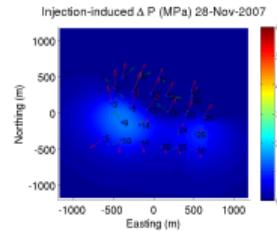


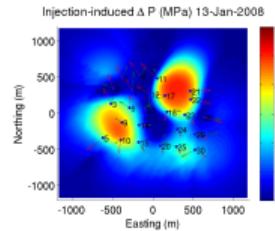
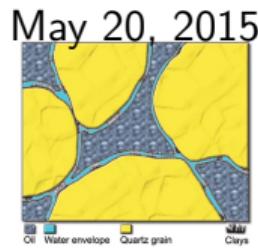
Monitoring of cyclic steam stimulation by inversion of surface tilt measurements

Methodology and results

Musa Maharramov, Mark Zoback, and Stewart Levin



Stanford Exploration Project

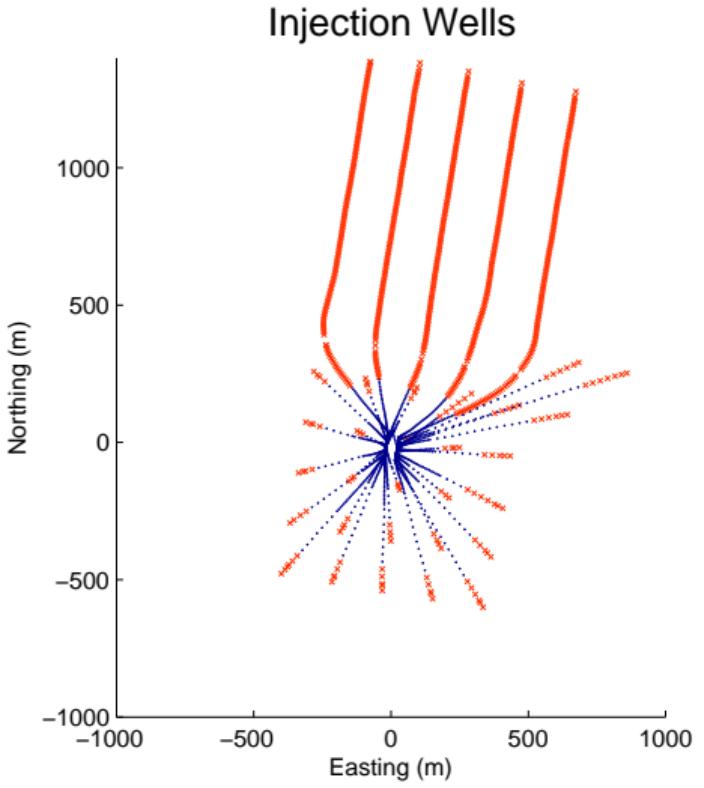




Motivation: improved reservoir monitoring

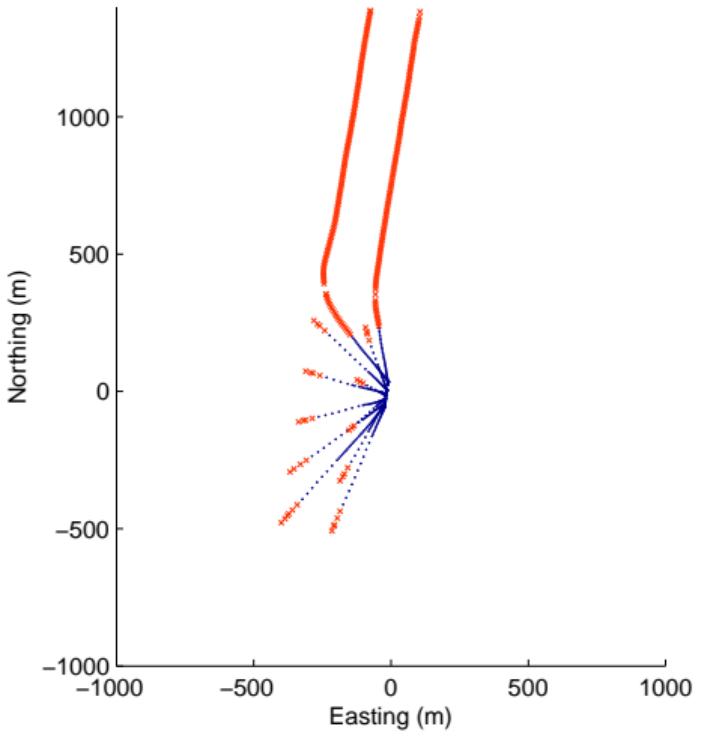
- Extraction of heavy oil from deep formations relies on Cyclic Steam Stimulation (CSS) or Steam-Assisted Gravity Drainage (SAGD).
- Effective steam injection requires understanding pressure front propagation and reservoir heterogeneity.
- Goal: design a robust computational framework for estimating pressure fronts from measurable surface deformation.

A heavy oil reservoir undergoing a 60-day steam injection



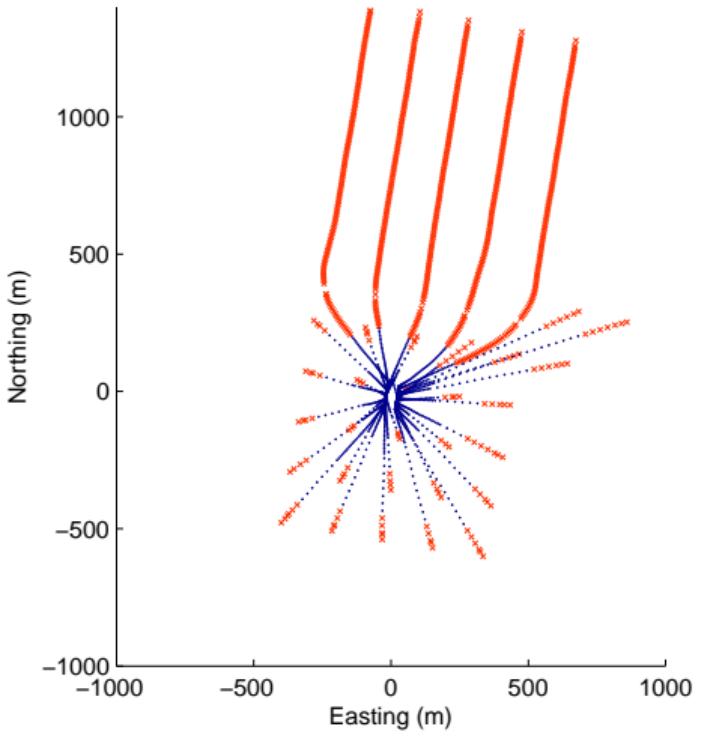


Injection Wells



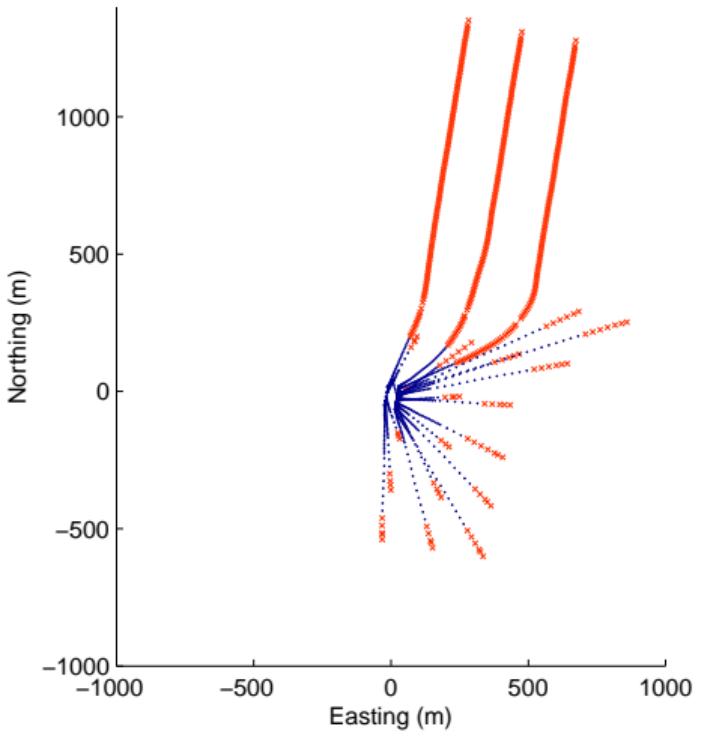


Injection Wells





Injection Wells





Linear Poroealstic Medium Deformation

Relate deformation and pore pressure change using Biot's theory (Rice and Cleary, 1976; Segall, 1985; Segall, 2010):

$$\mu \nabla^2 u_i + \frac{\mu}{1-2\nu} \frac{\partial^2 u_j}{\partial x_i \partial x_j} = \boxed{\alpha \frac{\partial p}{\partial x_i}} - f_i = 0, \quad i = 1, 2, 3, \quad (\text{ELAST})$$

and

$$S_\alpha \frac{\partial p}{\partial t} - \frac{\kappa}{\eta} \nabla^2 p = -\alpha \frac{\partial}{\partial t} (\nabla \cdot \mathbf{u}), \quad (\text{FLOW})$$

where \mathbf{u} is displacement, p is the pore pressure change, f_i is a differential body-force distribution, μ, ν, α, κ , and η are the shear modulus, Poisson's ratio, Biot coefficient, permeability, and fluid viscosity;

$$S_\alpha = \frac{3\alpha(1-2\nu)(1-\alpha B)}{2\mu B(1+\nu)}, \quad (\text{STORAGE})$$

where B is Skempton's coefficient.



