

# *Identifying pathways for gas and fluid migration caused by fracking processes, with the use of criteria defined in equivalent dimension phase spaces*

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**SHale gas  
Exploration and Exploitation  
induced Risks**



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# **Equivalent dimension (ED) approach**

A seismic event can be characterised by a multitude of different parameters:

- Source parameters i.e.:  $t$ ,  $lat$ ,  $lon$ ,  $depth$ ,  $M$ ,  $[M_{i,j}]$ ,  $E_s \Delta\sigma$ ,  $r_0$  etc.
- Derived from the above i.e.: interevent time between this and the preceding event -  $\tau$ , epicentral distance between this and the main shock -  $r$ , etc.
- Any other correctly defined.



The seismic event is a point in the parameter space, represented by the vector:

$$\mathbf{X} = [t, lat, lon, depth, M, [M_{i,j}], E_s \Delta\sigma, r_0, \dots, \tau, r, \dots, e_1, e_2, e_3, \dots, I_1, I_2, I_3, \dots, \dots]$$

**The parameters of seismic events:**

1. are not comparable
2. the metric of most of them is non-Euclidean.

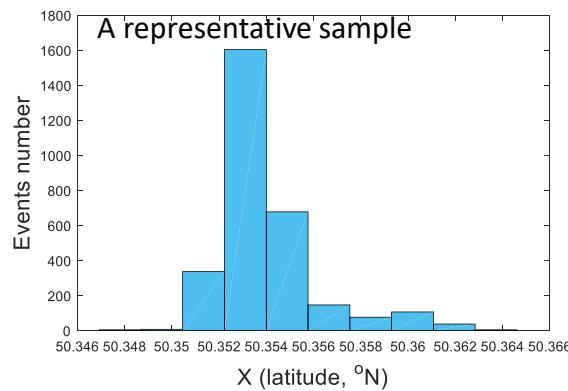


# The concept of equivalent dimensions

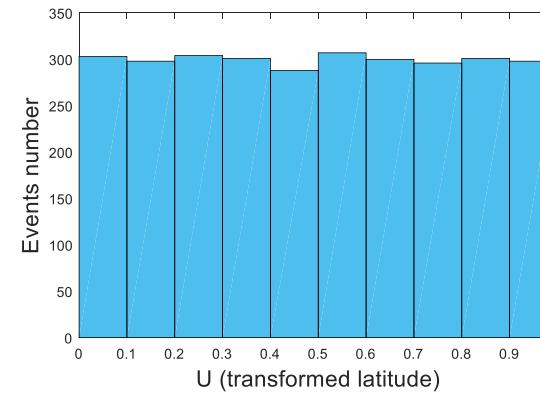
(Lasocki, GJI 2014)

Two intervals of the parameter values,  $[x_{k,i}, x_{k,j}]$ ,  $[x_{l,s}, x_{l,t}]$  are equivalent if  $\Pr(X_k \in [x_{k,i}, x_{k,j}]) = \Pr(X_l \in [x_{l,s}, x_{l,t}])$ .  $U_k = F(X_k)$ , where  $F(\bullet)$  is the cumulative distribution, are Equivalent Dimensions of  $X_k$

Every  $U_i$  is uniformly distributed in  $[0,1]$ .



$$X_i \rightarrow U_i = F(X_i)$$



All  $U_i$  have Euclidean metric. The distance between

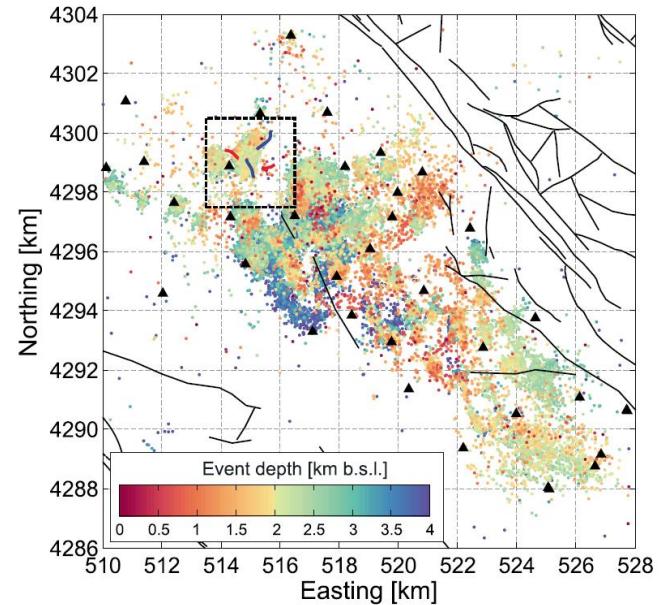
the events  $k$  and  $l$  is  $d(k, l) = \sqrt{\sum_{i=1}^n [U_i(k) - U_i(l)]^2}$

In general,  $F_{X_k}$ , are not known and are estimated by means of the non-parametric kernel estimation method. (e.g. Silverman, 1986)

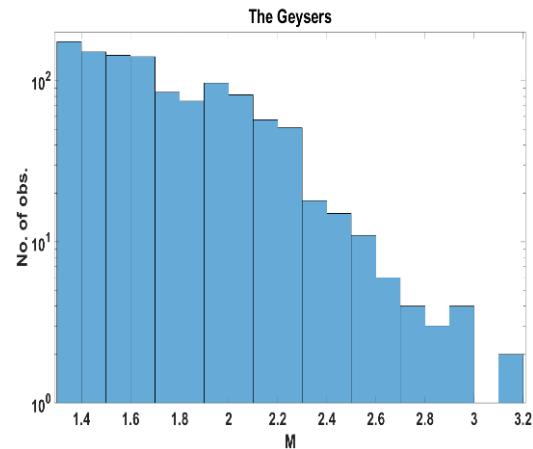
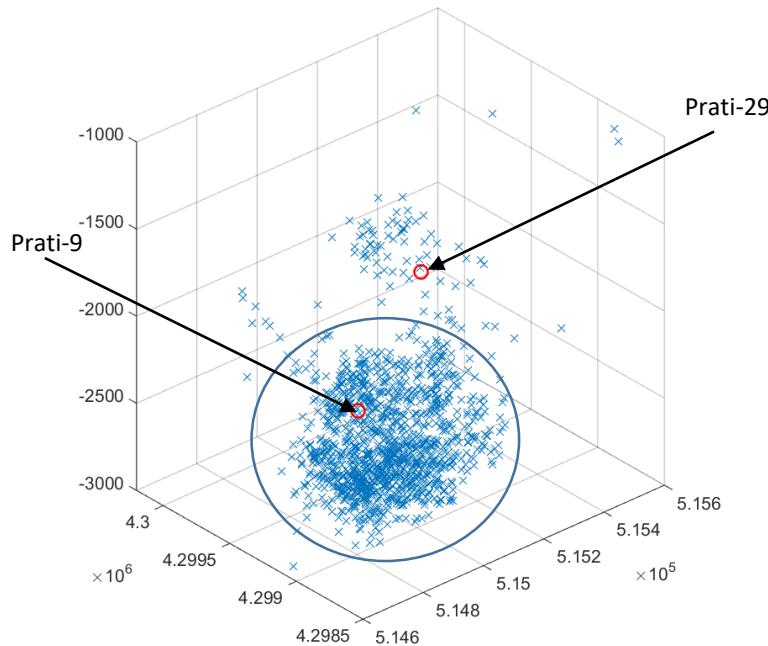
# Data

