



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



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**Advanced School on Non-linear Dynamics and Earthquake Prediction**

***28 September - 10 October, 2009***

**Fractal/Multifractal Description of Seismicity**

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Russia*



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and Earthquake Prediction*

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# FRACTAL/MULTIFRACTAL DESCRIPTION OF SEISMICITY

**Molchan G.M.**

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*Papers:* Molchan & Kronrod , 2005, Geophys. J. Int., **162**, 899-960  
2007, PAGEOPH, **164**, 75-96  
2009, Geophys. J. Int. (accepted)

## **MOTIVATION**

### **Contradictions in fractality:**

- Fractality is considered as a *physical* property of seismicity *but* its characteristics (fractal dimensions,  $d_q$ ) have little confidence;
- Correlation fractal dimension,  $d_2$ , dominates in applications, e.g.  $d=d_2$  in the relations
  - # { event of  $m>M$  in a box of size  $L$  }  $\propto 10^{-bM}L^d$ ,
  - # { inter-event time in a box of size  $L$  }  $\propto L^{-d}$

⇒ “mono” - or “multi” - fractality?  
the best  $d$ ?

- fractality & self-similarity  
Key question (usually out of discussion):  
the non-trivial range of scale ( $L_-$ ,  $L_+$ ),  $L_+/L_- \geq 10$ , in the scaling laws related to fractality?

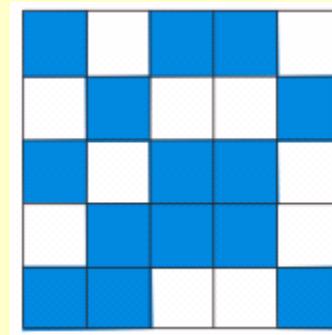
## ***Outline***

- Multifractality
  - the theoretical aspect
  - the empirical aspect
- Fractality of regional seismicity
- Scaling: inter-event time and seismicity rate

## Multifractality: theoretical aspect

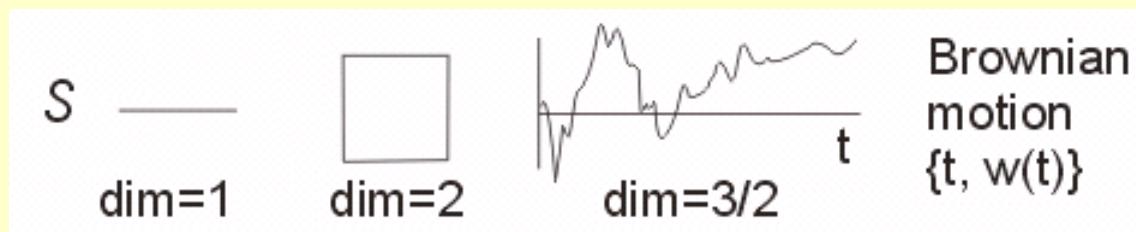
### Main notion

- *box-dimension* of set  $S$   
 $\{\square\}$  box-covering of  $S$   
 $\blacksquare$  box of size  $L, \Delta_L$



$$\dim_b(S) = \lim_{L \downarrow 0} \frac{\log \#\{\Delta_L\}}{\log L}$$

Examples:



- *seismicity measure* (main object of study):

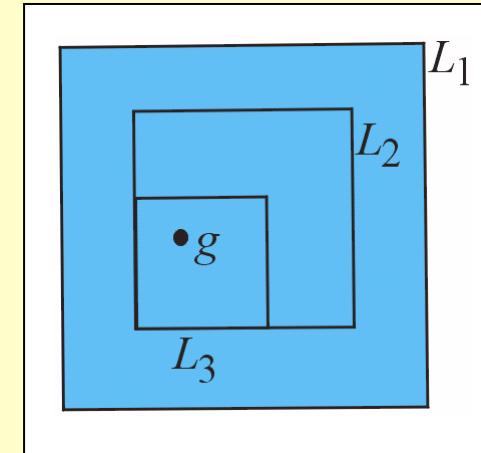
$\lambda(dg)$  = rate of  $m > m_c$  events in  
an elementary volume/area  $dg \subset G$

$\lambda$  reflects the clustering of events and complex fault system.

Therefore  $\lambda$  has singularities

- *Singularities* of  $\lambda(dg)$ :  $\alpha$ -type at  $g \in G$

$$\lambda(\Delta_L) = \int_{\Delta_L} \lambda(dg) \propto L^\alpha, \quad L \rightarrow 0, \quad g \subset \Delta_L$$



- *multifractal spectrum* of  $\lambda(dg)$ :  $\{\alpha, f(\alpha)\}$

$\alpha$  is  $\alpha$ -type singularity of  $\lambda(dg)$

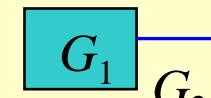
$f(\alpha) = \dim_b (S_\alpha)$ ,  $S_\alpha = \{g: \alpha\text{-type singularity point}\}$

*Trivial Example:*

$\lambda(dg)$ ,  $g \in G = G_1 \cup G_2$  has positive densities in

$G_1 = [0,1]^2$  and  $G_2 = [0,1]$

$(\alpha, f(\alpha)) = (2, 2); (1, 1); (\alpha, 0), \alpha \neq 1, 2$

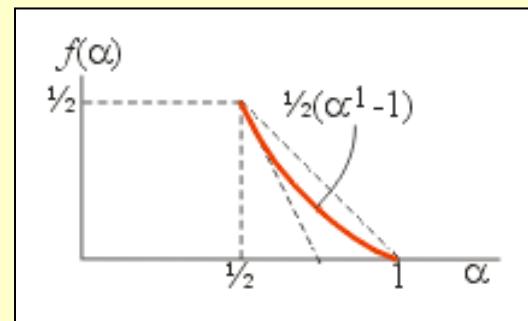


*Nontrivial example.* The model of sedimentation:

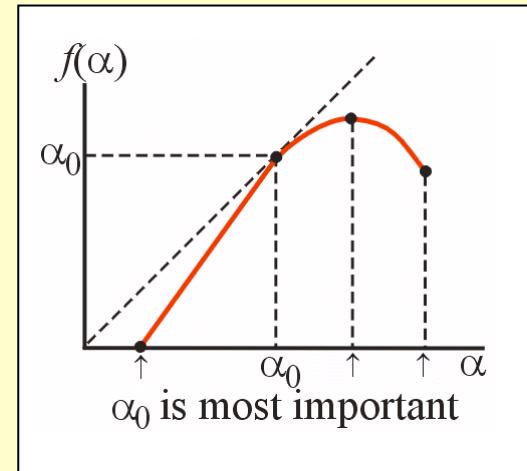
$$H(t) = \min_{s>t} \{as + w(s)\} \quad \text{thickness of sedimentary layers at time } t$$

