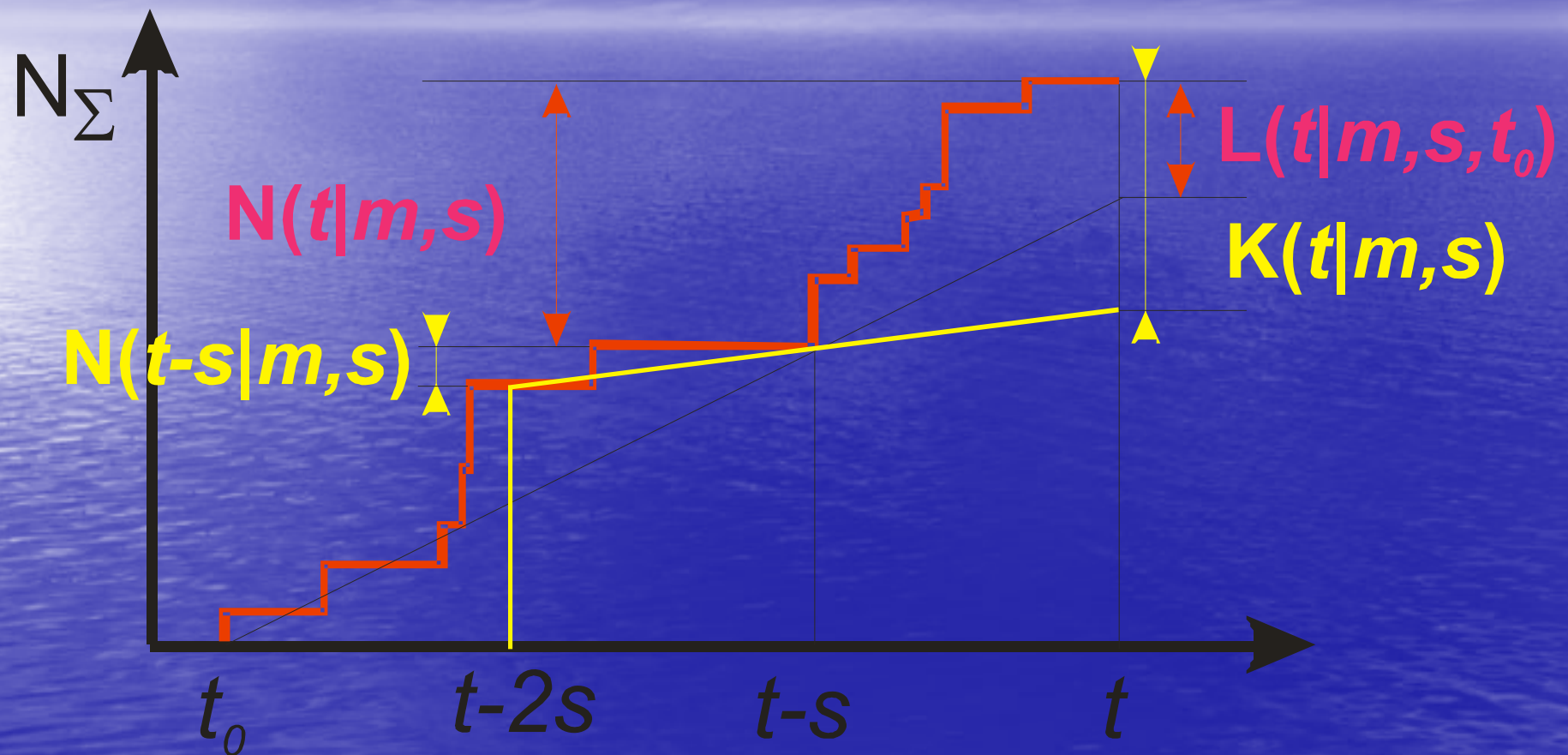
# Function L

$L(t \mid m, s, t_0)$  - deviation of activity from a longer-term trend over the period from  $t_0$  to  $t$ .

$$L(t \mid m, s, t_0) = N(t \mid m, s) - N(t-s \mid m, t-s-t_0) \times s/(t-s-t_0)$$

Usually  $t_0$  is the beginning of the catalog unless its duration allows to use a pre-fixed trailing window  $t-t_0 \gg s$  to characterize a longer-term *differential* of seismic activity rate (e.g., since the beginning of the new millennium  $t-t_0 = 5s$  in the on-going Global Test of M8 algorithm).

