



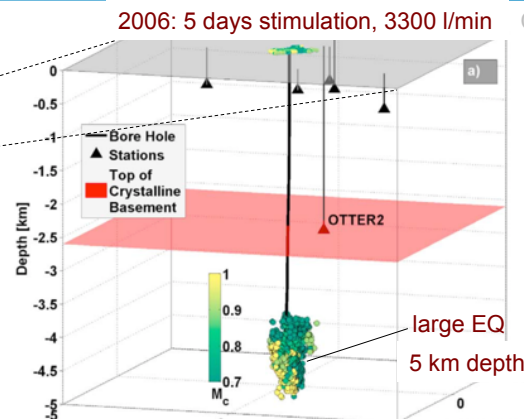
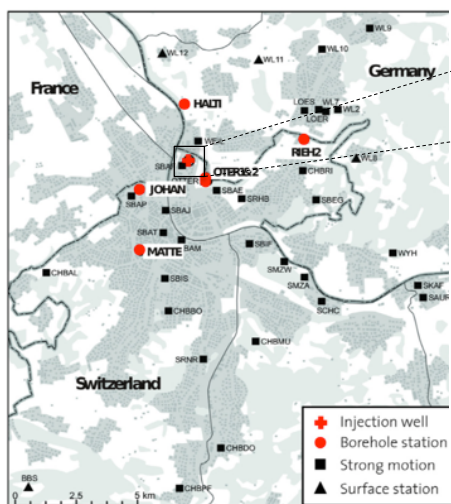
Earthquakes close to anthropogenic activities: statistical discrimination without statistics ?

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GFZ German Research Centre for Geosciences

3rd Induced Seismicity Workshop, 5-9 March 2019 Schatzalp, Davos, Switzerland

The 2006 M_L 3.4 Basel induced by deep hot rock stimulation



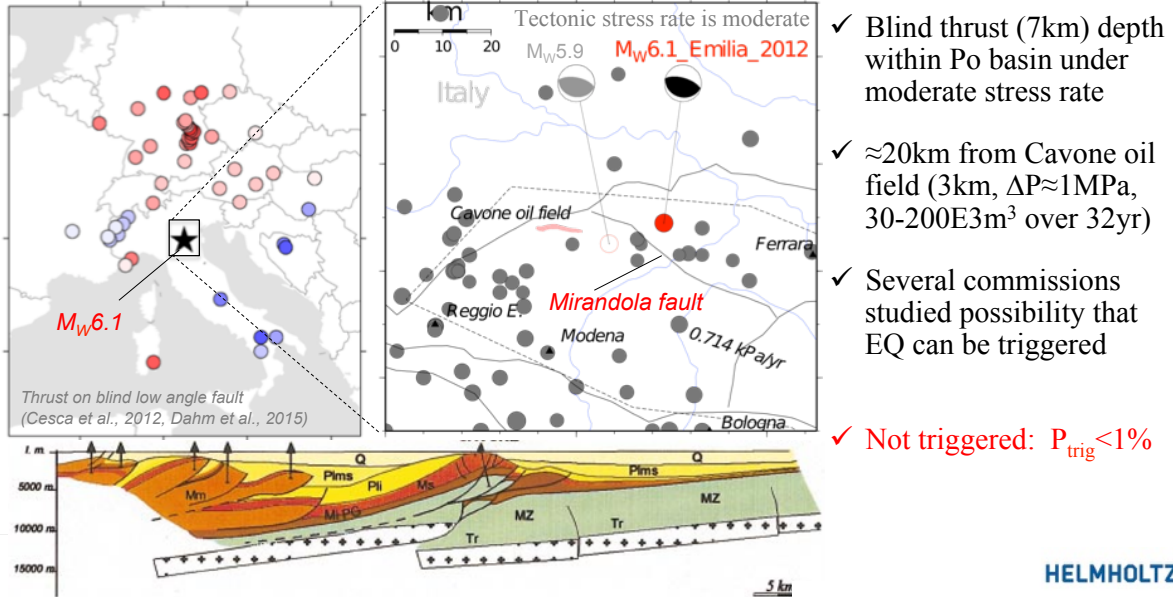
Consequences:

- ✓ project stopped in 2009
- ✓ loss of investment ≈56 Mio CHF

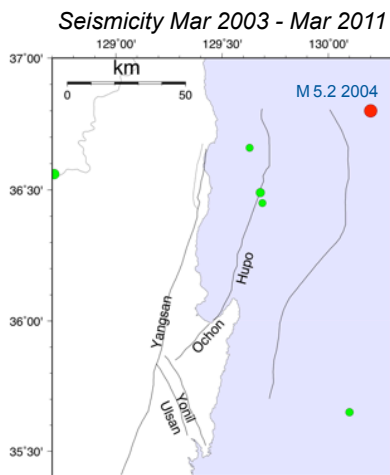
- ✓ seismic cloud growing in planar structure
- ✓ $M_L \leq 3.5$ mostly during shut-in
- ✓ EQ are fluid-triggered by $P_{trig} > 95\%$

e.g. Bachmann et al. (2012)

The 2012 M_W 6.1 Emilia EQ close to the Cavone oil field

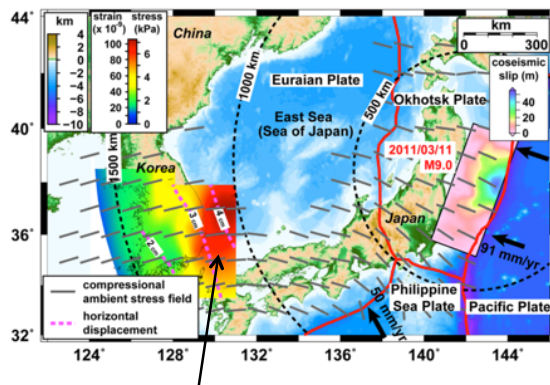


S-Korea – far-distance stress shadow from 2011 Tohoku M_W 9 ?



Is there a clock advance effect after 2011?

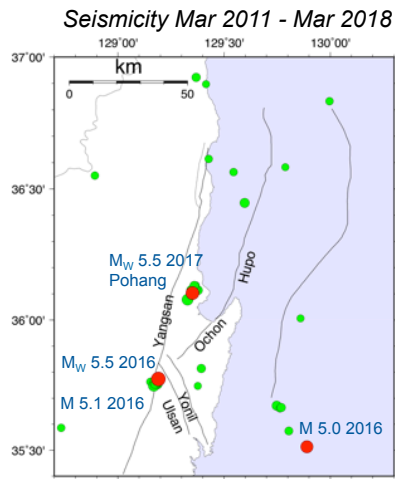
Hong et al. (2018)



region of increased stress

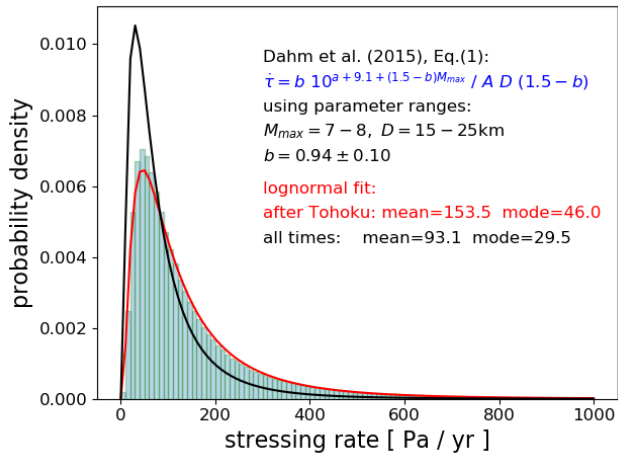
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S-Korea – far-distance stress shadow from 2011 Tohoku M_W 9?