$w(t)$ , Brownian motion

$$\lambda(dt) = dH(t)$$



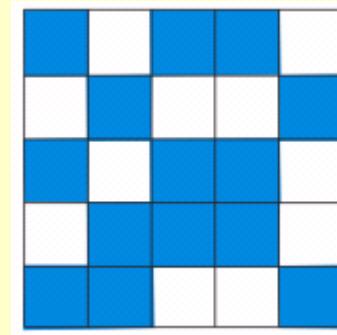
- *typical  $\alpha$ -singularity* of  $\lambda(dg)$ :  $\lambda(S_\alpha) > 0$   
 Young (1981):  $\alpha_0$  is typical  $\Rightarrow \alpha_0 = f(\alpha_0)$ ,  
     i.e.  $\alpha_0$  is fractal dimension  
 $\alpha$  is not typical  $\Rightarrow \alpha > f(\alpha)$ ,  $\lambda(S_\alpha) = 0$



- How to find  $(\alpha, f(\alpha))$  ?

Renyi function:

$$R_L(q) = \sum_{i: \lambda(\Delta_L^i) > 0} \left[ \frac{\lambda(\Delta_L^i)}{\lambda(G)} \right]^q$$



$\{\Delta_L^i\}$ , covering of  $G$

Multifractal case:  $\log R_L(q)$  vs  $\log L$  is linear for  $L \ll 1$

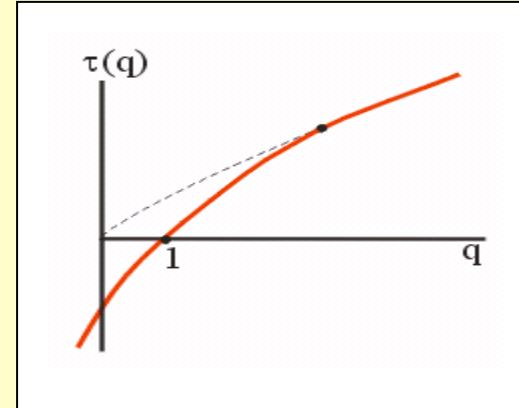
## Multifractal formalism:

$$\log R_L(q) \cong \tau(q) \log L \cdot (1 + o(1)), L \rightarrow 0$$

$$\tau(q) = \min_{\alpha} (q\alpha - f(\alpha)), \tau(1) = 0$$

If  $\tau(q)$  is strictly concave then

$$f(\alpha) = \min_q (q\alpha - \tau(q))$$

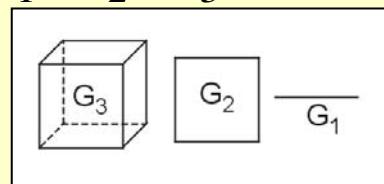


- $\{\tau'(q)\} \subset \{\alpha\}$ ,  $\{\tau'(q)\} = \{\alpha\}$  ( $\tau$ , strictly concave)

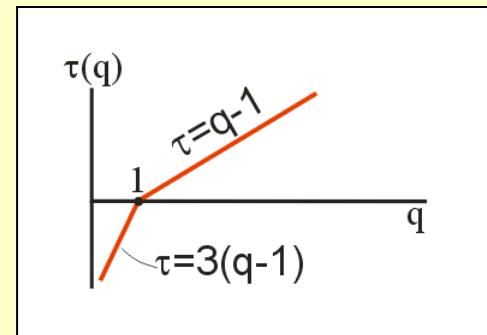
*Hint:*  $f(\alpha) = \min_q (q\alpha - \tau(q)) \Rightarrow q_{\min} : \alpha = \tau'(q_{\min})$

*Trivial example.*

$\lambda(dg)$  has densities in  $G_1, G_2, G_3$



$$\alpha = 3; 2; 1$$



$$\tau' = 1; 3$$

- **generalized dimensions** by Grasberger & Procaccia

$$d_q = \frac{\tau(q)}{q-1} = \frac{\tau(q) - \tau(1)}{q-1} = \tau'(q^*) \subset \{\alpha\} \quad d_1 = \lim_{q \downarrow 1} \frac{\tau(q)}{q-1} = \tau'(1)$$

$q^*$  is between  $q$  and 1

$\Rightarrow \{\tau'(q)\}$  and  $\{d_q\}$  are different parametrization of  $\{\alpha\}$

- $\tau'(q)$  and  $d_q$  are decreasing functions  $\Rightarrow d_q \leq d_0, q > 0$
- **typical singularity:**

$$\alpha = \tau'(1) = d_1 = \dim_b(S_{\alpha=d_1})$$

*Hint:*  $\alpha$  is typical,  $\alpha = f(\alpha)$

$$\begin{aligned} &\downarrow \\ f(\alpha) &= \min_q (q\alpha - \tau(q)) = \alpha \quad \text{if } q_{\min} = 1 \\ &\downarrow \\ \alpha &= \tau'(1) = d_1 \\ \alpha &= f(\alpha) = \dim_b(S_{\alpha=d_1}) \end{aligned}$$

## Popular generalized dimensions: $d_0, d_1, d_2$

- $d_0 = -\tau(0) = \dim_b \{g: \lambda(dg) > 0\}$ , **box/capacity** dimension

$$\log \#\{\Delta_L^i : \lambda(\Delta_L^i) > 0\} \cong d_0 \log L, \quad L \rightarrow 0$$

{  $\Delta_L^i$  } is covering of  $G$

- $d_1 = \tau'(1)$ , **information** dimension (typical singularity)

$$\text{Entropy}_L: -\sum \lg P(\Delta_L^i) \cdot P(\Delta_L^i) \cong -d_1 \log L, \quad L \rightarrow 0,$$

$$P(dg) = \lambda(dg) / \lambda(G)$$

- $d_2 = \tau(2)$ , **correlation** dimension (singularity but not dimension)

$$\log \int \lambda(\Delta_L(g)) \lambda(dg) \cong d_2 \log L, \quad L \rightarrow 0$$

**Myth:**  $d_2$  is the best physics-oriented dimension

**Monofractality:**  $d_q \equiv d_1$  for any  $q$

## Generalized Gutenberg-Richter law (*Kossobokov et al.*)

$$\log \lambda(\Delta_L) = A - Bm_c + C \log L$$

*parameters*                    *in practice*

$B$                                 ,      $b$ -value in GR law

$C$ , “fractal dimension”,      $C=d_2$

range of  $L$ ,  $(L_-, L_+)$  ?    ,      $L_+ < 1000$  km

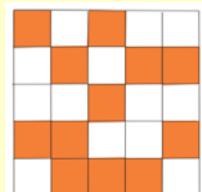
$\Delta_L$  ?                            ,     any box of size  $L$  in  $G$

*Applications*: scaling, seismic risk analysis

*Problem:*     $C$  - ?