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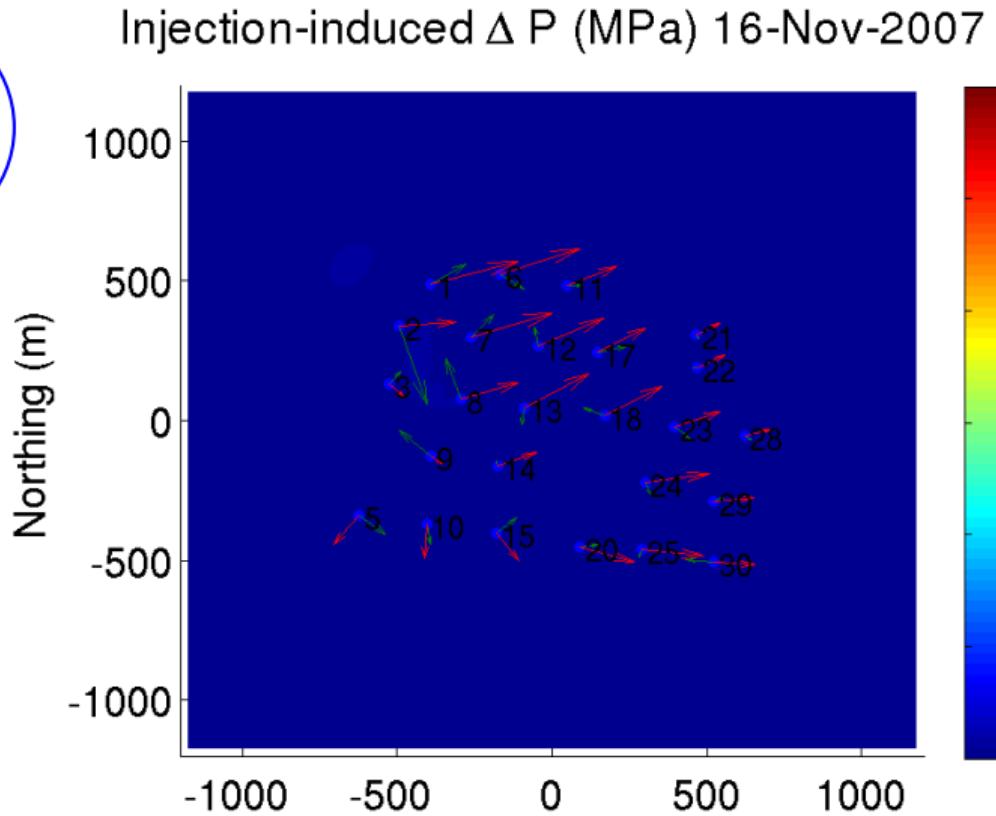
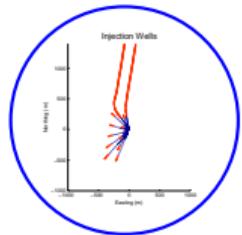


Methodology

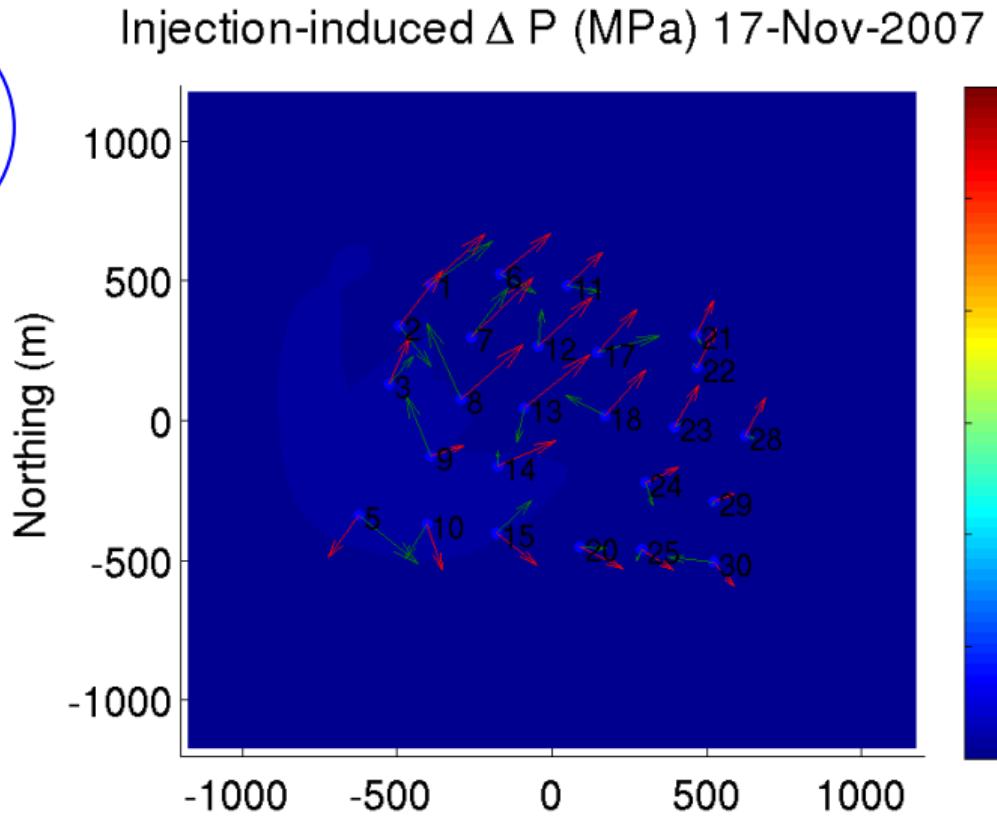
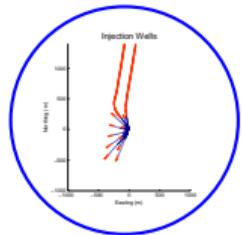
- Regard (ELAST) as a deformation modeling operator $\mathbf{A}p = \mathbf{u}$ and **decouple** it from the flow equation (FLOW) (Vasco et al., 2000; Du and Olson, 2001; Hodgson, 2007).
- Solve the **regularized** constrained optimization problem

$$\|\mathbf{A}p - \mathbf{u}\|_{L_2}^2 + \epsilon \|\Delta p\|_{L_2}^2 \rightarrow \min, \quad 0 \leq p \leq p_{\max}. \quad (\text{BOUNDRREG})$$

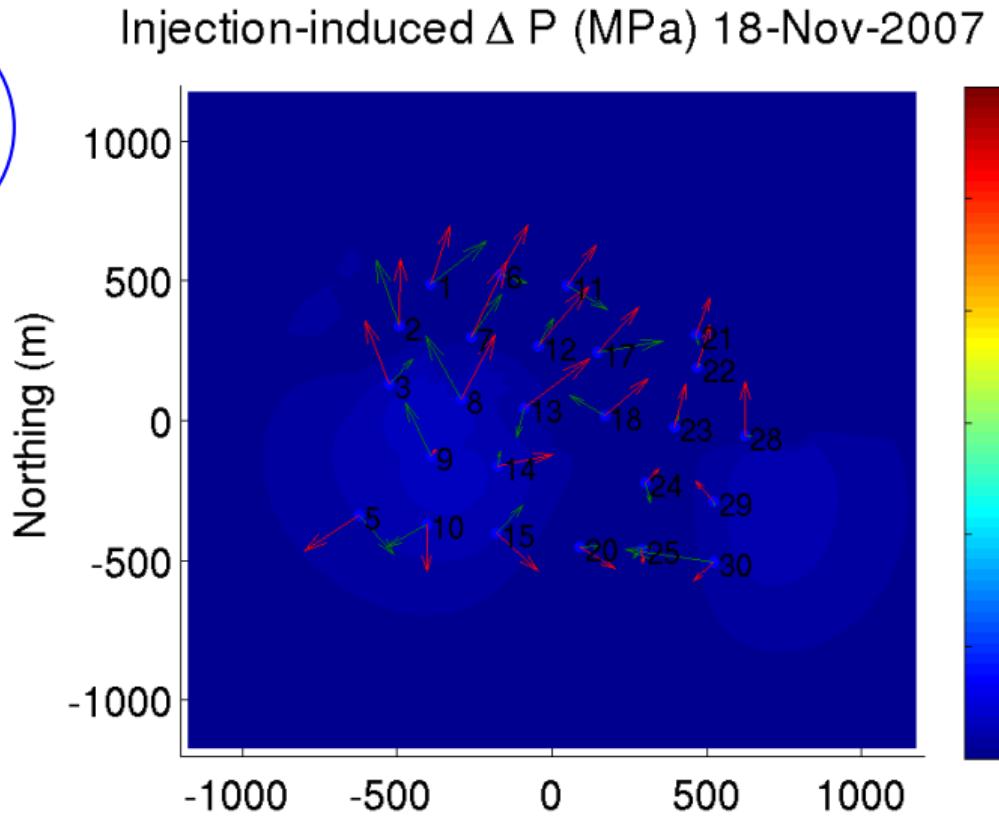
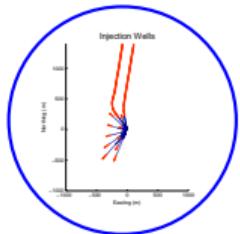
Inverted pore pressure change, $\epsilon = 10^{-3}$