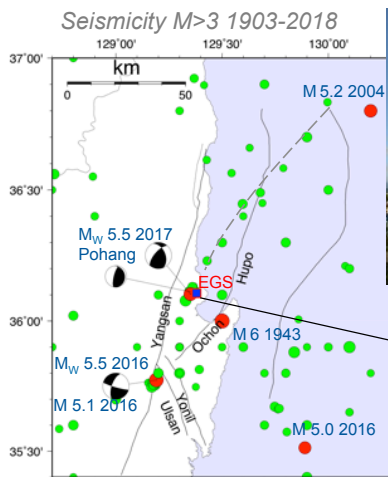
... four $M > 5$ EQ in 2016 - 2017

Stress rate estimated from seismic catalog before and after Tohoku



$$\text{Kostrov (1975)} \quad \dot{\tau} = \frac{\langle M_0 \rangle \cdot n / \text{yr}}{V}$$

Pohang 2017 M_W 5.5 – induced, triggered or natural ?

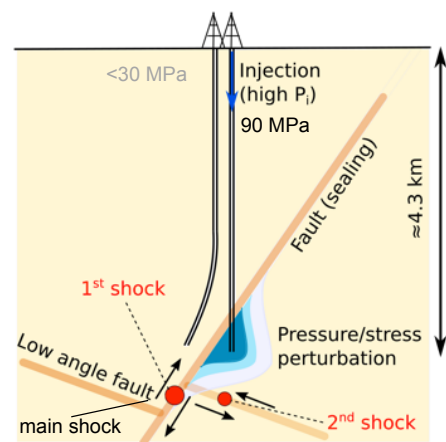
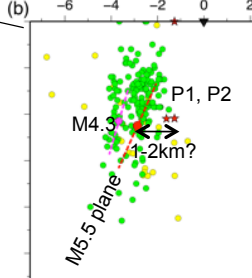


Grigoli et al., 2018



- Hypocenter close to EGS injections
- Injection volume small compared to M
- Injection stopped 58 days before EQ

along profile in km



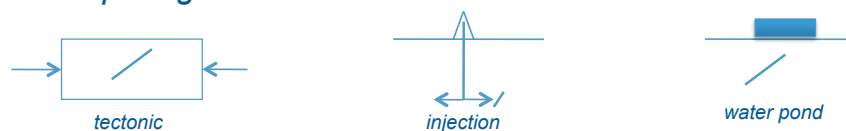
Pohang 2017 – a key test for attribution models

- ① Tectonic stress rate increased after the Tohoku 2011
- ② Pohang EQ is shallow and close to injection operation (but “too large” and 58 days after shut-in)

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Discrimination: approaches

Attribution: comparing causal factors relative contribution to the EQ triggering



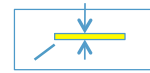
- **Seismic clouds:** is seismicity correlating with (human) forcing ?
- **Single (extreme) event:**
 - is it very close to anthropogenic activity ?
 - are there non-tectonic earthquake characteristics ?
(origin time at noon, collapse-type, very shallow, ...)
 - *probabilistic attribution* of relative causal factors to extreme EQ

Extreme event probabilistic attribution

Causal factors: (1) tectonic Coulomb stress rate $d\sigma_c/dt$



(2) anthropogenic stressing



Probabilistic attribution (adapted from climate research):