- If  $A, B, C$  are constant in  $G$   
and  $\Delta_L$  is any seismogenic box in  $G$  then  $C=d_0$

*Hint:*



$$\begin{aligned}\lambda(G) &= \lambda(\Delta_L) \cdot \#\{\Delta_L : \lambda(\Delta) > 0\} \\ \text{const} &= \lambda(\Delta_L) \cdot L^{-d_0}\end{aligned}$$

- More realistic case:

$\log R_L(q)$  vs  $\log L$  is linear for  $L=L_1, L_2, \dots, L_n$

Least Square Weighted estimate of  $C$ :

$$\sum_{i,j} \left[ \log \lambda(\Delta_{L_j}^i) - a - C \log L_j \right]^2 w(\Delta_{L_j}^i) \Rightarrow \min_{a,C}$$

$a = A - B m_c$ ,  $\{\Delta_L^i\}$ , covering of  $G$

$$w(\Delta) = [\lambda(\Delta)]^q, \quad q > 0 \Rightarrow C \cong \tau'(q)$$

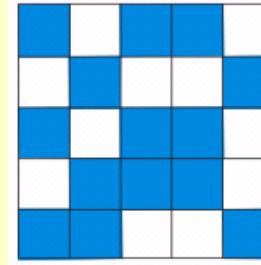
- $C \cong d_1$  (typical singularity)  $\leftrightarrow w(\Delta) = \lambda(\Delta)$   
 $w(\Delta), q \neq 1$  filters the seismogenic points as  $L \rightarrow 0$
- coupling of  $C \cong \tau'(q)$  and  $w(\Delta) = \lambda^q(\Delta)$  is key point in understanding of results of multifractal analysis with finite/infinite number of scales.

## **Empirical multifractal analysis**

**Crucial postulate:** seismicity is “self-similar”,  
i.e. “looks the same” in different scales

$$\Rightarrow \log R_L(q) = \text{const} + \tau(q) \log L, \quad L = L_1 \dots L_n \in (L_-, L_+)$$

$$R_L(q) = \sum_{\lambda(\Delta) > 0} \left[ \frac{\lambda(\Delta_L^i)}{\lambda(G)} \right]^q$$



$\{\Delta_L^i\}$ , covering of  $G$

**Problem:** estimation of  $\tau(q)$

Math. approach

- $L_i \rightarrow 0, i=1,2,\dots,\infty$

Empirical approach

- $L_i > 0, i=1,2,\dots,n, L_i \in (L_-, L_+)$ ?  
 $\lambda(dg)$  can look like multifractal  
differently in different scale ranges

Example:

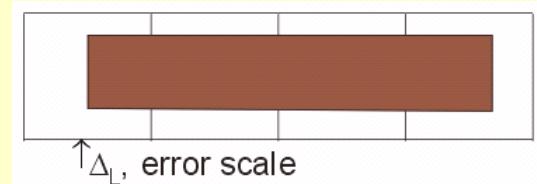
$$S = \{1, 2, 3, \dots\}$$

$$\dim_b(S) = \begin{cases} 0, & L < 1 \\ 1, & L > 1 \end{cases}$$

## Math approach

- shape of  $\Delta_L$  is arbitrary
- $\lambda(dg)$ , multifractal
- boundary effect: no

*Example:*

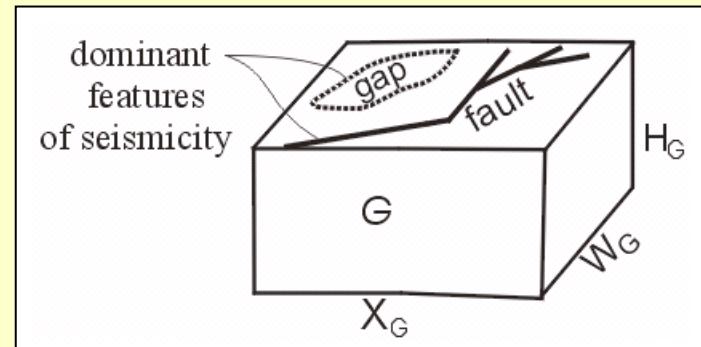


## Empirical approach

- shape of  $\Delta_L$  is a parameter:  
ball/cube → isotropic case  
parallelepiped → anisotropic case
- $\lambda(\Delta_L) = \#\{\text{event } (t,g,m) \in \Delta T \times \Delta_L \times [m_c, \infty]\}$ ,  
trivial multifractal
- yes

Upper bound

$$d_q \leq d_0 = 1$$



$$L < \min(X_G, W_G, H_G, L_{fl}, L_{gap})$$

## Lower bound

- $L > \begin{cases} \delta g, \text{ location uncertainty} \\ L_{\bar{m}} \approx (\bar{m} - 4)/2, \text{ maximum rupture length of } (m < \bar{m}) - \text{events} \end{cases}$

$$\bar{m} : \Pr\{m > \bar{m}\} = \varepsilon$$

$$\text{GR law} \Rightarrow \bar{m} = m_c + |\lg \varepsilon| / (b - \text{value})$$

$$L_{\bar{m}} < 1\text{km} \text{ if } m_c = 3, \varepsilon = 10^{-b} \cong 0.1$$

- $L > L_{\text{stbl}}$

*Idea:*  $n(\Delta_L) = \#\{\text{event in } \Delta_L\}$  can't be small to identify the type of singularity of  $\lambda(dg)$  at  $g \in \Delta_L$

Goltz (1997):  $\langle n(\Delta_L^i) \rangle = \bar{n}_L > 5, \quad L > L_{\text{stbl}}$

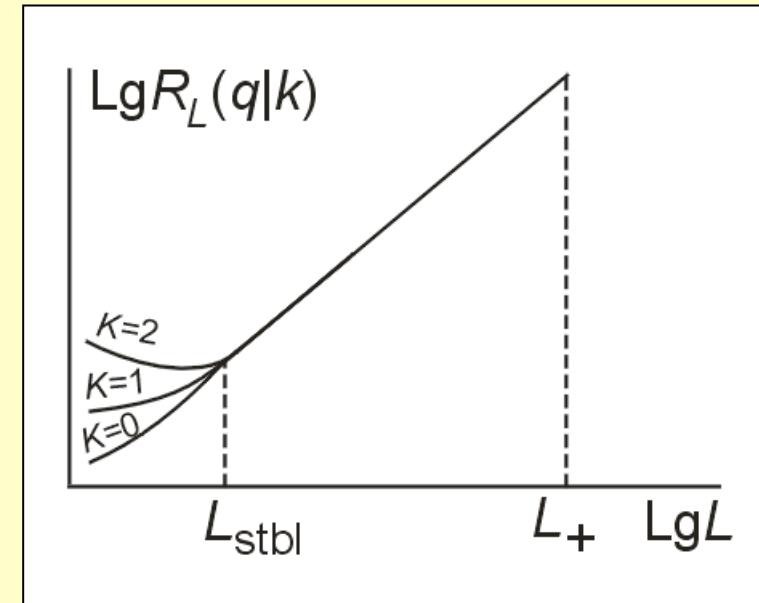
*More flexible approach:*

$\lg R_L$  vs  $\lg L$  regression should be stable under  
the operation of rejecting “half-empty” boxes,  $n(\Delta_L) \leq k$ ,  $k = 1; 2; 3$   
i.e.