# Functions of activity



# The necessity of trailing $t_0$ in function $L$

When  $t_0$  becomes far from  $t$  (which is the inevitable case of all long lasting experiments), the longer-term rate  $L$  tends to a constant. Therefore, to preserve a physical meaning of the rate differential one should use the definition of  $L$  with a trailing  $t_0$ . This might be of crucial importance when catalogs of extended times are considered (e.g., in model catalogs).



$$\Sigma(t)$$

$\Sigma(t|m, M', s, \alpha, \beta)$  is the weighted number of earthquakes in time interval from  $(t-s)$  to  $t$  and magnitude  $(m \leq M_i < M')$ :

$$\Sigma(t|m, M', s, \alpha, \beta) = \sum 10^{\beta(M_i - \alpha)}$$

This function may estimate different properties depending on the choice of  $\beta$ .

With B from the relation between energy E  
and magnitude M -  $\log E = A + BM$  -  
 $\Sigma$  is proportional to

- the total linear size of earthquake sources  
if  $\beta = B/3$
- the total area of the earthquake sources  
if  $\beta = 2B/3$
- the total energy of earthquakes  
if  $\beta = B$
- the Benioff strain release  
if  $\beta = B/2$

# Normalized counts of $\Sigma(t)$

- Averages –

$$\Sigma(t)/N(t)$$

- Concentrations –

$$(\Sigma(t)/N(t)) / (N(t))^{-d/3}$$

where  $d$  is concentration dimension and  $\beta = d \cdot B/3$



# Function G

The ratio of the number of earthquakes from two magnitude ranges –

$$G(t | m_1, m_2, s) = 1 - N(t | m_2, s) / N(t | m_1, s)$$

- The values  $m_1$  and  $m_2$  may result from inspecting the frequency-magnitude statistics of earthquakes.

# An alternative to G: Function G'

The logarithm of the ratio of the number of earthquakes from two magnitude ranges normalized to difference of magnitudes –

$$G'(t | m_1, m_2, s) = \frac{\log( N(t | m_2, s) / N(t | m_1, s) )}{(m_2 - m_1)}$$

In such a definition G' is the tangent of the slope of the frequency-magnitude graph.

Another alternative of this kind is the trailing average magnitude,  $\sum m_i / N$ .