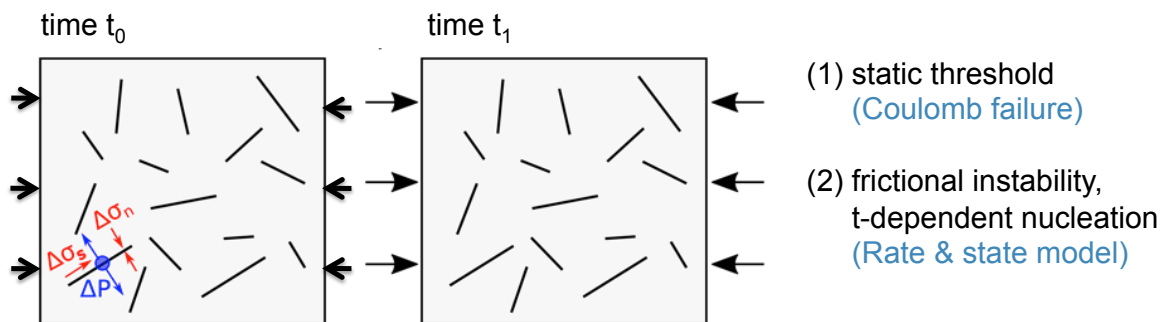
a) physics-based seismicity model to assess **relative contribution**

(1) theoretical EQ rate r^T from tectonic stressing

(2) theoretical EQ rate r^I from human action

b) assigning **statistical confidence** that the EQ was human-triggered

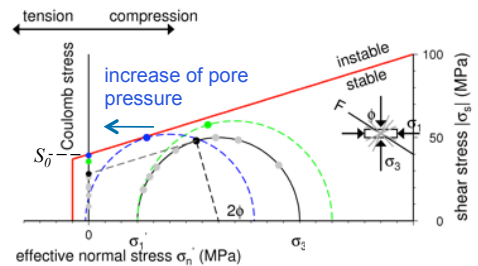
Physics-based seismicity model



Coulomb stress (fault orientation, slip)

$$\sigma_c = |\sigma_s| + \mu(\sigma_n + P_p) \leq S_0$$

rock matrix contribution pressure contribution



Discrimination method – theory

Dahm et al., 2015, JGR

We use rate & state and input $A\sigma$ and $\Delta\sigma_C$ to calculate:

- tectonic background rate r^T : e.g. from historical seismicity
- human related rate $r^I = r^I(x,t,\Theta)$: from “human forcing” model

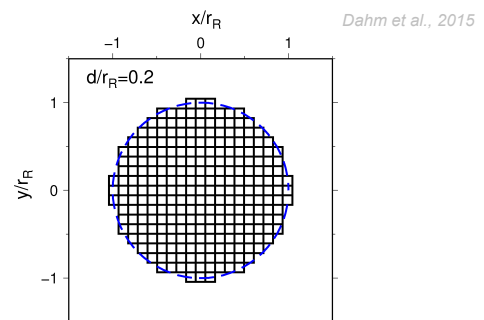
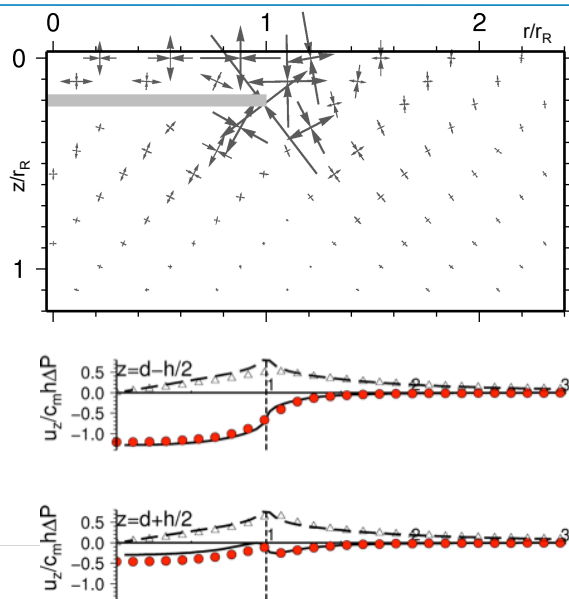
The triggered is:
$$p(\text{triggered} \mid \vec{x}, \Theta) = \frac{r^I}{r^I + r^T} = \frac{1}{1 + \frac{r^T}{r^I}(\vec{x}, \Theta)}$$