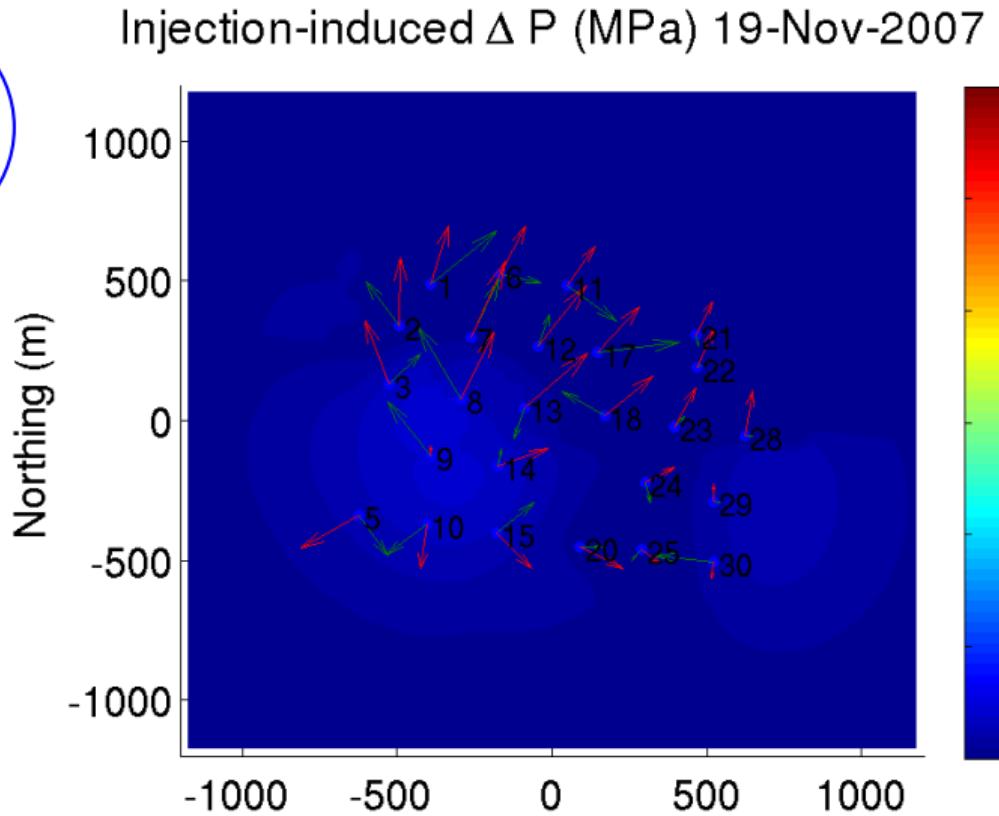
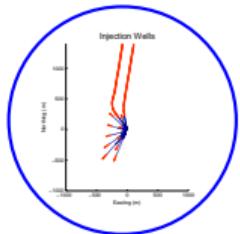
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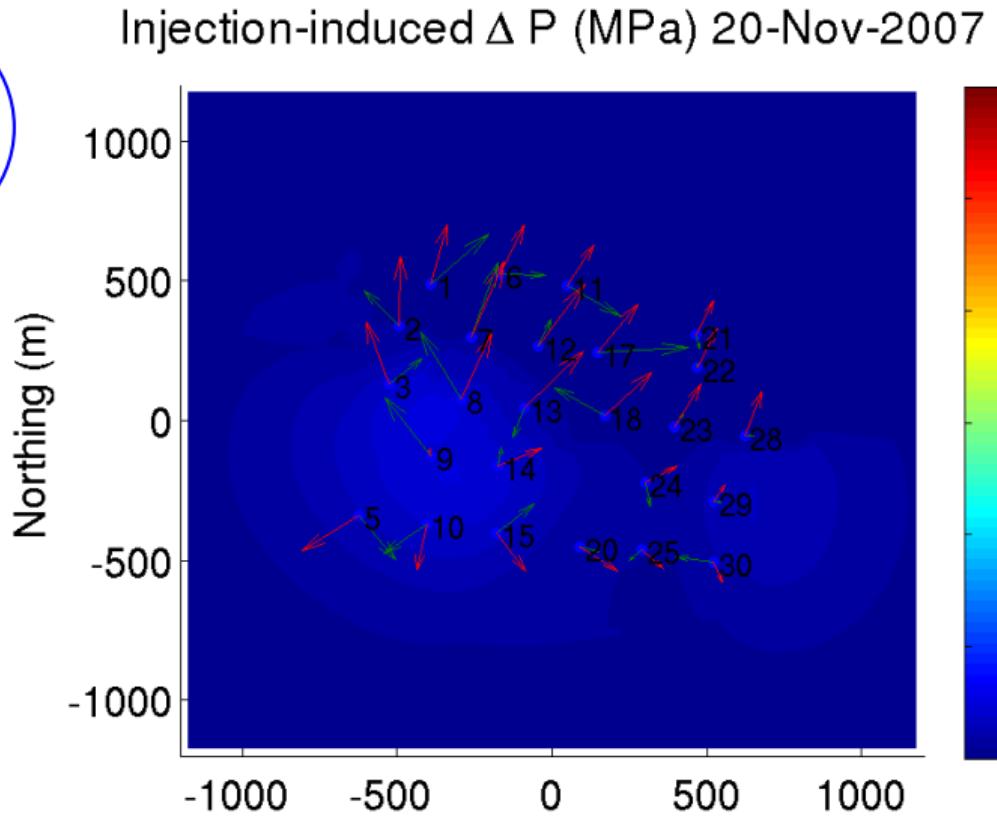
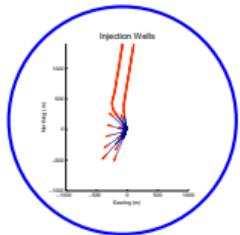
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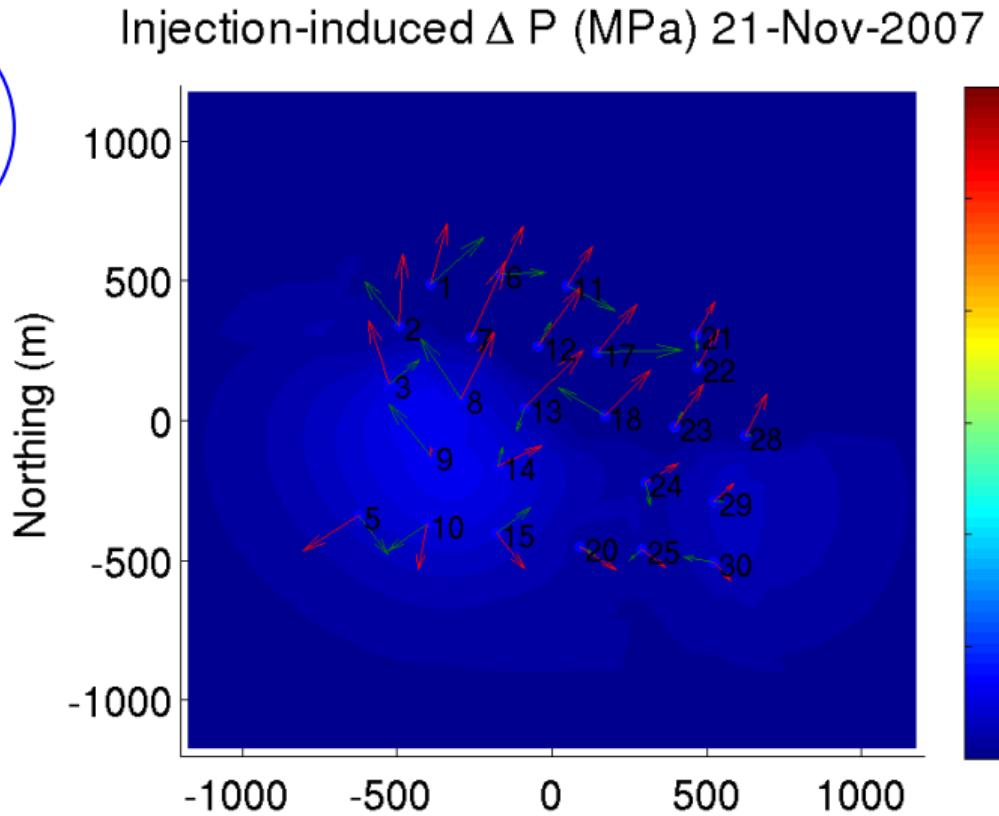
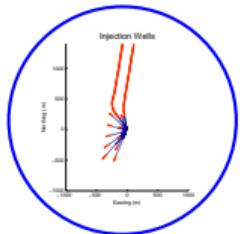
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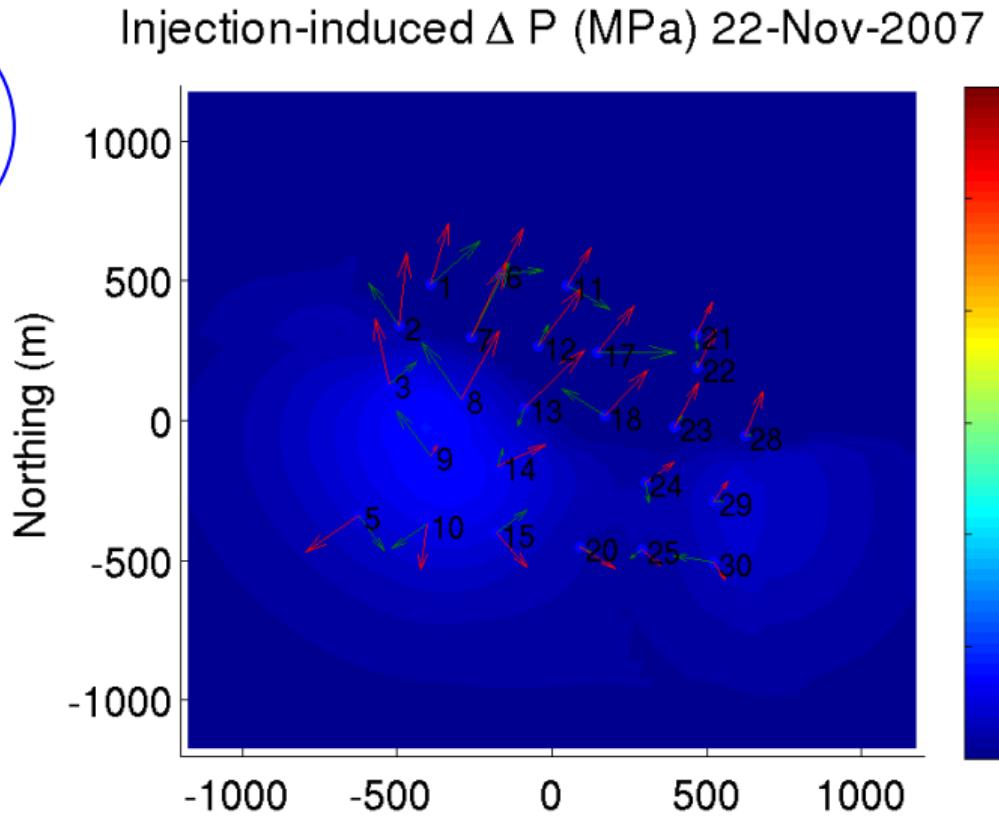