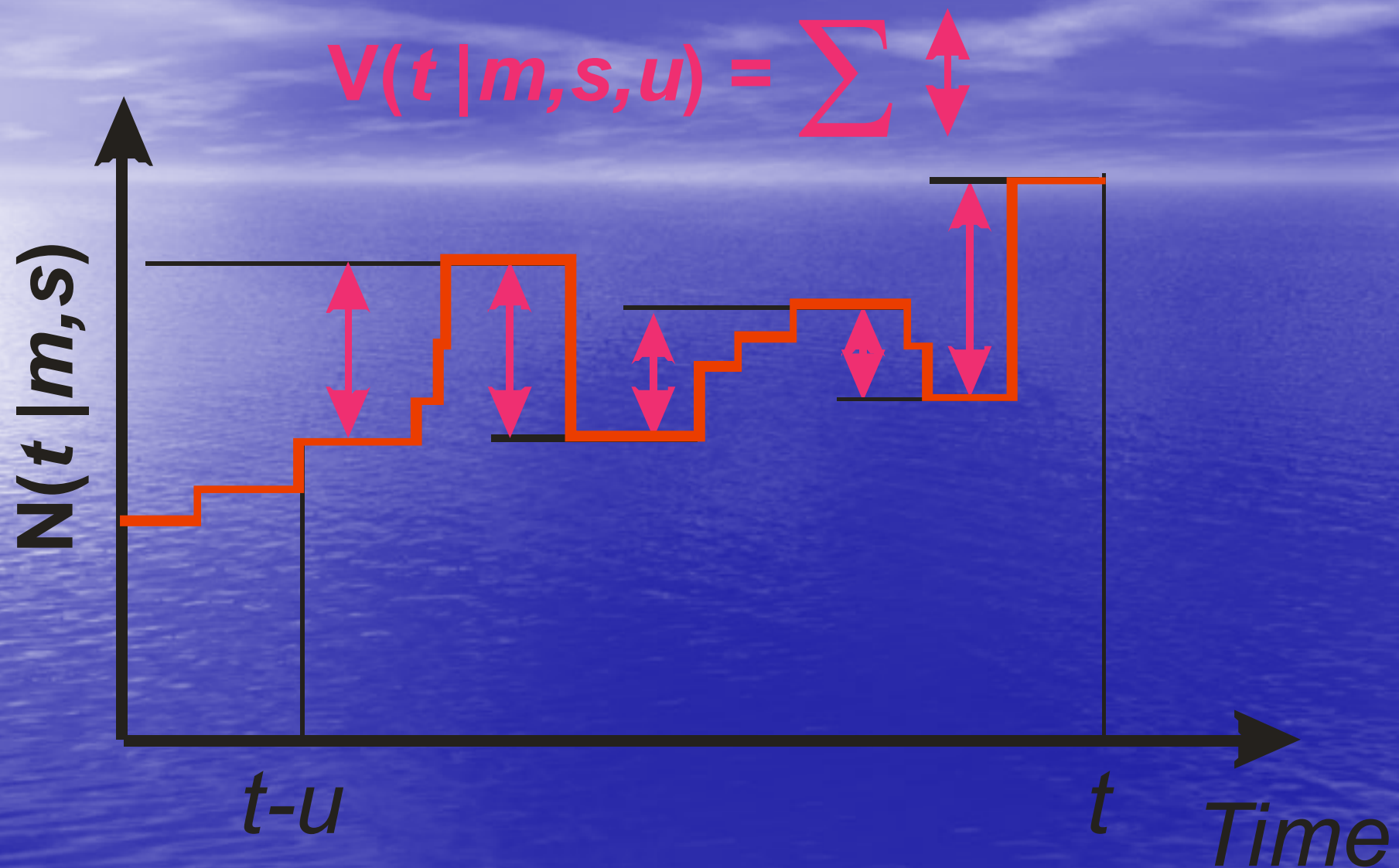
# Variation of seismic activity

$V(t \mid m, s, u) = \text{var } N(t \mid m, s)$  is variation of the number of earthquakes on the time interval  $(t-u, t)$ ,

$$\text{var } N(t \mid m, s) = \sum | N(t_i \mid m, s) - N(t_{i+1} \mid m, s) |$$

which is the total of the absolute differences between  $N(t \mid m, s)$  at two consecutive times  $t_{i+1}$  and  $t_i$  from the time interval  $(t-u, t)$ .