Seismicity occurred in the northwestern part of The Geysers geothermal field from Dec 2007 to Aug 2014.

Two injection wells: Prati-9 and Prati-29



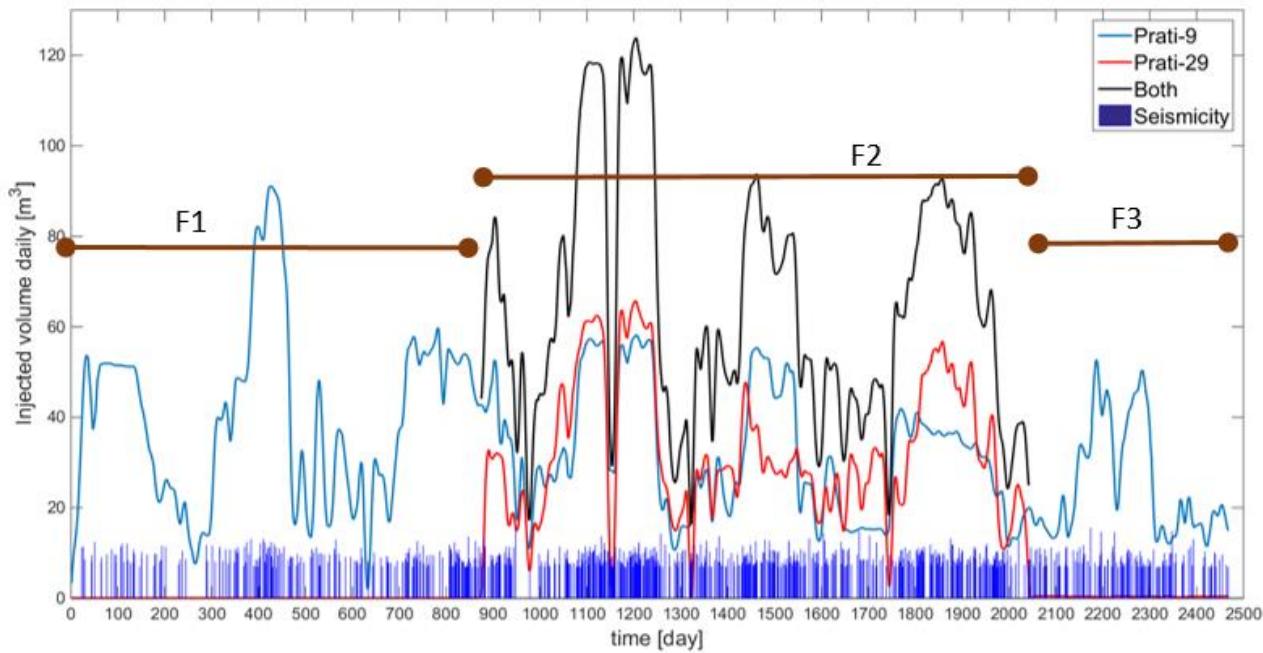
Subcluster A – 1121  
events from  $M_{min} = 1.37$   
to  $M_{max}^{obs} = 3.16$



Institute of Geophysics  
Polish Academy of Sciences

# Data

Daily injected volumes into: Prati-9 (operating continuously) and Prati-29 (operating: Apr 2010 - Jun 2013)



Phase F1: Dec 2007 – Mar 2010, Injections only into Prati-9,  $\langle \text{rate} \rangle = 40 \text{ m}^3/\text{day}$ ,  
248 EQ-s,  $\lambda = 0.29 \text{ EQ/day}$

Phase F2: Apr 2010 – Jun 2013, Injections into Prati-9 and Prati-29,  $\langle \text{rate} \rangle = 65 \text{ m}^3/\text{day}$ ,  
702 EQ-s,  $\lambda = 0.60 \text{ EQ/day}$

Phase F3: Jul 2013 – Aug 2014, Injections only into Prati-9,  $\langle \text{rate} \rangle = 25 \text{ m}^3/\text{day}$ ,  
171 EQ-s,  $\lambda = 0.40 \text{ EQ/day}$

# Data

## EQ-s parameters.

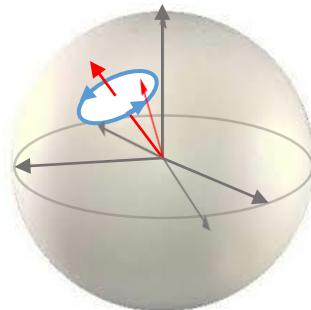
Original: Occurrence time:  $t$ , Hypocentre coordinates:  $x, y, z$ , Magnitude:  $M_w$ , FPS: strike  $\phi$ , dip  $\rho$ , rake  $\lambda$

Derived:

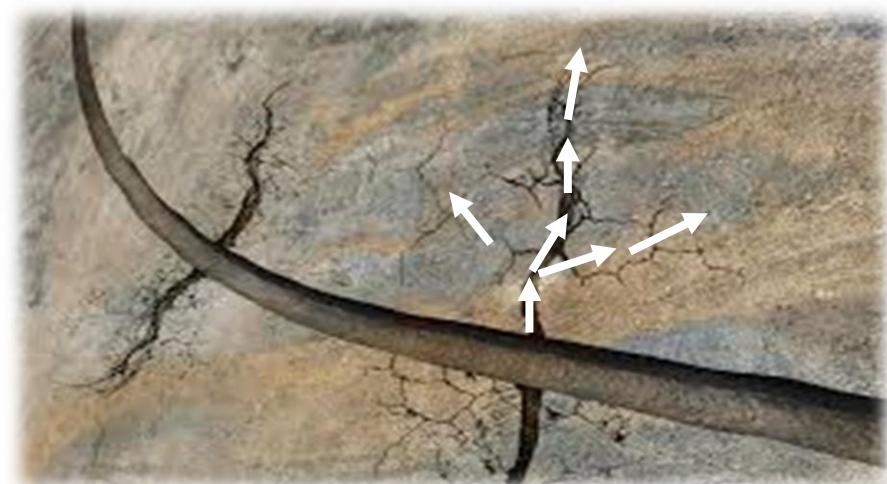
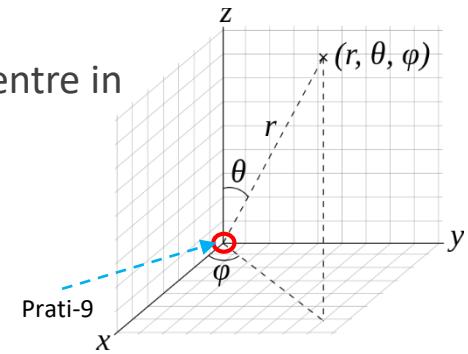
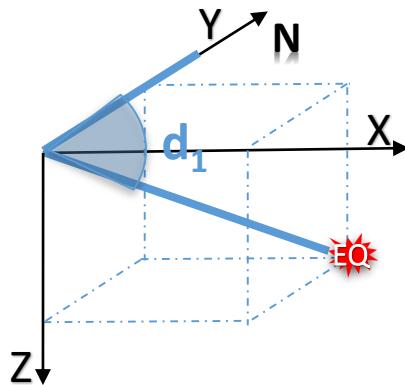
`dip_T , strike_T , dip_P , strike_P ;`

**Deflection, d** - the angle between the straight line connecting the hypocentre and NS direction

**3D rotation, rot** - the angle by which one double-couple (DC) earthquake source is turned into another arbitrary DC (Kagan, 2007)

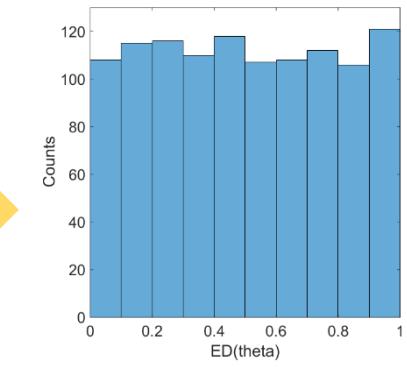
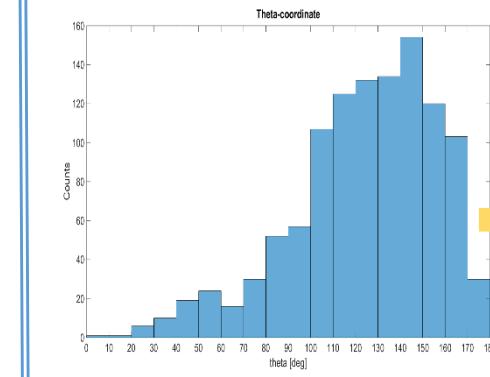
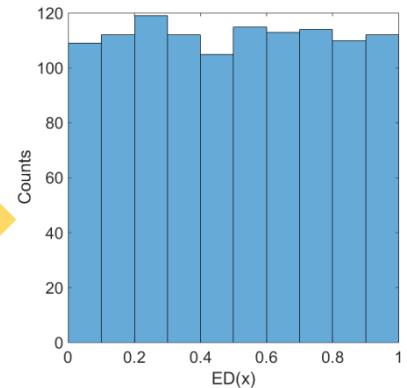
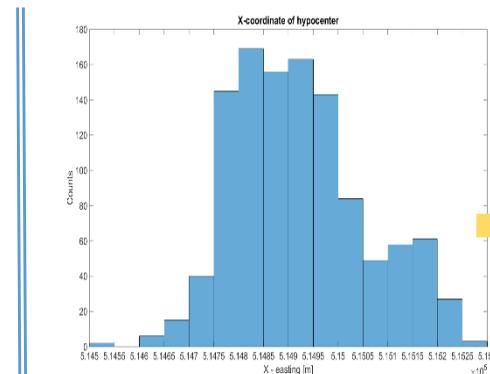
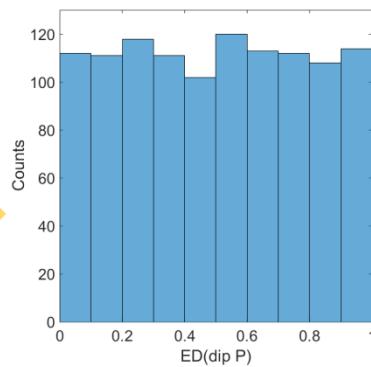
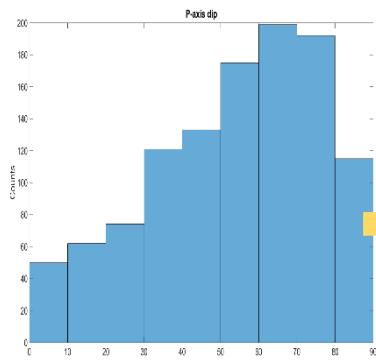
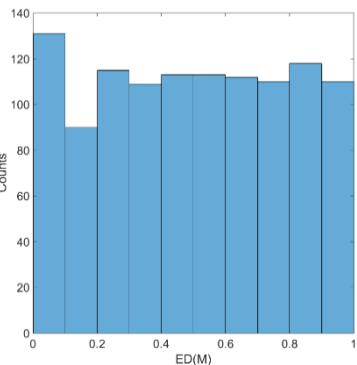
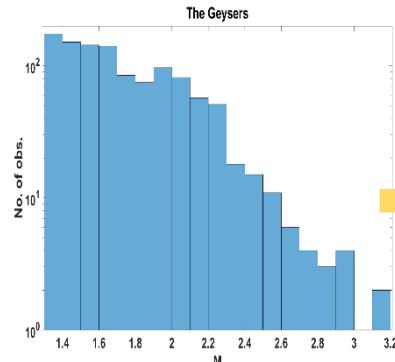