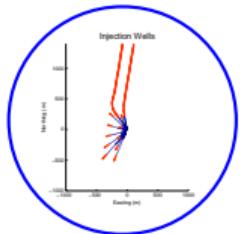
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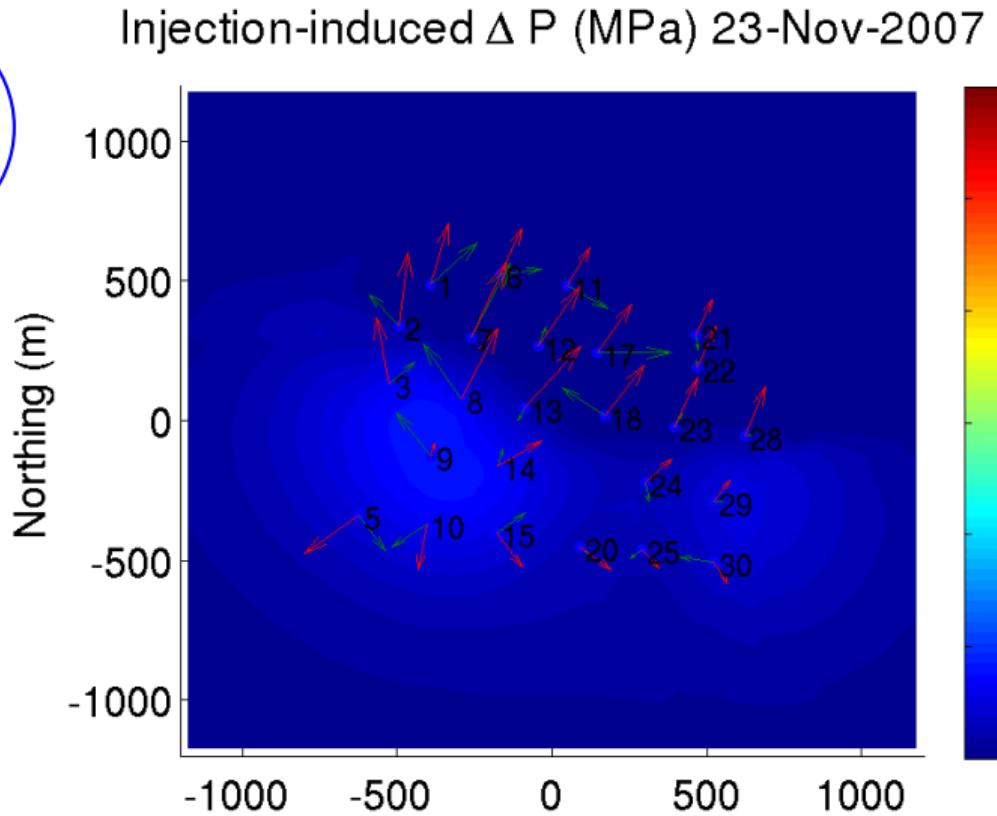
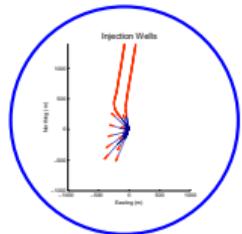
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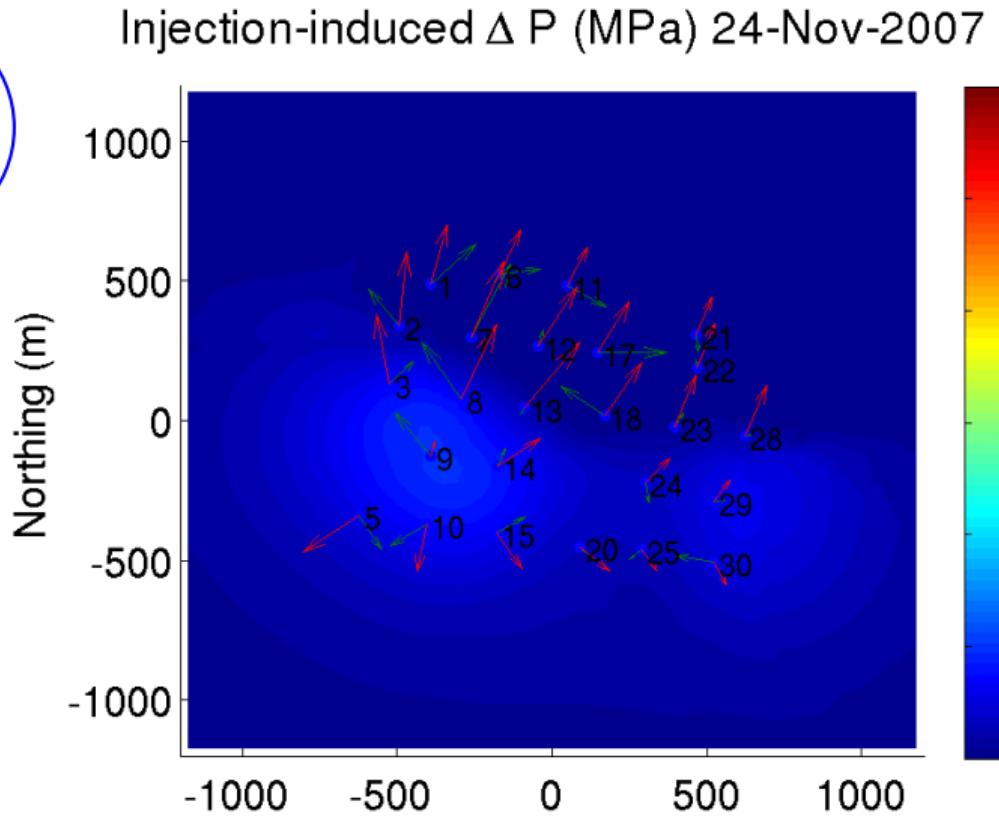
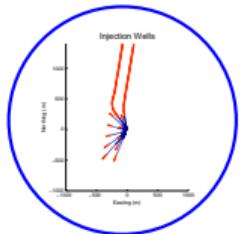
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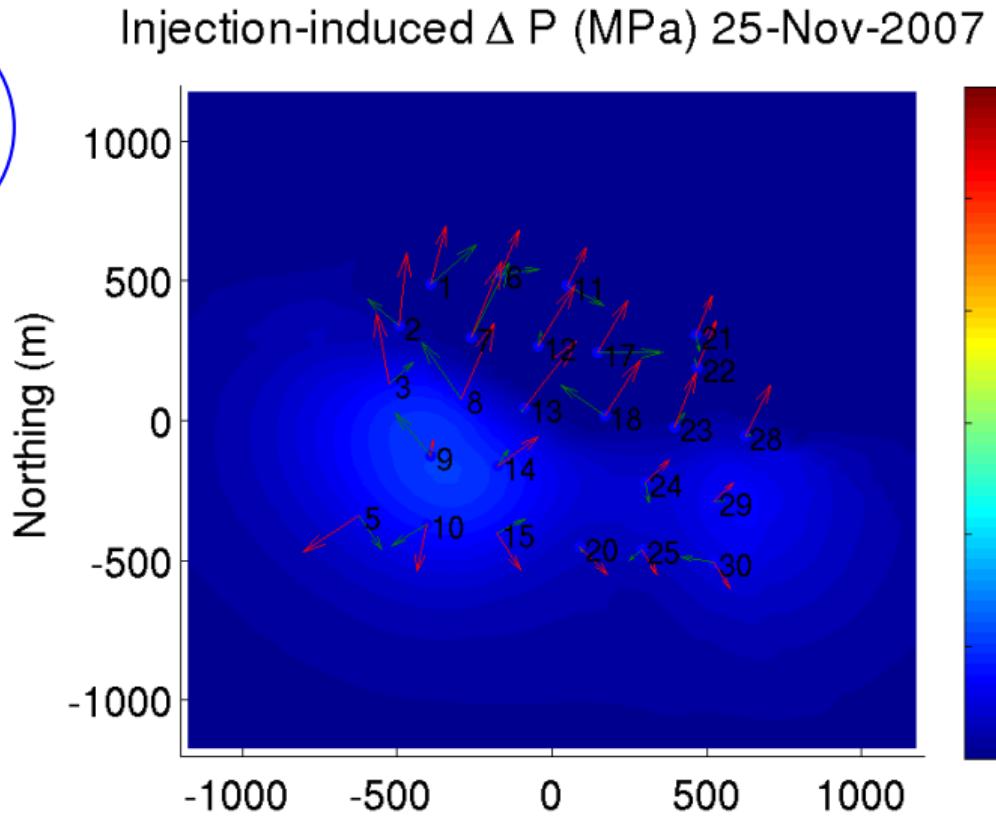