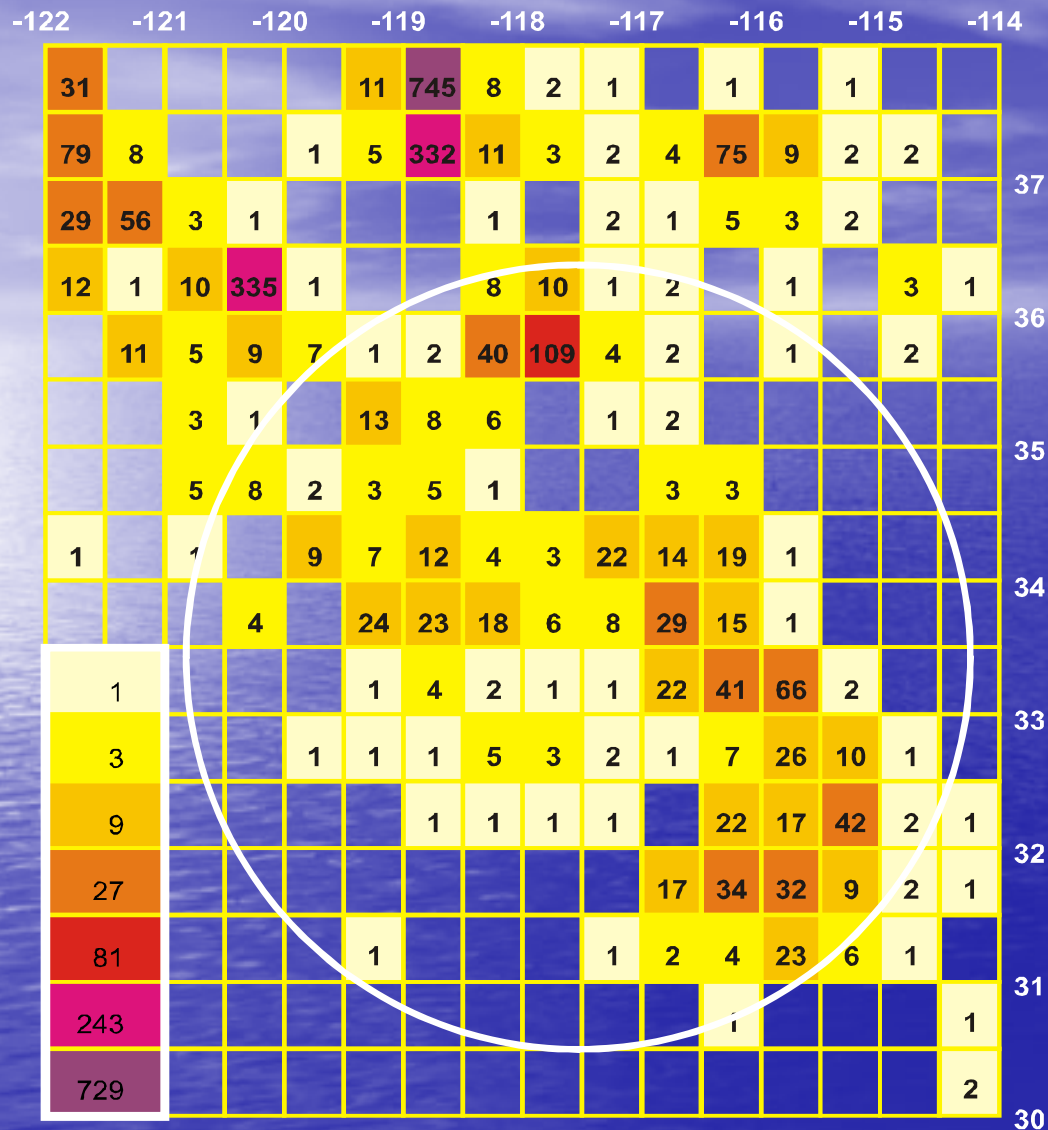




# Clustering of earthquakes

In case of de-clustered catalogs each main shock has its number of aftershocks,  $b_i(e, m_{\text{aft}})$ , of magnitude  $M \geq m_{\text{aft}}$  in the first  $e$  days after its origin time  $t_i$ .

$B(t \mid m, M', s, m_{\text{aft}}, e) = \max b_i(e, m_{\text{aft}})$  is the maximum calculated over the main shocks with  $m \leq M_i < M'$  and time interval  $(t-s, t)$ .



**Earthquakes are not distributed uniformly.**

Heterogeneity of seismic distribution can be measured providing additional characterization of the area under investigation

Coarse-grained number of magnitude 3 or larger earthquakes, 1980-1984 (USGS/NEIC GHDB).



# Entropies

Many other measures of clustering were proposed in the literature. For example, *Shannon entropy*

$$- \sum p_i \times \ln p_i$$

where  $p_i$  is some time dependent probability estimate of occupation of a given cell of the grid, i.e.,  $p_i = n_i/N$ .

It is the limit case ( $q \rightarrow 1$ ) of the Renyi's entropies

$$(1 - q)^{-1} \times \ln \sum p_i^q$$

which integrals  $\sum p_i^q$  provide a rather simple one-parameter family of measures of the observed clustering in space and time.

# Active zone size

Active zone size, AZS, is a measure of the extent to which seismic activity in a given region is diffused. Formally, it is  $\sum \mathbf{p}_i^q$  at  $q = 0$ . The premonitory efficiency of AZS was first observed in generalized Burridge-Knopoff models of fault.

AZS is more directly a measure of the broadening of small to moderate size events, which leads to development of a nucleation region associated with a coming large event.

# AZS in seismic regions

To measure active zone size in the Earth we might use a box counting algorithm, in which the large spatial regions will be subdivided into many smaller regions that contain seismic events of a certain magnitude level.

