# New horizons in the understanding \& mitigation of induced seismicity: physics, risk, communication 

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The rise in the frequency of anthropogenic earthquakes is posing economic, societal and legal challenges to geo-energy projects (e.g., Enhanced Geothermal Systems, EGS). Existing tools to assess and control such risk are insufficient. To resolve this issue, induced seismicity is studied from three fronts: (1) the physics of seismicity, both tectonic and induced, is poorly understood. We move away from the Complexity trend (bottom-up triggering, criticality) to a reductionist approach (top-down loading, non-criticality) to explain the main laws of seismicity. For the case of induced seismicity, both the linear flow rate-induced seismicity rate relationship and the parabolic induced seismicity spatial front are explained from simple geometric operations on a static stress field (Mignan, 2016). It follows that the simple statistical laws that describe induced seismicity time series can be related to only 2 physical parameters (activation \& background static stress amplitude range). (2) With a physical model that can be described algebraically, a data-driven adap tive forecasting system can be run that is computationally cheap. Decision variables can also be derived from such model to define a traffic light system (TLS) in respect to a given safety criterion (Mignan, Broccardo, Wiemer, Giardini, "When is anthropogenic seismicity too risky?", submitted). (3) Although the security criterion can be respected (in average) with the use of a TLS, the known scattering of the activation parameter makes the future of an EGS project uncertain. Based on the EGS costs (mainly drilling), expected profits ( $\$ / \mathrm{kWh}$ ) and risk curves obtained from a priori activation values, one can decide during the planning phase if the project should go ahead or not. By communicating risk uncertainty and how the stakeholder is subjective (pessimistic or optimistic), rational decisions can be made.
(1) Moving away from Complexity Theory: "Seismicity Solid" geometry

$\begin{array}{llll}0 & 100 & 200 & 300 \\ \text { Days t from } 12 \text { August } 1994\end{array}$


Garvin 2011 (US)
Newberry 2012 (US)



Model
The following statistical model explains induced seismicity timeseries (red curve):

$$
\lambda\left(t, m \geq m_{0} ; \boldsymbol{\theta}\right)=\left\{\begin{array}{cl}
10^{a_{f b}-b m_{0} \dot{V}(t)} & ; t \leq t_{\text {shut-in }} \\
10^{a_{f b}-b m_{0} \dot{V}}\left(t_{\text {shut-in }}\right) \exp \left(-\frac{t-t_{\text {shut-in }}}{\tau}\right) & ; t>t_{\text {shut-in }}
\end{array}\right.
$$

Such model can be based on simple physics with $K$ the bulk modulus, $\Delta \sigma_{*}$ the background stress amplitude range and $\delta_{+}$ the seismicity activation density (Mignan, 2016), such that:

$$
a_{f b} \propto \log _{10}\left(\frac{\delta_{+} K}{\Delta \sigma_{*}}\right)+b m_{0}
$$

The exponential decay is representative of normal diffusion Cases where the stretched exponential function fits post-injection data better can be explained by subdiffusion in a fractal network of static traps (e.g., Grassberger \& Proccacia, 1982; Mignan, 2015),

## Postulate (Mignan, 2012)

Seismicity densities $\delta_{0}, \delta_{+}$and $\delta_{\text {. (background, acti- }}$ vation, quiescence) are controlled by the static stress step function

$$
\delta(\sigma)= \begin{cases}\delta_{-} & \text {if } \sigma<-\Delta \sigma_{*} \mid \\ \delta_{0} & \text { if } \sigma \leq\left|\Delta \sigma_{*}\right| \\ \delta_{+} & \text {if } \sigma>\Delta \sigma_{*}\end{cases}
$$

## Against Complexity

1) No proof of power-law universality (e.g. diffusion) 2) Power-laws can also be explained by geometry (King, 1983; Mignan, 2012)
2) No proof that rock lab. experiments can be ex trapolated to crust behaviour (different topologies)
3) Fails to predict observed seismicity control by a-value (volume change; predicts $b$-value control by increase of correlation length that is not observed) 5) Tendency for model complexification (hybrids...) 6) Parameters often elusive
(2) Closed-form Traffic Light System (Mignan et al., sub.)


3 -parameter set scattering in fluid injection experiments \& impact on project validation for different fluid injection scenarios (different mean flow rates \& distances-to-borehole).