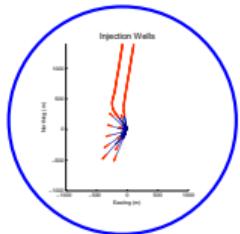
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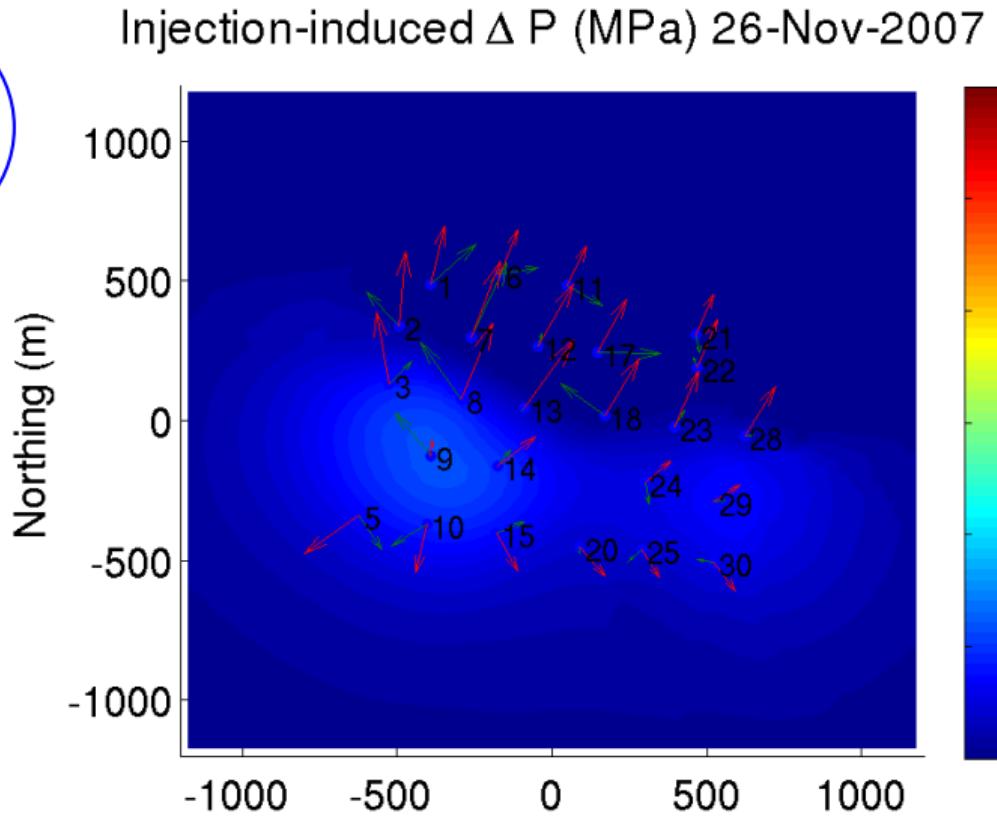
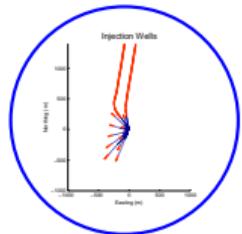
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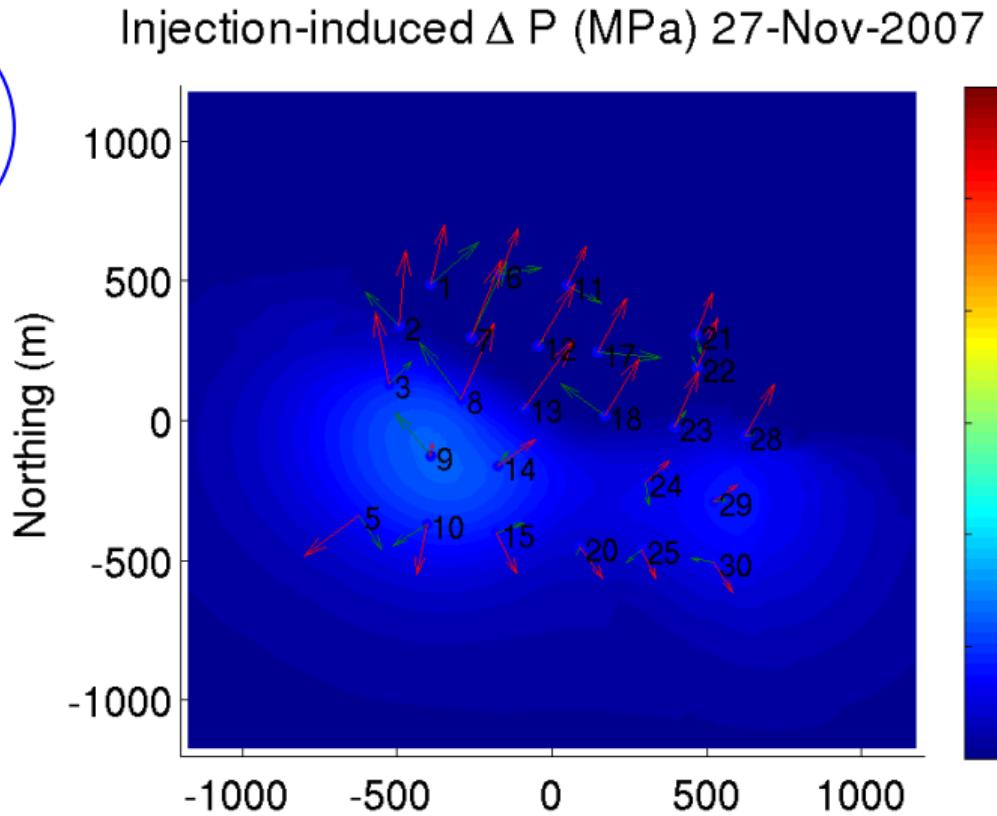
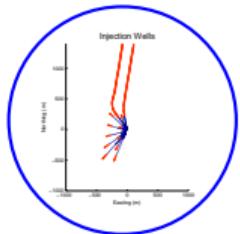
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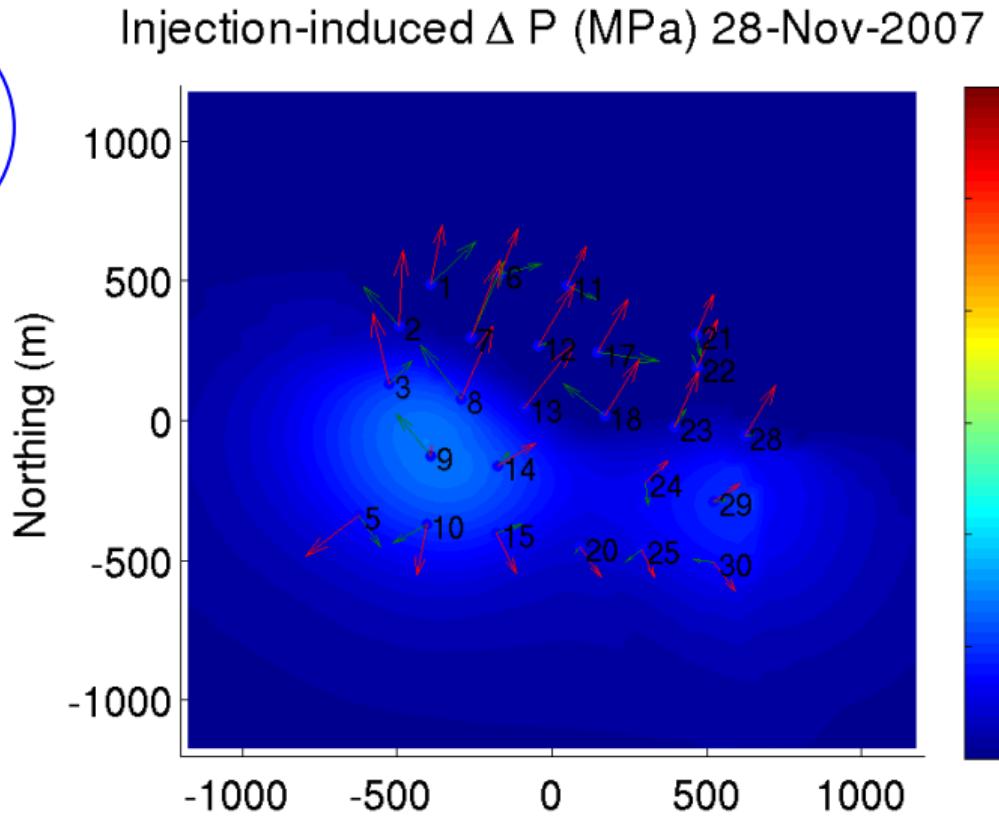