$$\lg R_L(q) \approx \lg R_L(q|k), \quad L_{\text{stbl}} < L < L_+$$

$$R_L(q|k) = \sum_{i: \hat{n}(\Delta_L^i) \geq k} \left[ \frac{\lambda(\Delta_L^i)}{\lambda_k(G)} \right]^q$$

$$\lambda_k(G) = \sum_{\hat{n}(\Delta_L^i) \geq k} \lambda(\Delta_L^i)$$



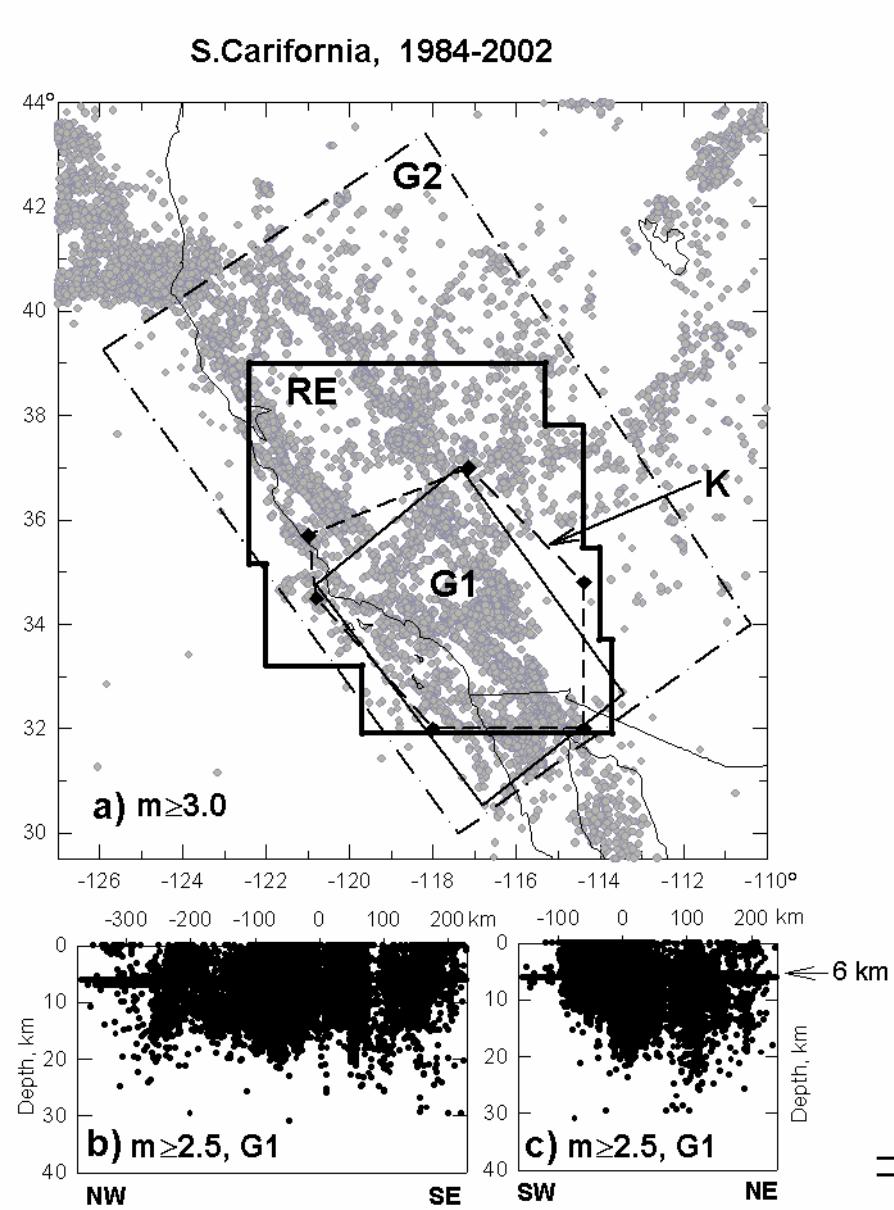
# Fractality of Regional Seismicity

Regions with nontrivial fractal properties:

- 3D analysis,  $L_+/L_- \approx 10$ : Kamchatka, New Zealand
- 2D analysis,  
 $L_+/L_- = 40-50$ : S.California, Garm (C.Asia), New Zealand,  
Kamchatka  
 $L_+/L_- = 10-20$ : Greece, C.American Arc, Costa Rica

Excluded regions ( $L_+/L_- < 10$ )

Mid-ocean ridges, Kuril Islands (very narrow seismic belts)  
Aleutian Islands, Tonga, Philippines Arc, Andes  
Western Turkey, Alaska, South of W.Alps  
Betica (Spain)



## Transform fault zone

**RE:** relocated catalog  
by Haukson et al.(2005)  
location:  $\delta g \leq 0.1$  km

- **G1**  $\times [0, 15 \text{ km}]$ :