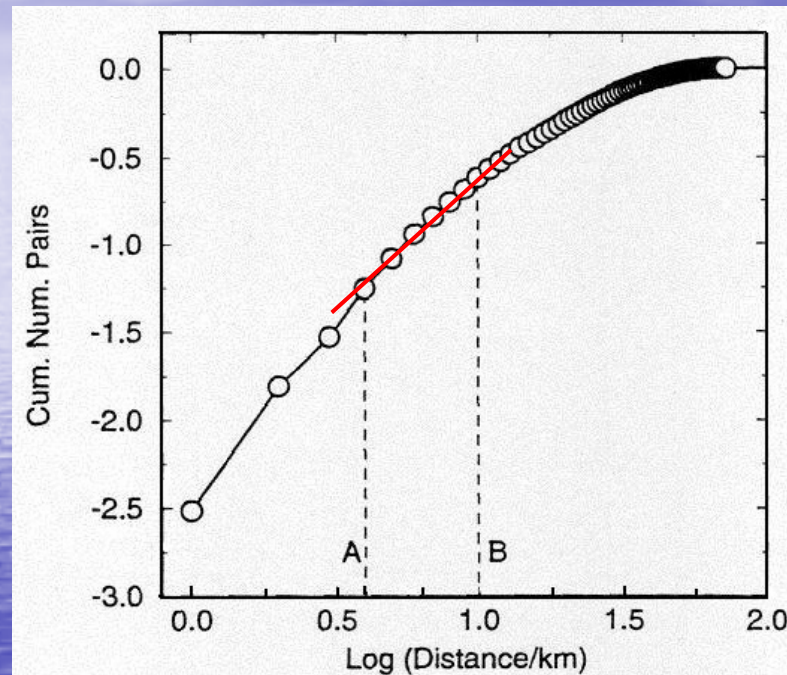
For example,  $AZS(t | m,s) = \sum \delta(n_i)$ ,

where  $\delta(x) = 0$ , if  $x = 0$  and  $\delta(x) = 1$ , if  $x > 0$ .

In the Earth this measure is somewhat more complex due to the variable complexity of faults networks in different regions.



# Spatial correlation dimension



$$C(R) = p(r < R)/P$$

where  $p(r < R)$  is the number of pairs separated by less than  $R$  km and  $P = N(N-1)/2$  is the total number of pairs for  $N$  events.

**The slope of the straight segment over distance range [A,B] is used to estimate the spatial correlation dimension  $CD = d_{[A,B]}$ .**

# Correlation dimension vs. Clustering

A correlation dimension is inversely related to the degree of spatial clustering, as the slope of the straight segment decreases when the number of event pairs with relatively small inter-event distances increases. Smaller values for CD indicate higher degrees of spatial clustering.

# Long-range interaction of earthquakes

- A. Prozorov (1982) introduced a term-less precursor, which follow shortly a major earthquake but on a large distance from it. He concluded that “long-range aftershocks” mark the location of a future major earthquake.
- The two new phenomena which represent the long-range correlation were found first on a synthetic catalogue.



# Average depth

Nadeau et al. (1995) suggested to use the average depth of hypocenters in a given time window claiming that deepening of seismic activity precede large earthquakes.

It is necessary to note however that the depth is one of the most inaccurate parameters of hypocenter determination: the error in depth may be large resulting seismologist attributed values in many cases.

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# Normalization

Samples used in the counts should be comparable in nature and in number.

That is why *normalization* of earthquake sequences is necessary to ensure adequate uniform application with the same set of adjustable parameters in regions of different seismic activity.



# Normalizing sequences: Magnitude cutoff

We recommend using the normalization of a sequence by an optional choice of the minimal magnitude cutoff  $M_{\min}$ , defined by one of the two conditions:

- $M_{\min} = M_0 - C,$

$C$  being a constant

- $M_{\min}$  derived from  $N(M_{\min}) = A$

$A$  being a constant rate of activity

# Normalizing counts: Percentile cutoff

The values of functions are normalized to their empirical probability distribution functions, that is performing a non-linear transformation of different ranges from different seismic environment to  $[0,1]$ .

# Normalizing time: Seismic natural time

The natural scale of time, in number of recurrent events, was explicitly introduced for earthquakes by S.Yu.Schreider (1990). Like  $TI(t | m, n)$ , which is dual to  $N(t | m, n)$ , values of other functions can be evaluated in time intervals that accommodate the most recent  $n$  events with  $M \geq m$ .





# Thank you!

"When sorrows come, they come not single spies, but in battalions"  
(William Shakespeare, 1564-1616)