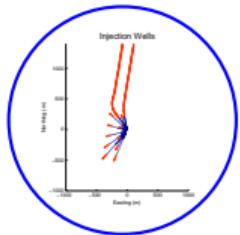
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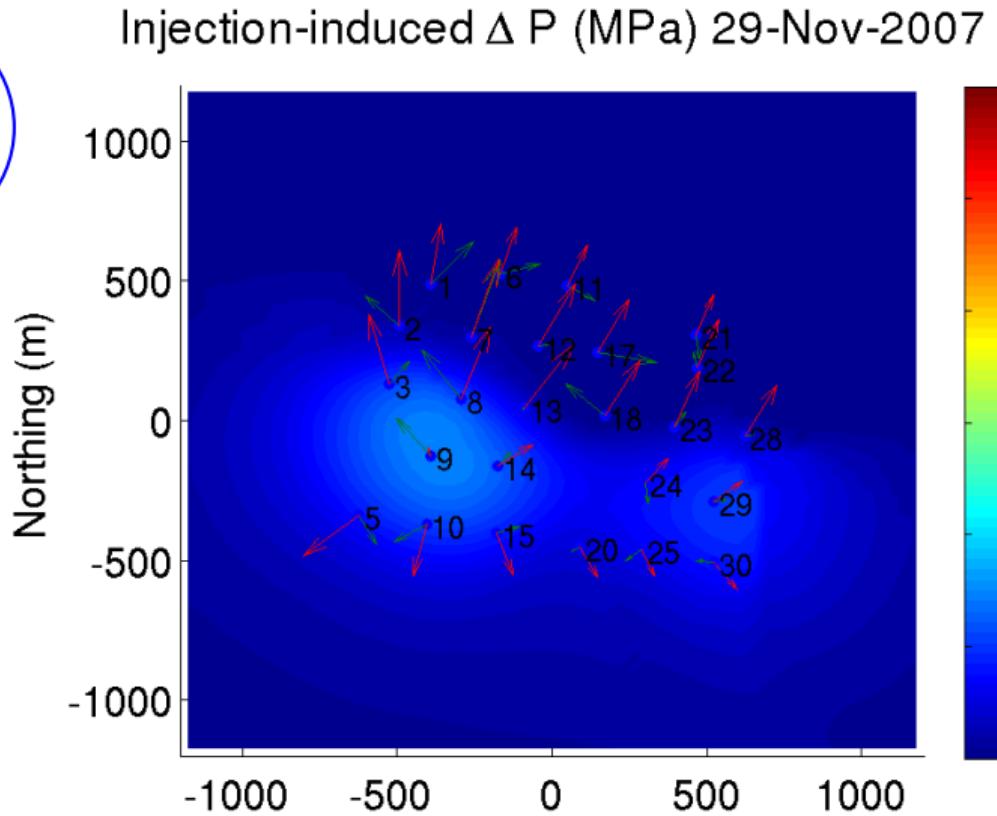
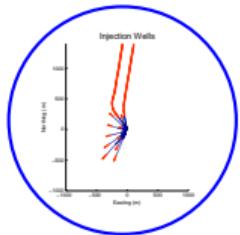
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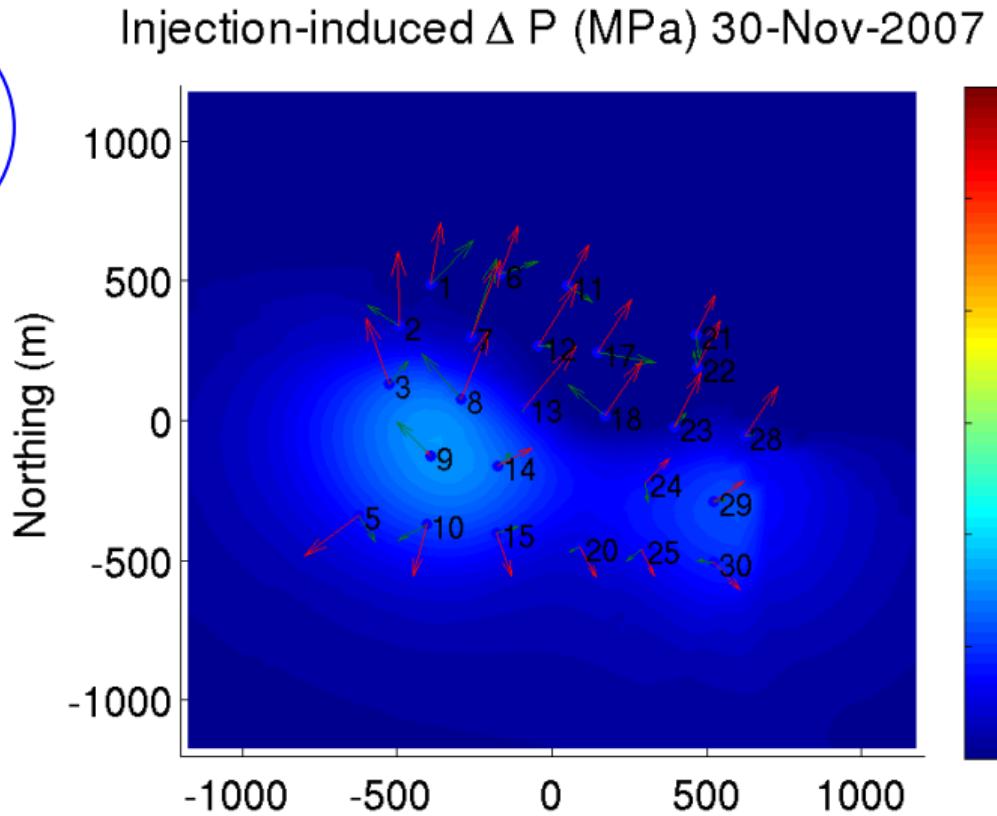
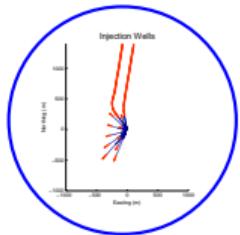
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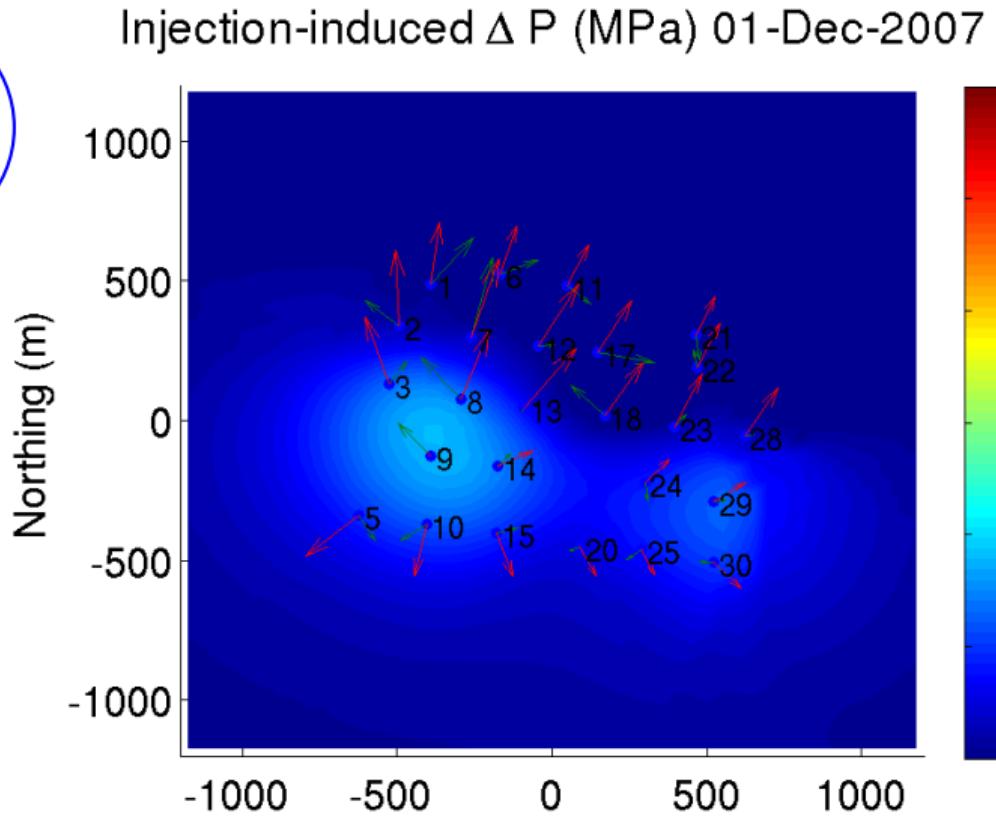