Safety criterion
Fixed with respect to different safety metrics, such as individual risk (IR), economic loss, building damage or level of nuisance. Here, the safety criterion is fixed to $I R \leq 10^{-6}$ (i.e. the probability that a statistically average individual dies for the introduced hazard). This safety criterion can be converted in the magnitude space into a time-varying adaptative TLS threshold, $Y$, which will ensure that the acceptable level of risk is preserved at all time:

$$
\operatorname{Pr}\left(m \geq m_{\text {saf }}\right)=1-\exp \left\{-10^{a_{f b}-b m_{\text {saf }}}\left[V\left(t_{\text {shut } \text { in }}\right)+\tau \dot{V}\left(t_{\text {shut }-i n}\right)\right]\right\}=Y
$$

## Decision variable

A threshold earthquake magnitude $m_{t h}$ is used as decision variable. In particular, $m_{t h}$ is defined as the magnitude value for which mitigating actions (here stopping injection) must be taken, i.e.

$$
\left.m_{t h}=\frac{1}{b} \log _{10}\left[Y-10^{a_{f b}-b m_{s a f} \tau \dot{V}\left(t_{\text {shut }}\right. \text { in }}\right)\right]+m_{\text {saf }}
$$

See also poster by Broccardo et al., "A hierarchical bayesian model for controlling induced seismicity associated with geothermal exploration"

a. Observed (Basel); b. MLE values of ground parameters over time; c. Simulated version of Basel time series (in grey) and shorten (colored) when the TLS is applied; d. TLS validation over many simulations.
(3) Decision-making under uncertainty (Mignan et al., 2015; Mignan, sub.)


Hazard curves \& matching risk safety criterion for a planned EGS project: Should the project go ahead?


Induced seismicity $M_{\max }$ ambiguity: McGarr deterministic value $\left(M_{\max } 3.6\right)$ o tectonic null-hypothesis ( $M_{\max }^{\max } 7.0$ ?

## Cost-benefit analysis for EGS life cycle (simplified case)

Drilling costs of $\$ 11$ million/well, earnings of $\$ 24$ million ( $1.5 \mathrm{MW}, 30$ years, $7 ष / \mathrm{kWh}$ ) Life cycle: 1. injection well, 2. stimulation+TLS (pass/fail), 3. production well, 4. production

## Tools of decision-making under uncertainty (simplified case)

Uncertainty on $a_{t 1}$ can be reduced to second-order probability while $M_{\text {max }}$ represents pure uncertainty (not reducible)
Actions $a_{1}$ (cancel) and $a_{2}$ (approve project) combined to states $s_{1}$ (safety criterion respected) and $s_{2}$ (not respected) lead to the outcomes (million $\$$ ): $a_{1}\left(s_{1}\right)=0, a_{1}\left(s_{2}\right)=0, a_{2}\left(s_{1}\right)=2$ (i.e., final profit) and $a_{2}\left(s_{2}\right)=-11$ (i.e., project stopped before second drilling phase)

For a risk-neutral stakeholder (linear utility function), maximizing expected value leads to $a_{2}$ for $M_{\max }=3.6$ fixed and a for $M_{\max }=7.0$ fixed. To take into account $M_{\max }$ ambiguity, an am-biguity-averse stakeholder would ${ }^{\text {max }}$ use the maximin method, leading tox $a_{1}$ while the maximax method (ambiguity-seeking stakeholder) would lead to $a_{2}$, showing how subjectivity influences the decision process.

## References

Grassberger \& Proccacia (1982), The long time properties of diffusion in a medium with static traps, J. Chem. Phys., 77, 6281-6284
King (1983), The Accomodation of Large Strains in the Upper Lithosphere of the Earth and Other Solids by Self-similar Fault Systems: the Geometrical Origin of b-Value, PAGEOPH, 121, 761-815
Mignan (2012), Seismicity precursors to large earthquakes unified in a stress accumulation framework, Geophys. Res. Lett., 39, L21308
Mignan (2015), Modeling aftershocks as a stretched exponential relaxation, Geophys. Res. Lett., 42, 9726-9732
Mignan (2016), Static behaviour of induced seismicity, Nonlin. Processes Geophys., 23, 107-113
Mignan, Mitigating Extreme Earthquakes: The "History, Risk, Prediction" Motto, submitted 2017
Mignan et al. (2015), Induced seismicity risk analysis of the 2006 Basel, Switzerland, Enhanced Geothermal System project: Influence of uncertainties on risk mitigation, Geothermics, 53, 133-146
Mignan et al., When is anthropogenic seismicity too risky?, submitted 2017