Spherical coordinates of hypocentre in the local system:  $r, \Theta, \varphi$



# Data

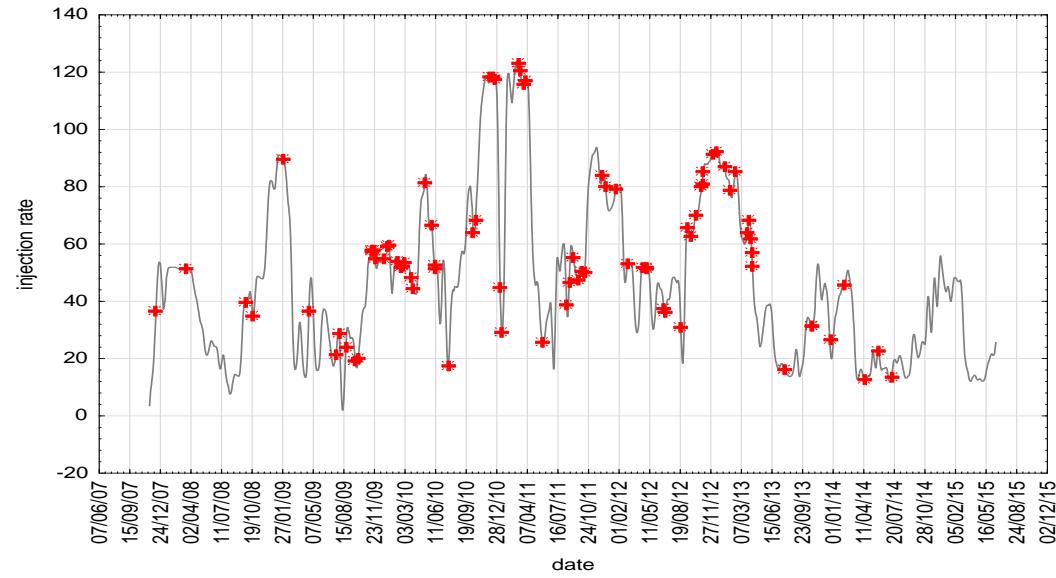
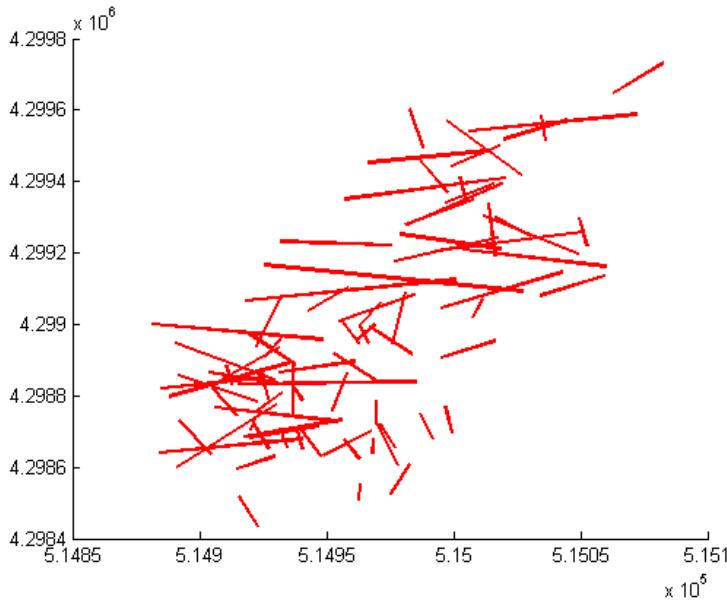
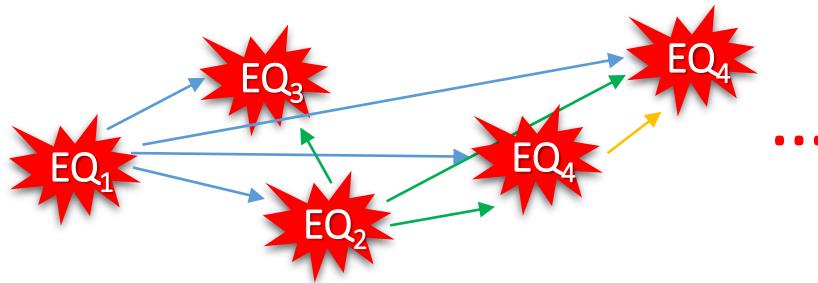
**x, y, z, dip\_T , strike\_T , dip\_P , strike\_P , r,  $\Theta$ ,  $\varphi$   $M_w$ , d, rot - transformed to Equivalent Dimensions**