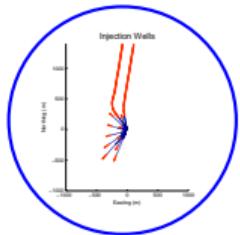
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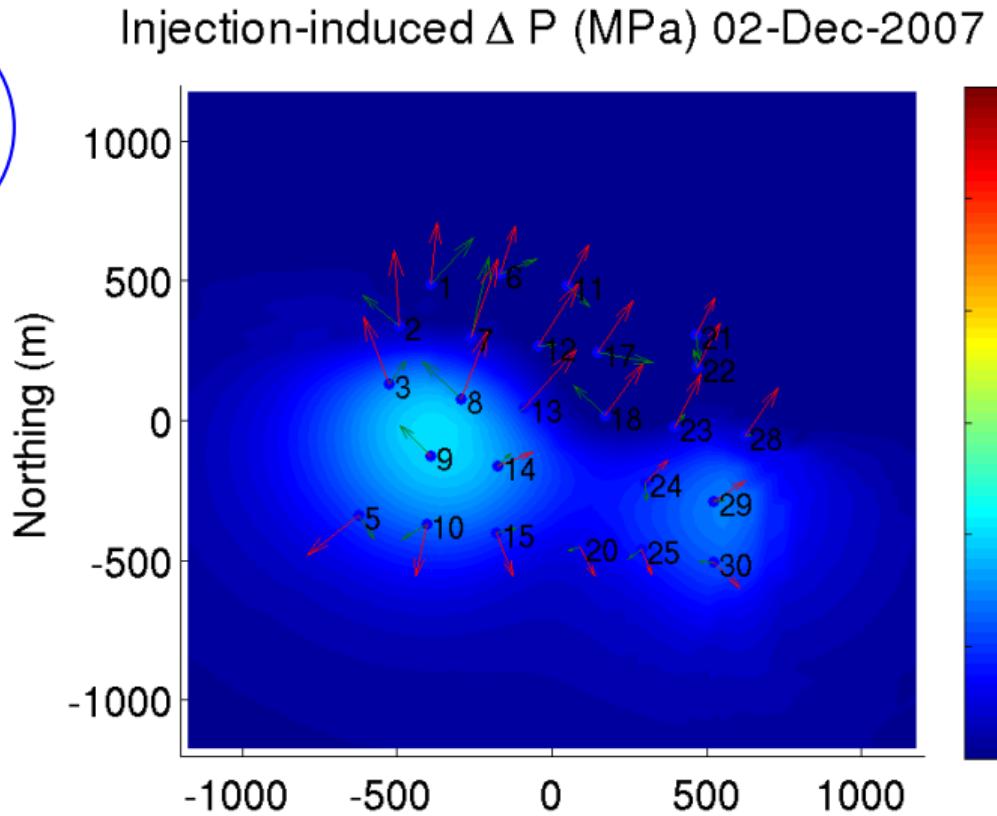
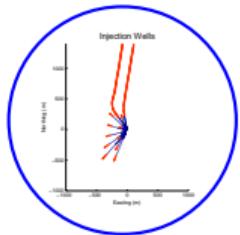
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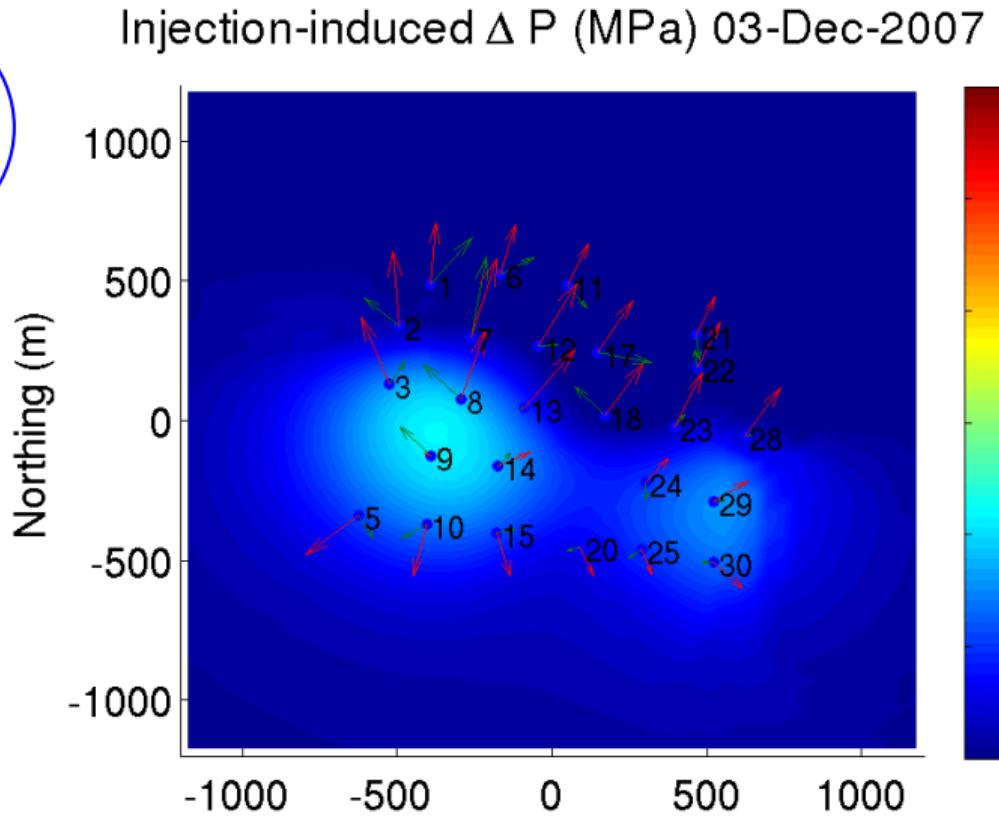
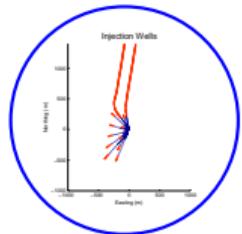
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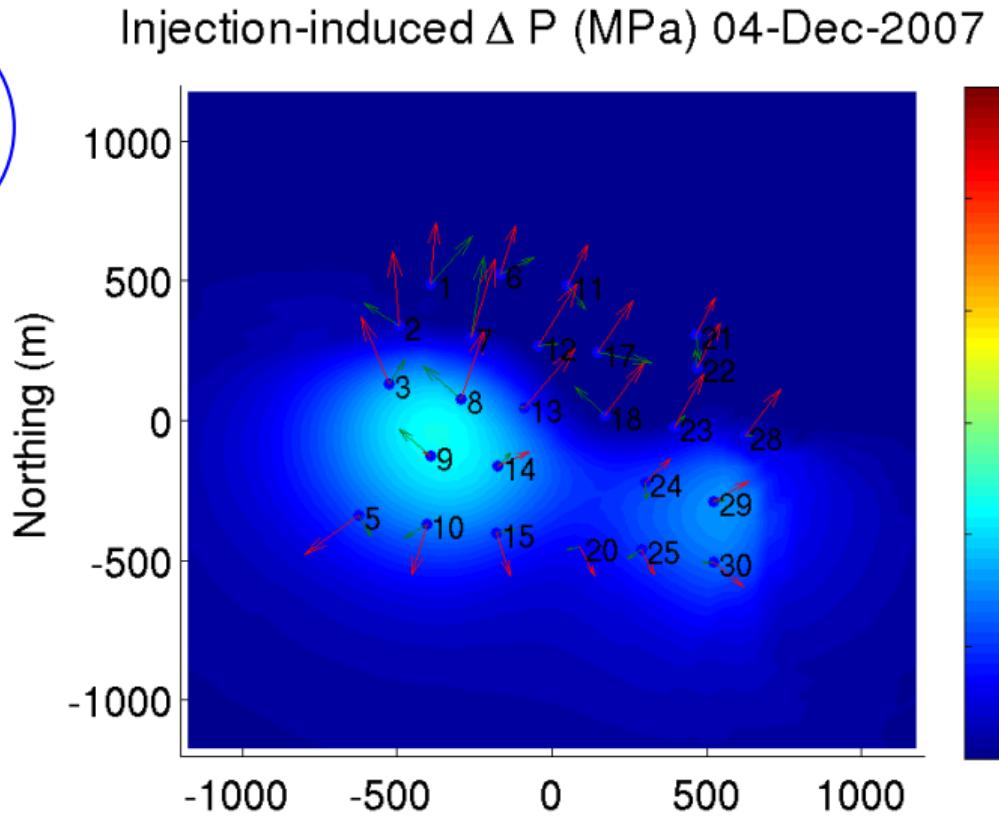