injection-related EQ rate
 $r^I = r - r^T$

tectonic EQ rate

location & model parameter

Example: reservoir depletion - BEM calculation, nuclei of strain

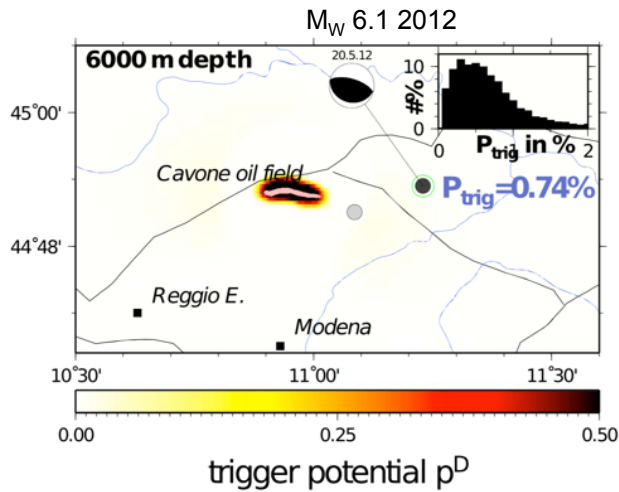


model parameter:

- pore pressure drop ΔP
- elastic parameter c_m
- field thickness h

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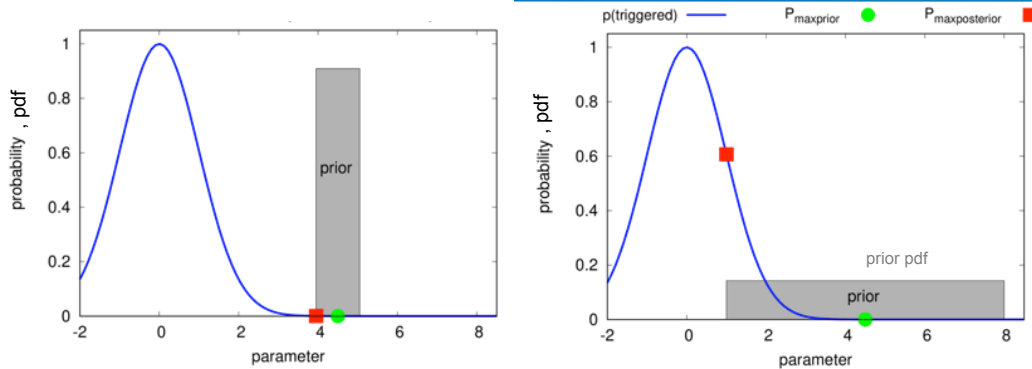
Case study: Emilia oil field



$P_{trig} = < 1\%$

Dahm et al., 2015

How to handle uncertainties – two questions ?



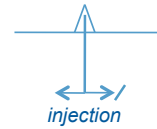
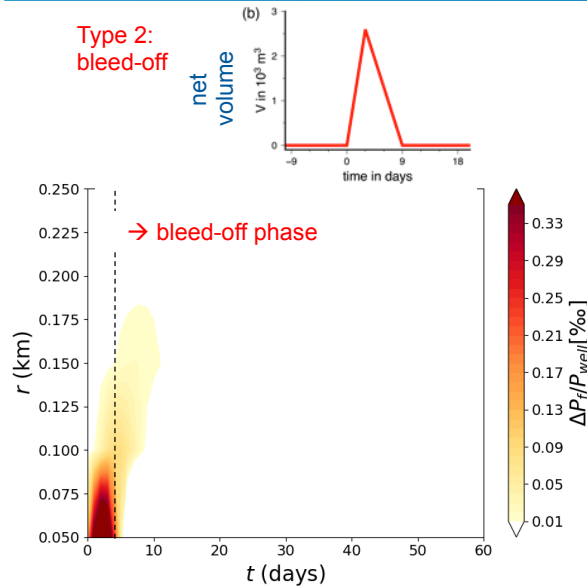
(1) What is the most likely p_{trig} (weighted integral – or p at mode of prior) ?