$$\bar{n}_L = 0.0116 L^3 < 1$$

$$L = 0.1 - 4 \text{ km}$$

$$\downarrow \\ \text{3D: } (L_-, L_+) \subset (4, 15 \text{ km})$$

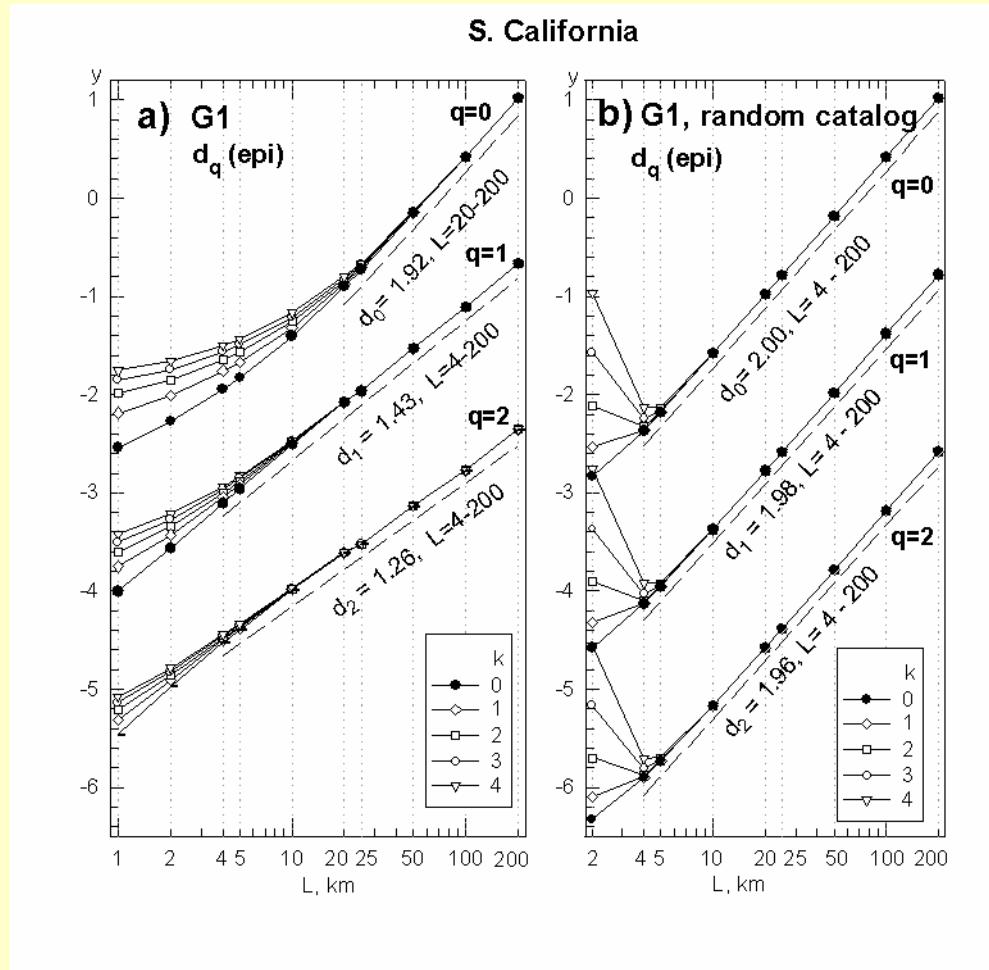
$\downarrow$

$$L_+ / L_- \leq 3 \text{ (trivial case)}$$

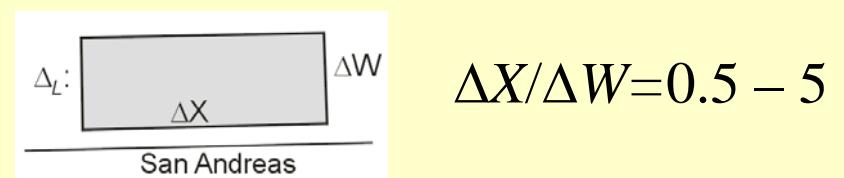
- # {event:  $h=6 \text{ km}$ } = 30%

$\Rightarrow$  **3D analysis is unreasonable**

## Conclusion: 2D analysis, $m \geq 2$



- $L_+ / L_- = 50$  (!)
- $d_1, d_2$  are relatively low
- $d_1 \neq d_2$  (multifractality) because  
 $d_1 - d_2$ : 0.17 (real)  $\gg$   
 0.02 (random catalog)
- Shape of  $\Delta_L$  is inessential:



$$\delta d_1 = \pm 0.03, \quad \delta d_2 = (-0.03, 0.08)$$

Subduction zone

Regional catalog:

$$\#\{\text{event}: h=5; 13; 28; 33 \text{ km}\}=23.4\%$$

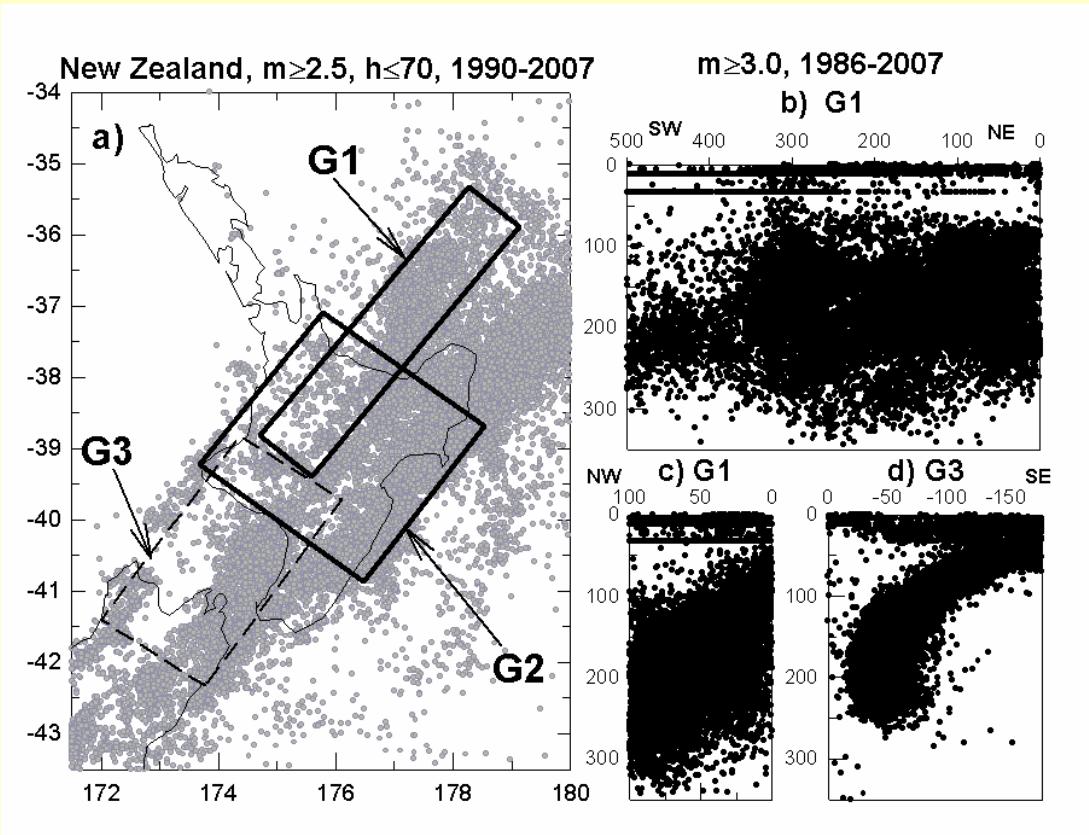
3D analysis:  $m \geq 3$ ,

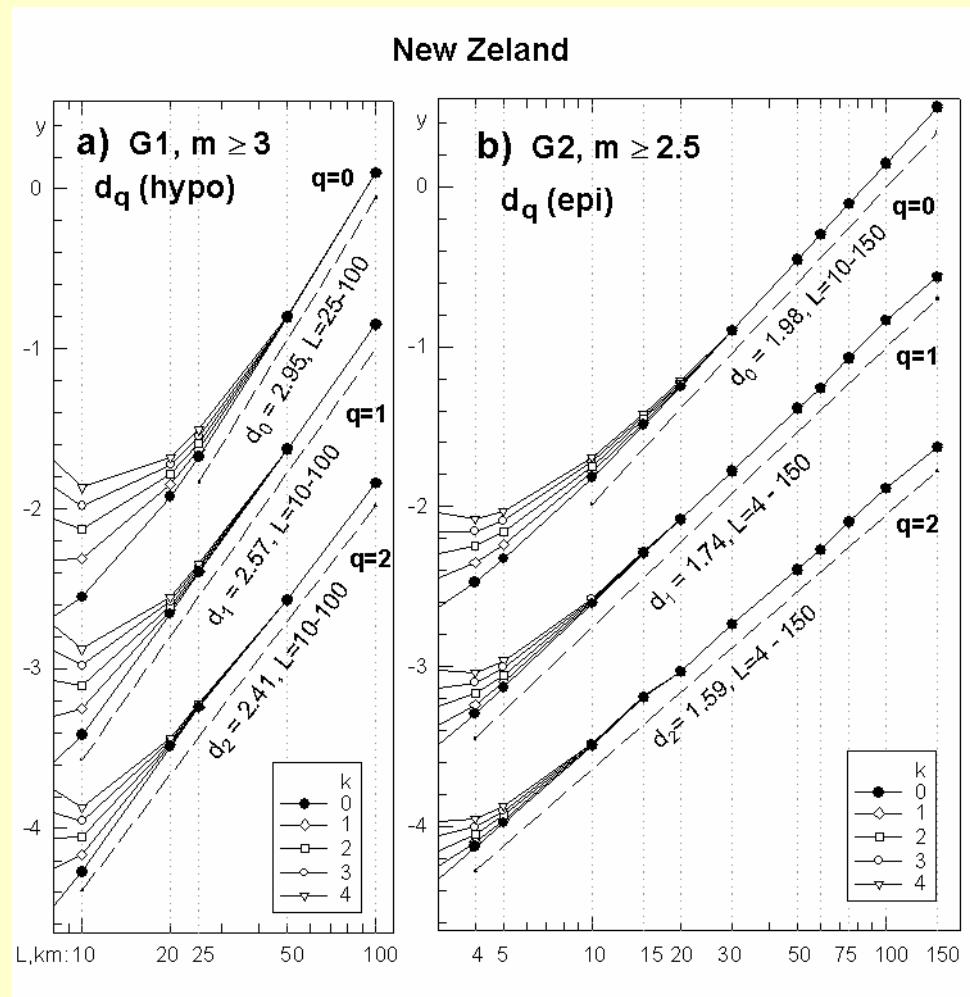
**G1**  $\times (100 \leq H_G \leq 300 \text{ km})$

$= 500 \times 100 \times 200 \text{ km}$ ,

2D analysis:  $m \geq 2.5$ ,  
 $h \leq 70 \text{ km}$

**G2**  $= 600 \times 300 \text{ km}$





3D analysis:

$$L_+/L_- = 10$$

2D analysis:

$$L_+/L_- = 38 (!)$$

Harte(2001):  
 unsuccessful attempt of  
 2D analysis in Reg. **G3**

# Conclusion

Is seismicity fractal?  
mono- or multi-fractal?  
everywhere in space?  
nontrivial range of scale?  
shape of  $\Delta_L$ ?  
the best  $d_q$ ?

$d_1$ (2D)  
 $d_2$ (2D)

It looks as a fractal for  $m \geq (2-3.5)$ ; for  $m \geq 4$ ?  
**multi**,  $d_0 \neq d_1 \neq d_2$   
**NO**  
yes:  $L_+/L_- = 10 - 50$ , 2D case  
insignificant

*$d_1$  is typical singularity &  $\dim_b \{S_{\alpha=d_1}\}$*

$\sim 1.4$  [S. California]  $\sim 1.8$  [4 subduction zones<sup>1)</sup>]  
 $\sim 1.3$  [transform fault]  $1.6 - 1.7$  [2 collision zones<sup>2)</sup>]  
<sup>1)</sup> Kamchatka, New Zealand, C. American Arc, Costa Rica  
<sup>2)</sup> Greece, Garm (Central Asia)

The use of multifractality

- nonproductive in form of generalised GR law for seismic risk
- productive in prediction of some scaling relations, e.g.  $\lambda(\Delta_L)$ ,  $\tau(\Delta_L)$ <sup>22</sup>

# Optimal Spatial Scaling

- $\lambda(\Delta_L)$ , seismicity rate  
of events in  $\Delta_L$
- $t(\Delta_L)$ , inter-event time  
(time between successive events in  $\Delta_L$ )

$\Delta_L$ , random box in  $G$ :  $\Pr(\Delta_L) = w(\Delta_L)$ ,  $\sum_i w(\Delta_L^i) = 1$

Problem of scaling:

$$\lambda(\Delta_L) \propto L^{C_\lambda}, \quad C_\lambda ? \qquad t(\Delta_L) \propto L^{-C_t}, \quad C_t - ?$$

In practice:  $C_\lambda = C_t = d_0$  (Corral)  
because  $\lambda(\Delta_L) \cdot Et(\Delta_L) = 1$

Solution under conditions:

- $w_q(\Delta_L) \propto \lambda^q(\Delta_L)$
- multifractality of  $\lambda(dg)$

## Results

- scaling of means

$$\langle \lambda(\Delta_L^i) \rangle = \sum_i \lambda^i(\Delta_L) w_q(\Delta_L^i) \propto L^{\tau(q+1)-\tau(q)} = \begin{cases} L^{d_0} & \text{uniform} \\ L^{d_2} & \lambda(\Delta) \end{cases}$$

$$\langle t(\Delta_L^i) \rangle = \sum_i Et(\Delta_L^i) w_q(\Delta_L^i) \propto L^{\tau(q-1)-\tau(q)} = \begin{cases} L^{-d_0} & \lambda(\Delta) \\ L^{-d_2} & \lambda^2(\Delta) \end{cases}$$