# Extracting families of earthquakes:

$$l_{ik} = \sqrt{(d_i - d_k)^2 + (rot_i - rot_k)^2}$$

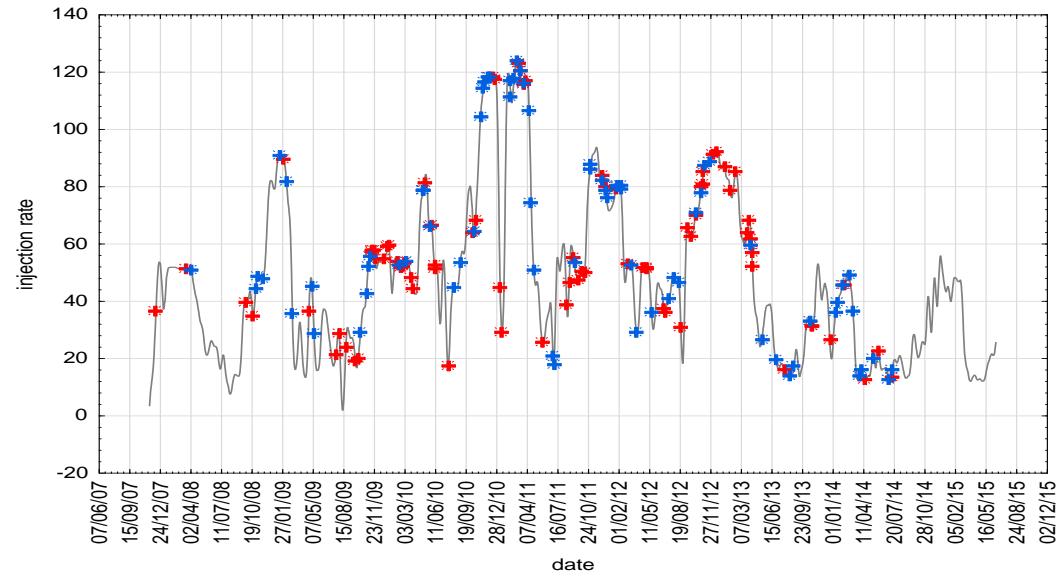
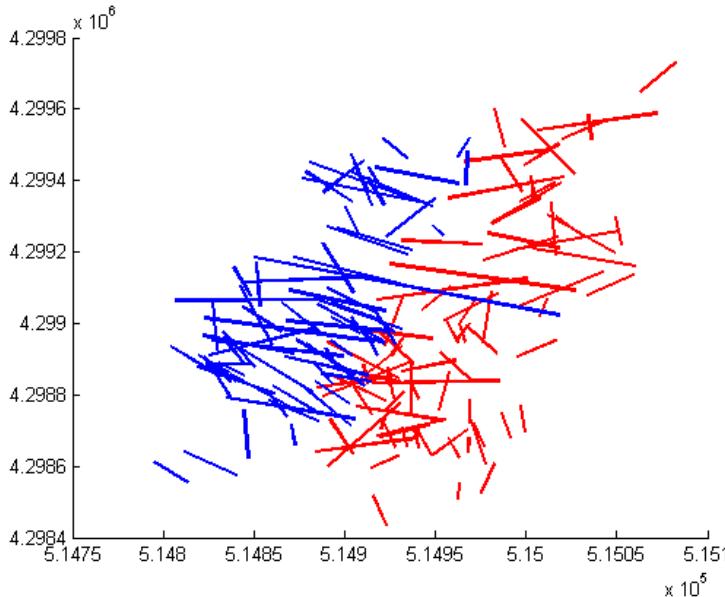
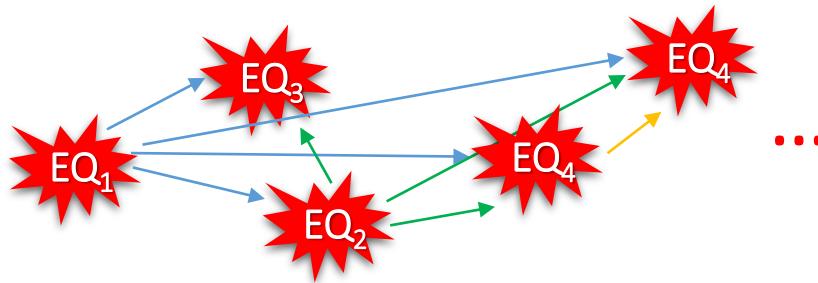
The distance between events in chosen space of parameters,  $l_{ik}$ , is an indicator of a growth of fracture network – *the smaller  $l_{ik}$  the stronger link between  $EQ_i$  and  $EQ_k$* . Criterion for family:  $l_{ik} \leq 0.2$