→ $P_{maxprior}$

(2) Can we exclude the EQ was triggered (maximum of posterior) ?

→ $P_{maxposterior}$ (expert commissions evaluation ?)

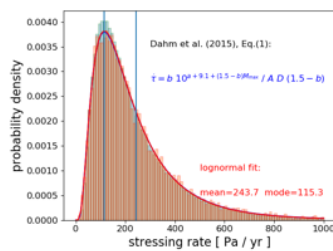
Example: short-term water injection – ΔP_f diffusion



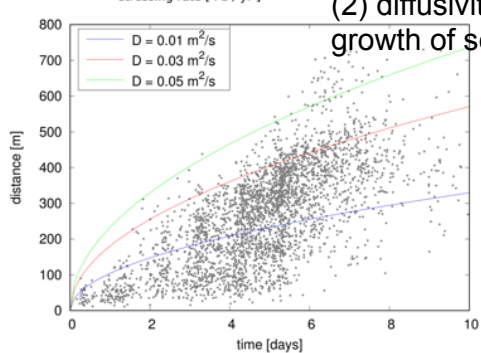
- ✓ ΔP_f perturbation is finite but shows after-growth
- ✓ diffusion time is controlled by hydraulic diffusivity

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Case study: 5 days stimulation beneath Basel



(1) tectonic stressing rate

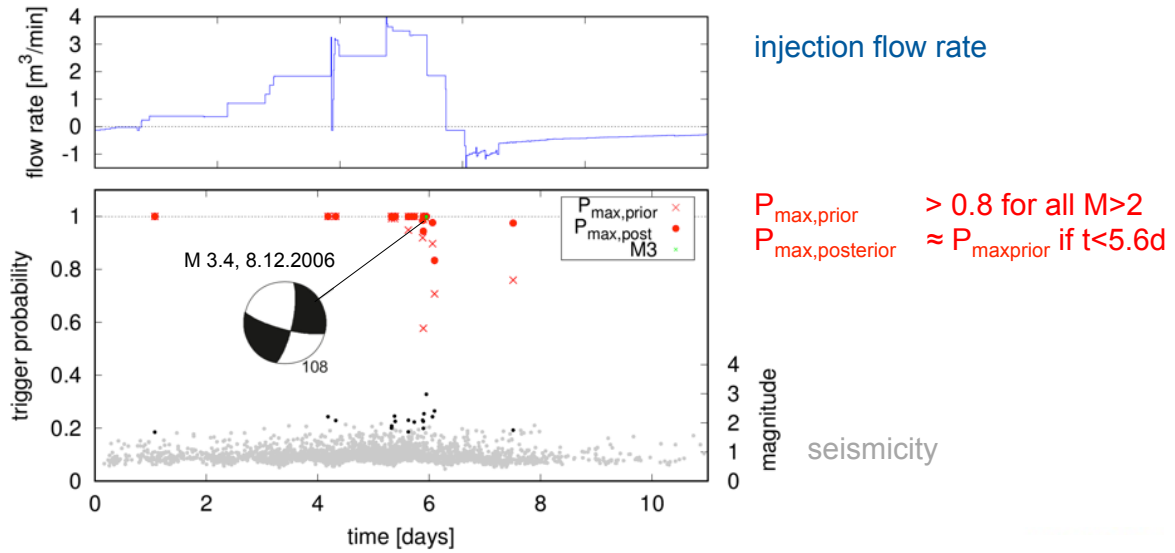


(2) diffusivity from growth of seismic cloud

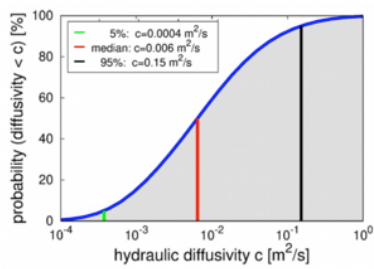
(3) assumed parameter uncertainties

Parameter	Mode	[min, max], ±std	D
EQ relative location SED catalogue			
x, y, z in [km]	SED catalog	±0.1	n
EQ mechanism			
see Deichmann & Giardini (2009)		±10°	n
Rock and fluid parameter			
Frict. coeff. f	0.68	[0.5, 0.85]	u
Biot-Willies α	0.5	[0.1, 0.9]	u
Skempton α	0.5	[0.1, 0.9]	u
Poisson ν (drained)	0.245	[0.20, 0.29]	u
Poisson ν_u (undr)	0.3	[0.29, 0.31]	u
Rigidity \mathcal{N} [GPa]	17.5	[5, 30]	u
Fluid viscosity η [Pa s]	$3.5 \cdot 10^{-4}$	$[3, 4] \cdot 10^{-4}$	u
Permeability κ [mD]	0.1	[0.05, 0.5]	lg
Diffusivity c [m ² /s]	0.03	s±0.01	
Seismicity model parameter			
frict. value $A\sigma$ [MPa]	0.03	[0.01, 0.05]	u