- scaling of  $\lambda(\Delta_L^i)$  and  $t(\Delta_L^i)$  as the random variables

$$w(\Delta) \propto \lambda^q(\Delta) \Rightarrow \lambda(\Delta_L^i) \propto L^{\tau'(q)} = L^{d_1} \quad \lambda(\Delta)$$

$$t(\Delta_L^i) \propto L^{-\tau'(q)} = L^{-d_1} \quad \lambda(\Delta)$$

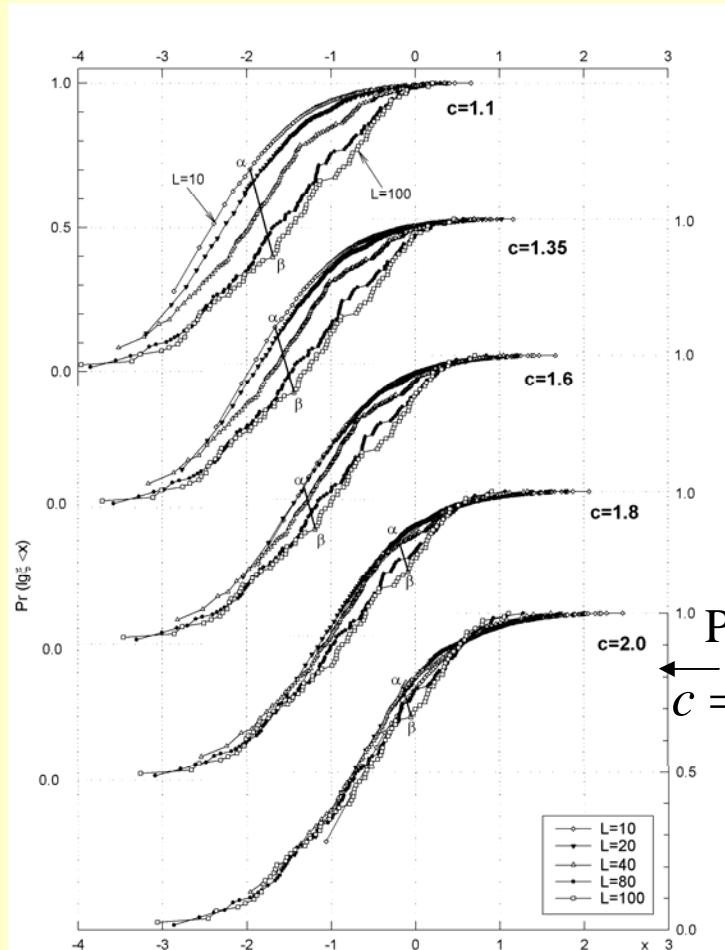
## Testing

$$\lambda(\Delta_L) \rightarrow \lambda(\Delta_L)L^{-c}, \text{ renormalization}$$

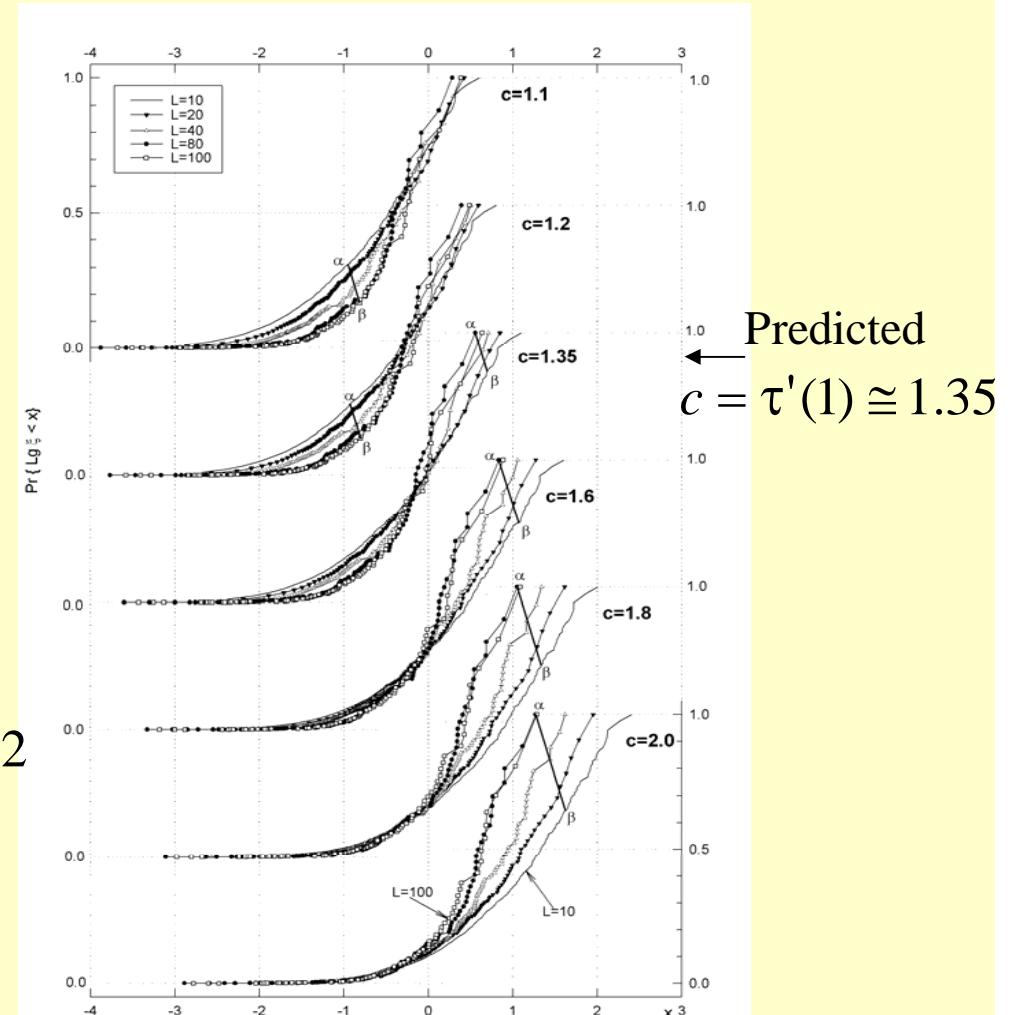
The set of distributions  $\Pr\{\lambda(\Delta_L)L^{-c} < x\}$ ,  $L \in (L_-, L_+)$   
for fixed  $q$  must be the most tight if  $c = \tau'(q)$