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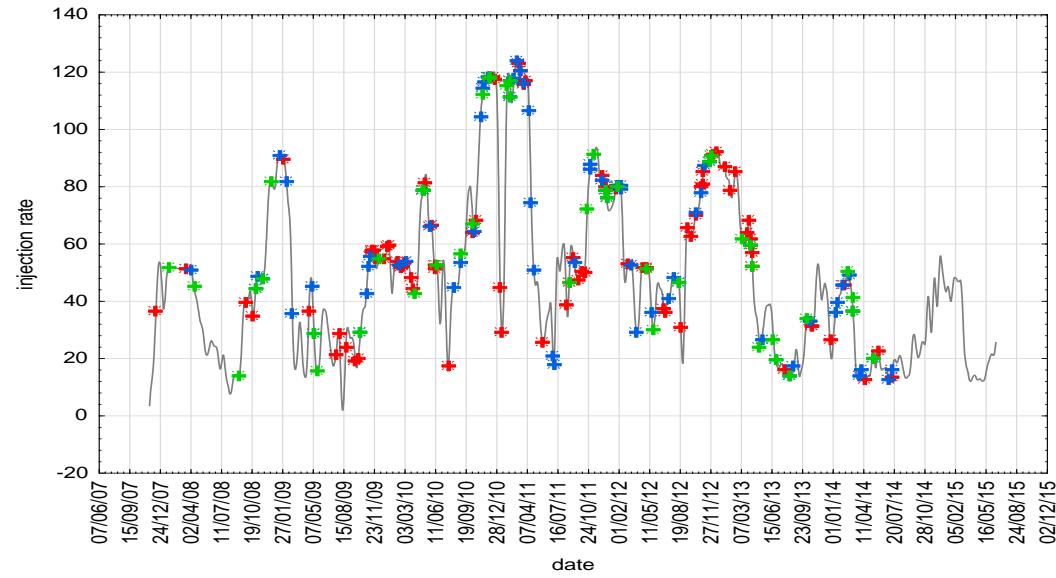
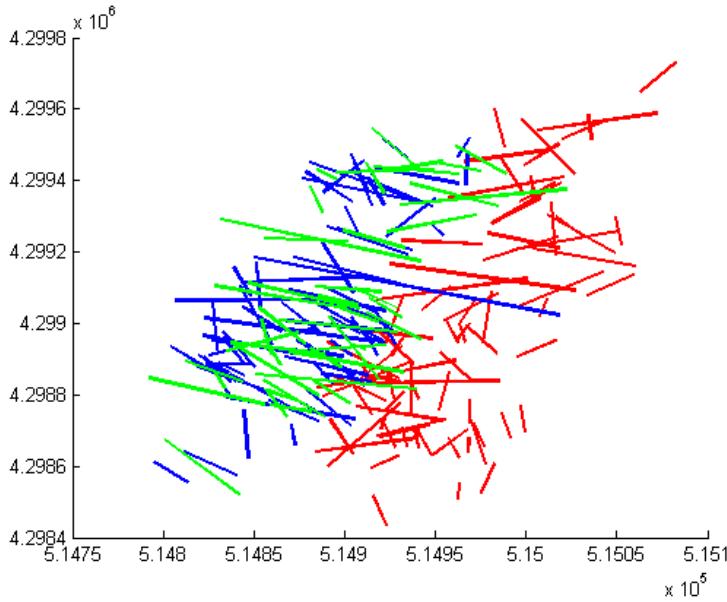
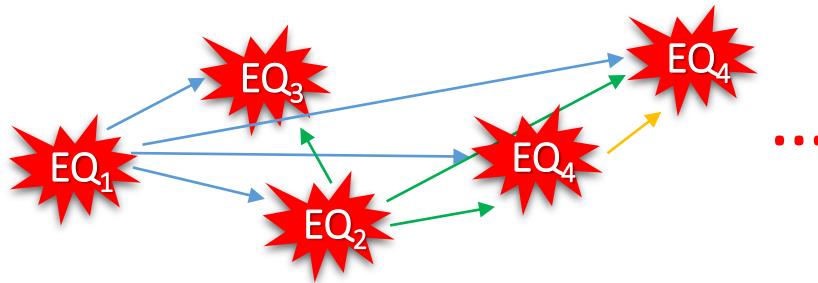
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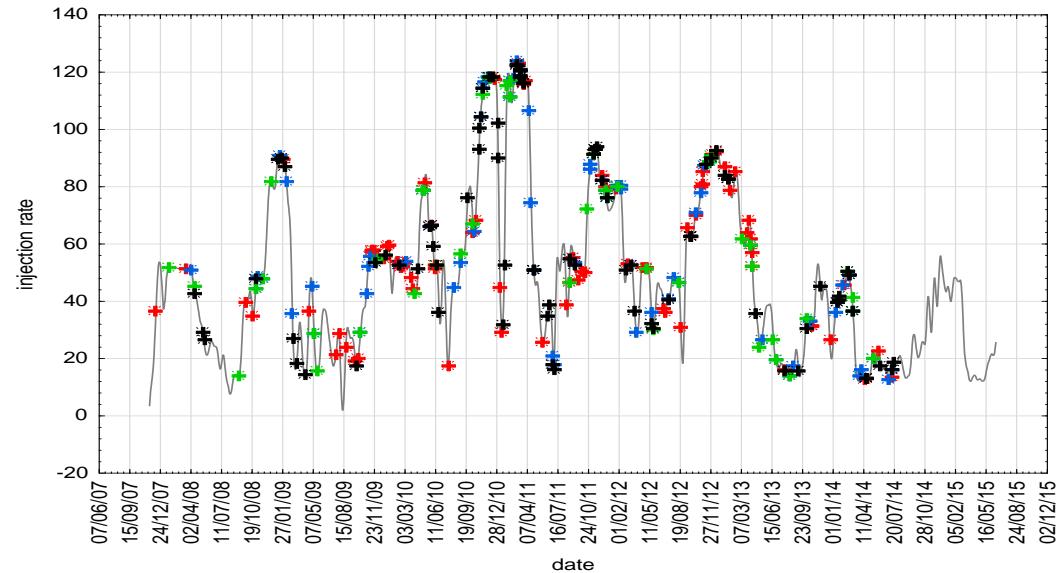
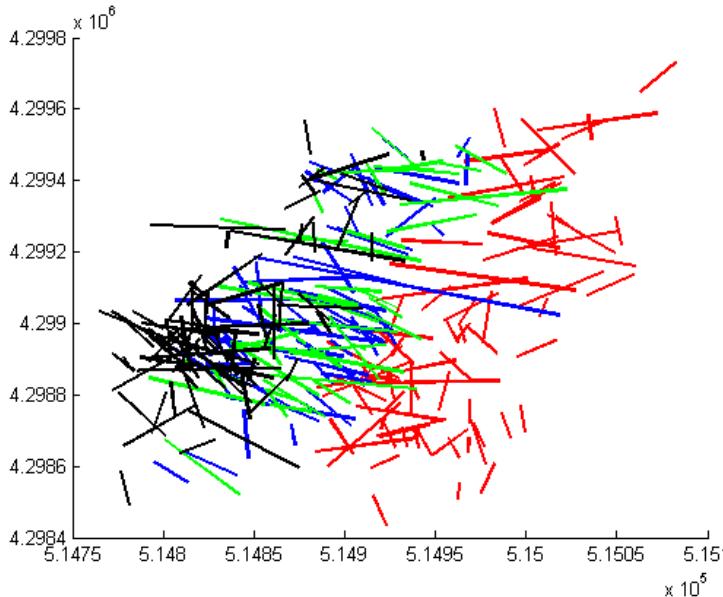
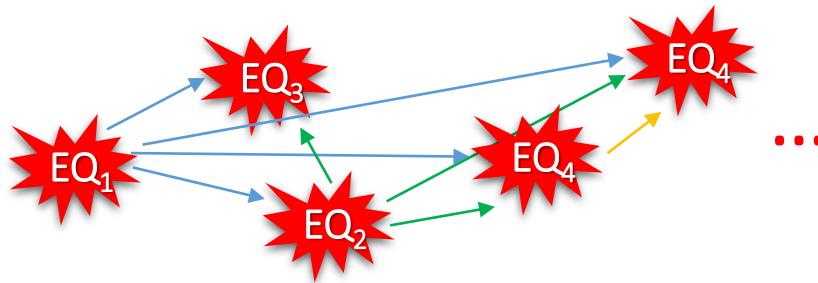
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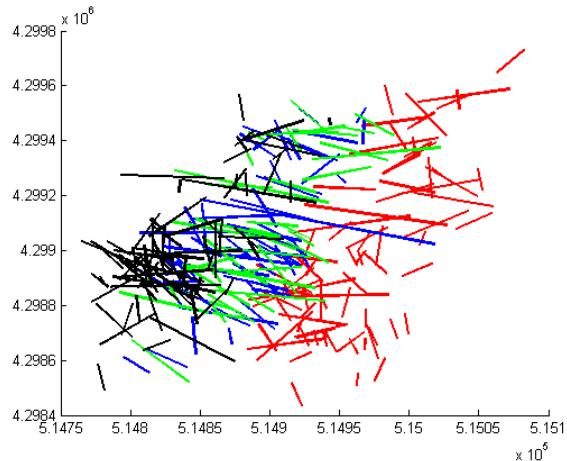
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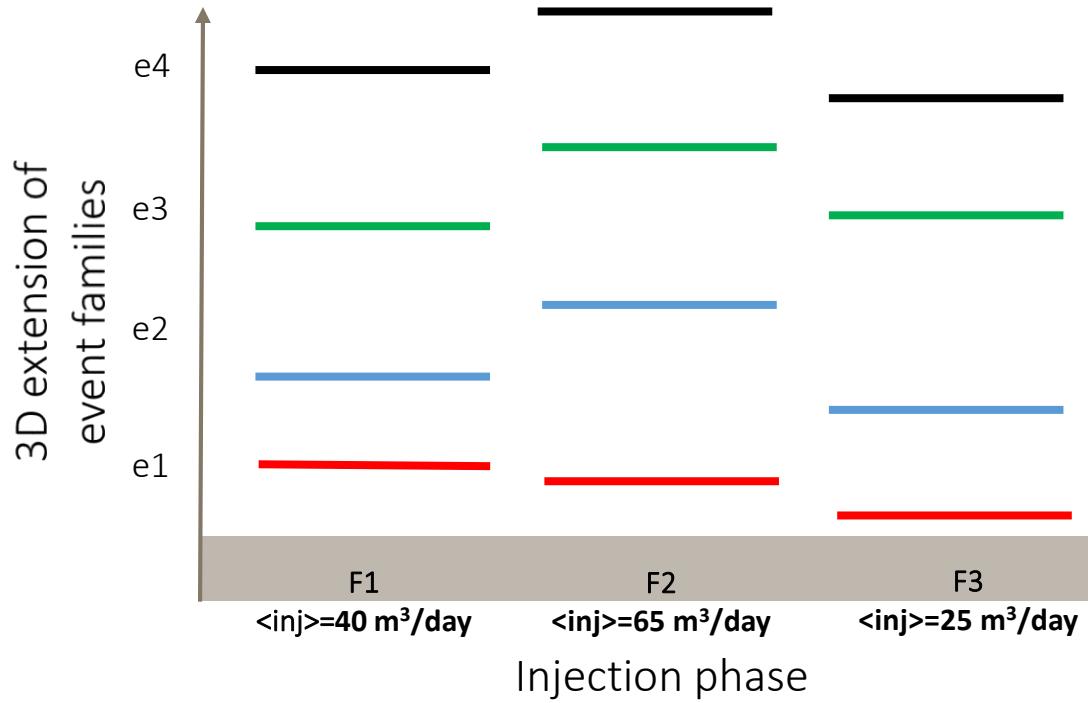
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# *Extracting families of earthquakes:*