tect. stress $\dot{\tau}$ [Pa/yr]	186.7	see figure	lg

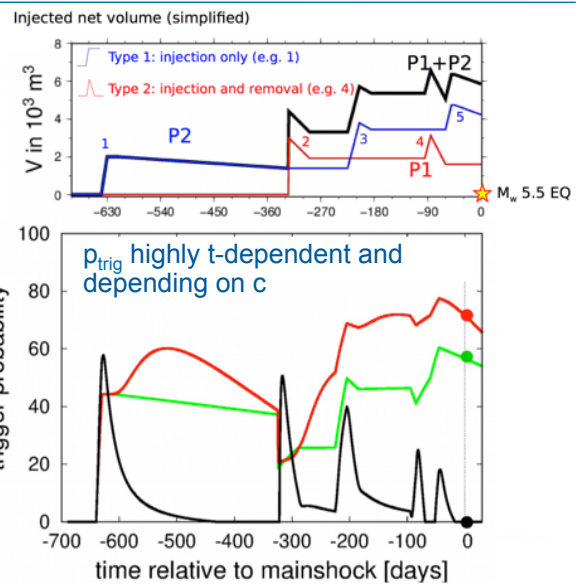
Trigger probabilities for M>2 earthquakes



Example: the late M_w 5.5 Pohang earthquake



$f = 0.65$ # friction coefficient
 Strike=223 # [degree]
 Dip = 70
 Rake = 127
 $\alpha = 0.4$ # Biot-Willies coefficient
 $\nu = 0.25$ # drained Poisson ratio
 $\nu_u = 0.30$ # undrained Poisson ratio
 $N = 20$ # Shear modulus [GPa]



Summary of case studies

Event	P_{maxprior}	$P_{\text{maxposterior}}$	Reference
- quasi-static reservoir depletion -			
M_W 4.3 2001 Ekofisk	>99%	-	<i>Dahm et al. (2015)</i>
M_W 4.4 2004 Rotenburg	≈70%	-	<i>Dahm et al. (2015)</i>
M_W 6.1 2012 Emilia	<1%	-	<i>Dahm et al. (2015)</i>
- time-dependent "injection" -			
M_W 6.1 1976 Tjörnes fracture zone	>90%	-	<i>Passarelli et al. (2011)</i>
M_W 3.4 2006 Basel	99%	>95%	
M_W 5.5 2017 Pohang			<i>in prep.</i>

Probabilistic attribution approach is flexible to be applied to different problems

Conclusion

- ✓ Expert panel reports usually assess the $P_{\text{maxposterior}}$
(assess whether triggering can be excluded assuming it was triggered)
- ✓ The likelihood to be triggered (mode, P_{maxprior}) is smaller than $P_{\text{maxposterior}}$
- ✓ We suggest to report both measures, as purely statistical bounds are more difficult to communicate