# Scaling of $\lambda(\Delta_L)$ : S.California (Reg. **G2**)

$\Pr(\Delta)$ , uniform



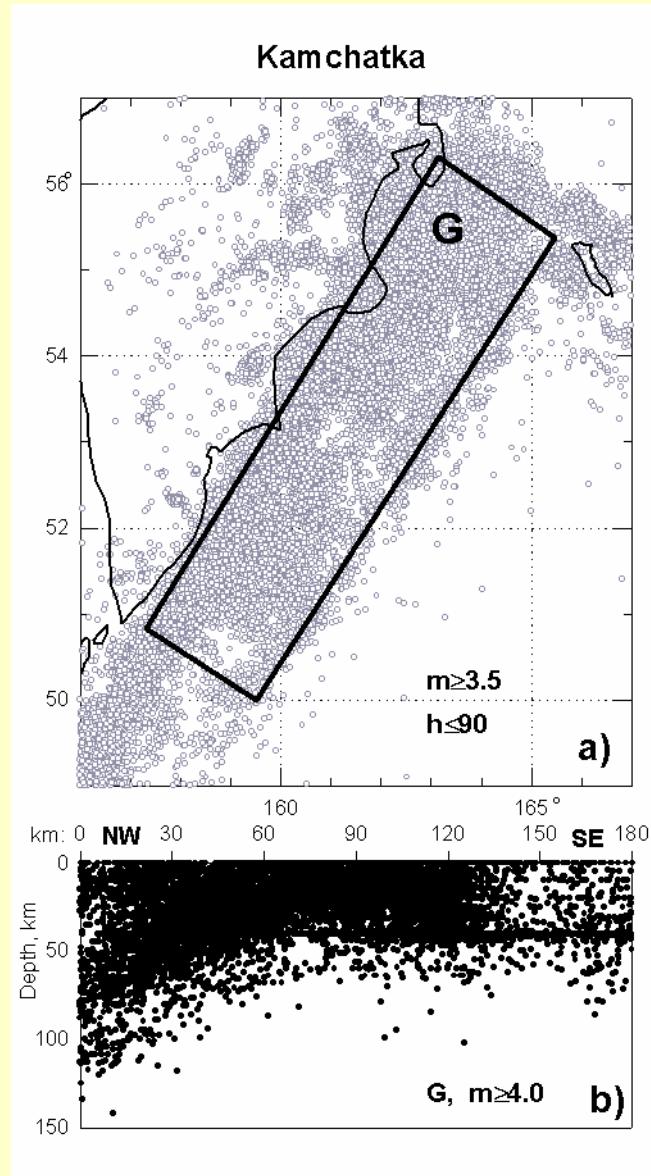
$\Pr(\Delta) \propto \lambda(\Delta)$



$\alpha \searrow \beta$  Levy distance

vertical axis:  $\Pr(\lambda(\Delta_L)L^{-c} < x)$ ,  $L=10-100$  km

# THANK YOU



Subduction zone

**G:**  $720 \times 180 \times [0, 90 \text{ km}]$

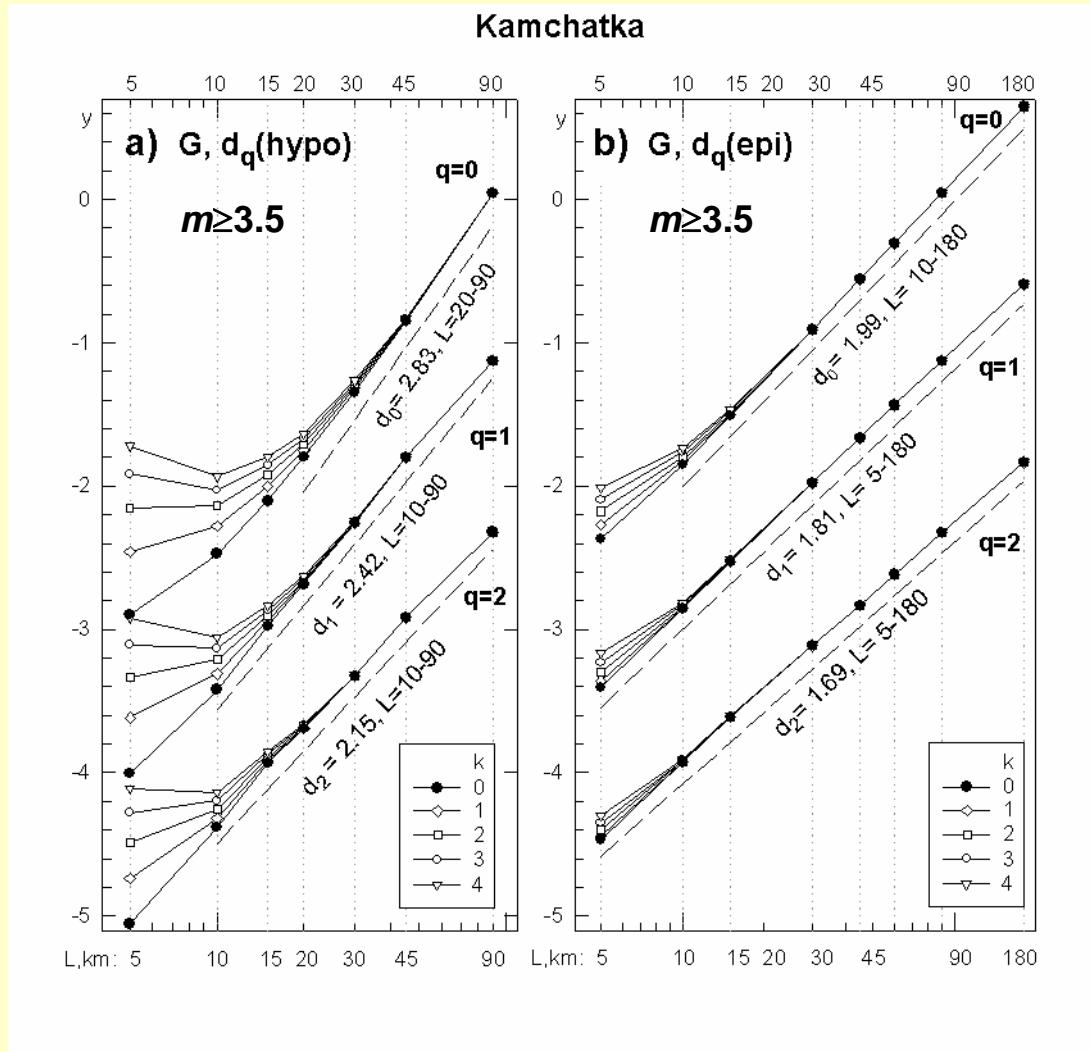
Composite catalog:  
 $m \geq 3.5$ , 1962-2003

$L_- \geq 10 \text{ km}:$

$$\bar{n}(\Delta_{10\text{km}}) = 2.3$$

$$\delta g = 5 - 10 \text{ km}$$

$\leftarrow 40 \text{ km}, 20\% \text{ of events}$



- $m=3.5$  is relatively high level
- Similarity for  $L=10 - 180$  km