3D extension of event families



# **Global approach. Disorder of seismicity is quantified by:**

$$ZZ = \left\{ \sum_{i=1}^{n-1} \sum_{k=i+1}^n \sqrt{\Delta_r^2(i, k) + \Delta_M^2(i, k) + \Delta_\varphi^2(i, k)} \right\} / \frac{n(n - 1)}{2}$$

$$\Delta_r(i, k) = \sqrt{(x_i - x_k)^2 + (y_i - y_k)^2 + (z_i - z_k)^2} \quad \text{- the distance between hypocentres of EQ-s „i”, „k”}$$

$$\Delta_M(i, k) = \sqrt{(dip\_T_i - dip\_T_k)^2 + (strike\_T_i - strike\_T_k)^2 + (dip\_P_i - dip\_P_k)^2 + (strike\_P_i - strike\_P_k)^2}$$

- the total distance between axes T of EQ-s „i”, „k” and axes P of EQ-s „i”, „k”

$$\Delta_\varphi(i, k) = \sqrt{(\Theta_i - \Theta_k)^2 + (\varphi_i - \varphi_k)^2} \quad \text{- the distance between radial vectors of EQ-s „i”, „k” in the local coordinate system with origin at Prati-9}$$

$n$  - the number of EQ-s



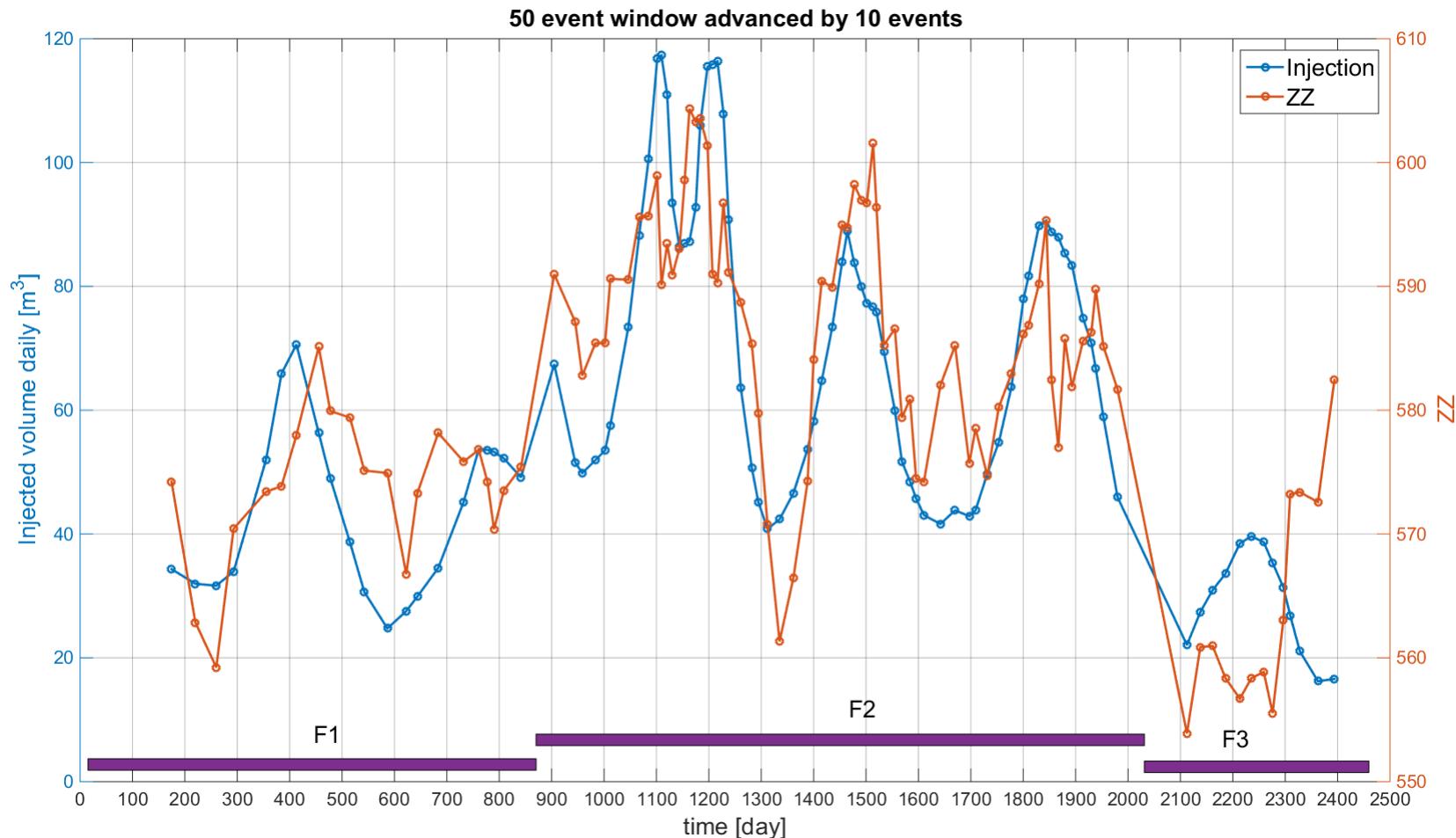
# **ZZ correlates strongly with the injection rate:**

Correlation of ZZ with mean injection rate. The parameters were calculated in the sliding 50 event window, advanced by 10 events.

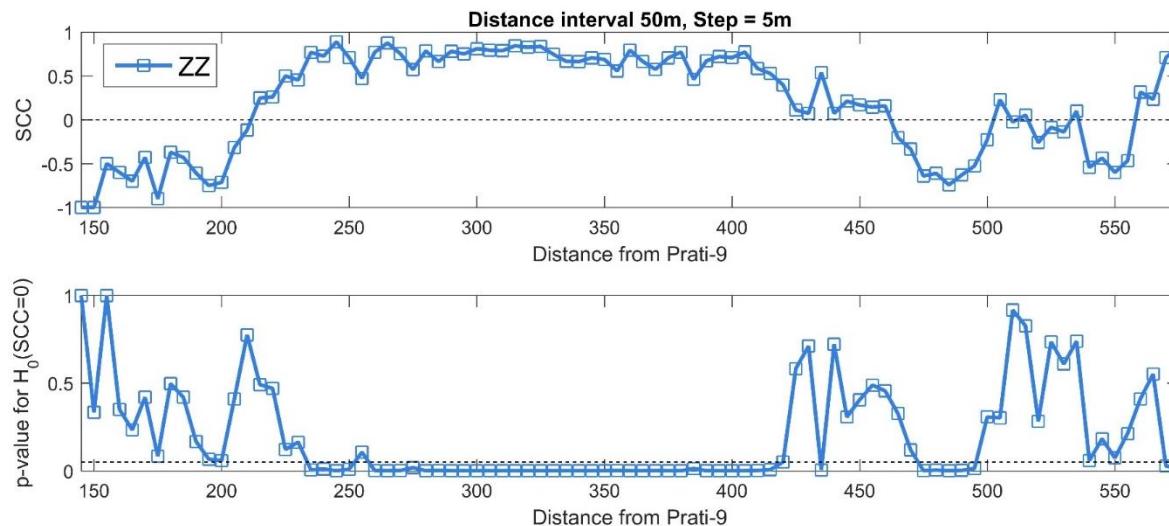
Injection Phase	Correlation coefficient	p - value
F1	0.43	0.0522
F2, total injection of Prati-9 and Prati-29	0.71	$2 \times 10^{-11}$
F3	-0.72	0.0051
F1+F2+F3, total injection	0.39	$5 \times 10^{-5}$



# *ZZ correlates strongly with the injection rate:*



# *Correlation of ZZ with the injection rate versus hypocentral distance from the Prati-9 open hole:*



**No correlation**

$R_{ZZ}=-0.01$  ( $p=0.96$ )

170 events

**Positive**

$R_{ZZ}=0.67$  ( $p=0$ )

626 events

**Negative**

$R_{ZZ}=-0.64$  ( $p=0$ )

141 events

**(Unstable)**

$-0.50 < R_{ZZ} < 0.75$

184 events

0m

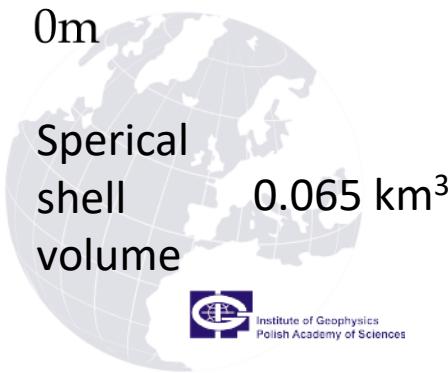
250m

450m

500m

600m

Distance from Prati-9 injection well



$0.316 \text{ km}^3$

$0.142 \text{ km}^3$

$0.381 \text{ km}^3$



## ***Summary and Conclusions:***

- The transformation to equivalent dimensions makes it possible to construct Euclidean metric spaces, based on the sets of quite different earthquake parameters.
- The total distance between the transformed deflection and rotation of earthquakes can be used to extract families of events, which located on similar directions and had similar focal mechanisms. The extension of such event families seems to correlate with the mean injection rate.
- The state variable  $ZZ$ , that is the sum of total distances between hypocenters, T and P axes and radial vectors of every two earthquakes, is used to quantify disorder of seismicity.  $ZZ$  correlates with mean injection rate in each of the three phases of injection, though delays of  $ZZ$  change with respect to injection rate change are observed for some times.
- In the first two phases the correlation is positive – the increased injection increases the disorder of seismicity. In the third phase the correlation is negative – the increased injection organizes seismic sources. It is possible that in this phase an elevated injection induces a mechanisms of linking the already existing fractures.



*Thank you*



In general, the probabilistic models for earthquake parameters,  $F_{X_k}$ , are not known  
 → Replacing  $F_{X_k}$ ,  $k = 1, \dots, p$  with their data-driven, kernel estimators:

$$\hat{F}_X(x | \{x_i, n\}) = \frac{1}{n} \sum_{i=1}^n \Phi\left(\frac{x - x_i}{\lambda_i h}\right) \quad \text{with} \quad \Phi(u) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^u e^{-\frac{\xi^2}{2}} d\xi$$

*h: common bandwidth factor (estimated after Kijko et al., 2001)*

*λ: local bandwidth factors:*

$$\lambda_i = \frac{1}{\left[ \frac{\hat{f}^*(x_i | \{x_i, n\})}{g} \right]^{1/2}} \quad \text{with}$$

*and*

$$g = \left[ \prod_{i=1}^n \hat{f}^*(x_i | \{x_i, n\}) \right]^{1/n}$$

$$\hat{f}^*(x_i | \{x_i, n\}) = \frac{1}{\sqrt{2\pi} hn} \sum_{i=1}^n \exp\left[-\frac{(x - x_i^2)}{2h^2}\right]$$