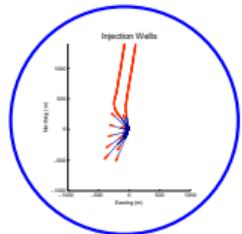
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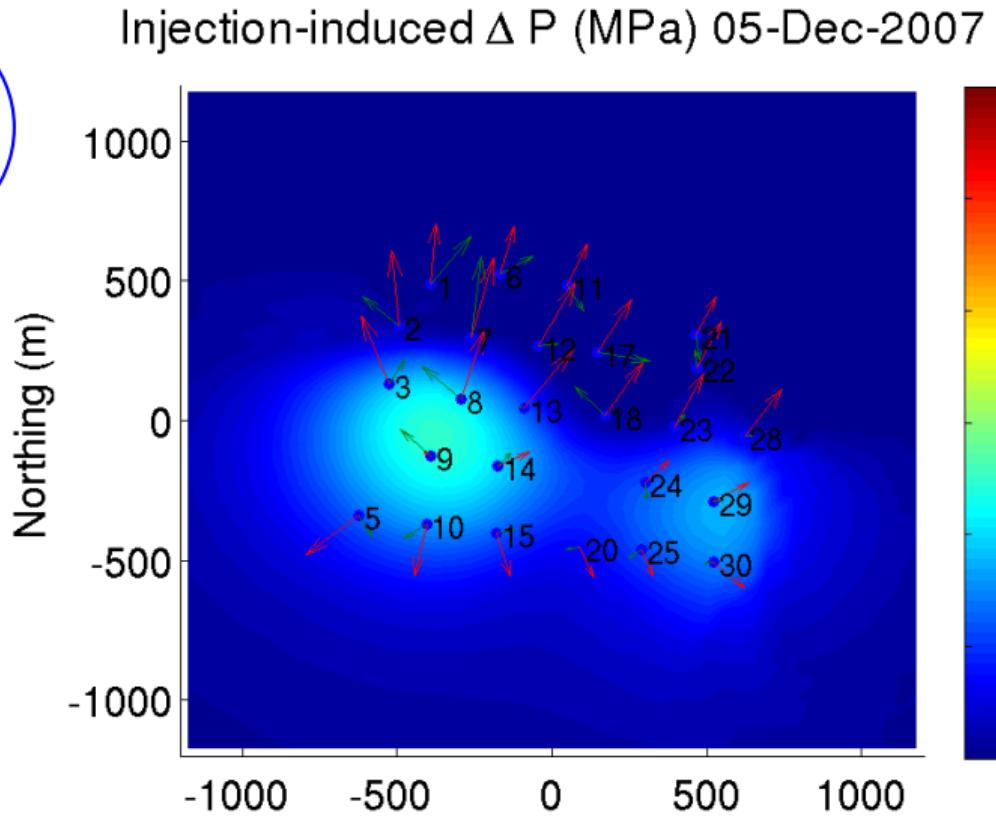
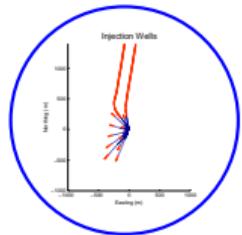
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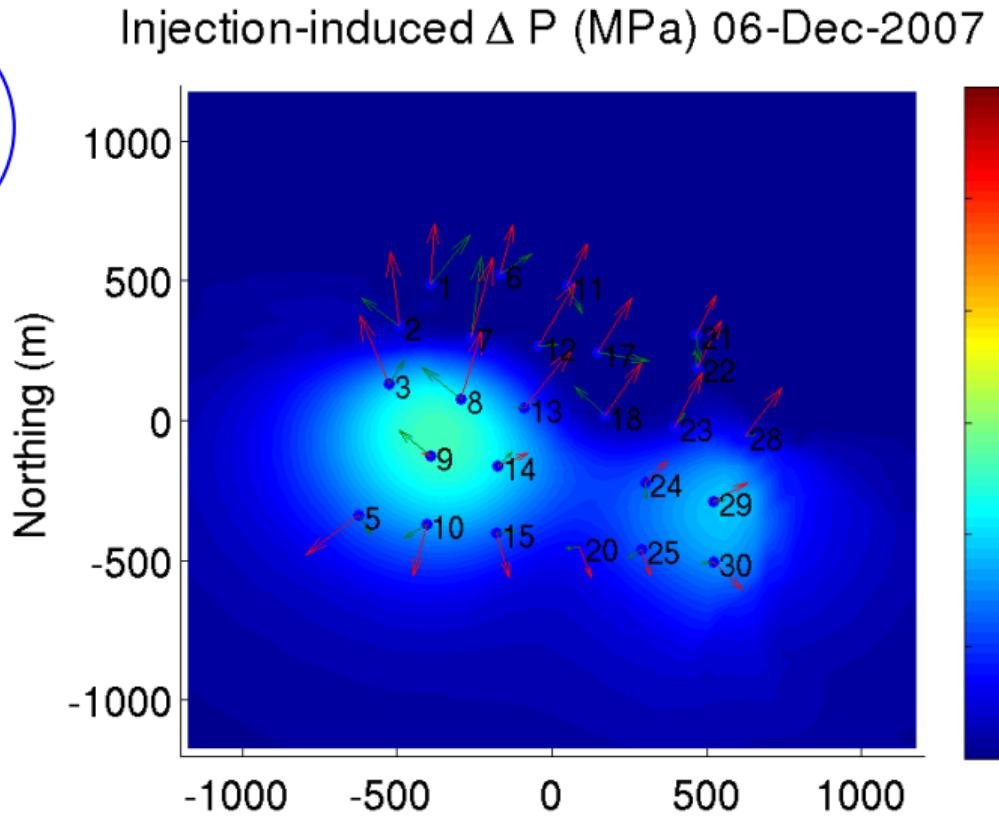
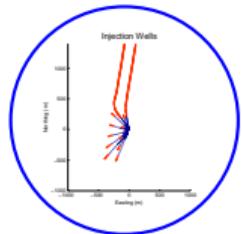
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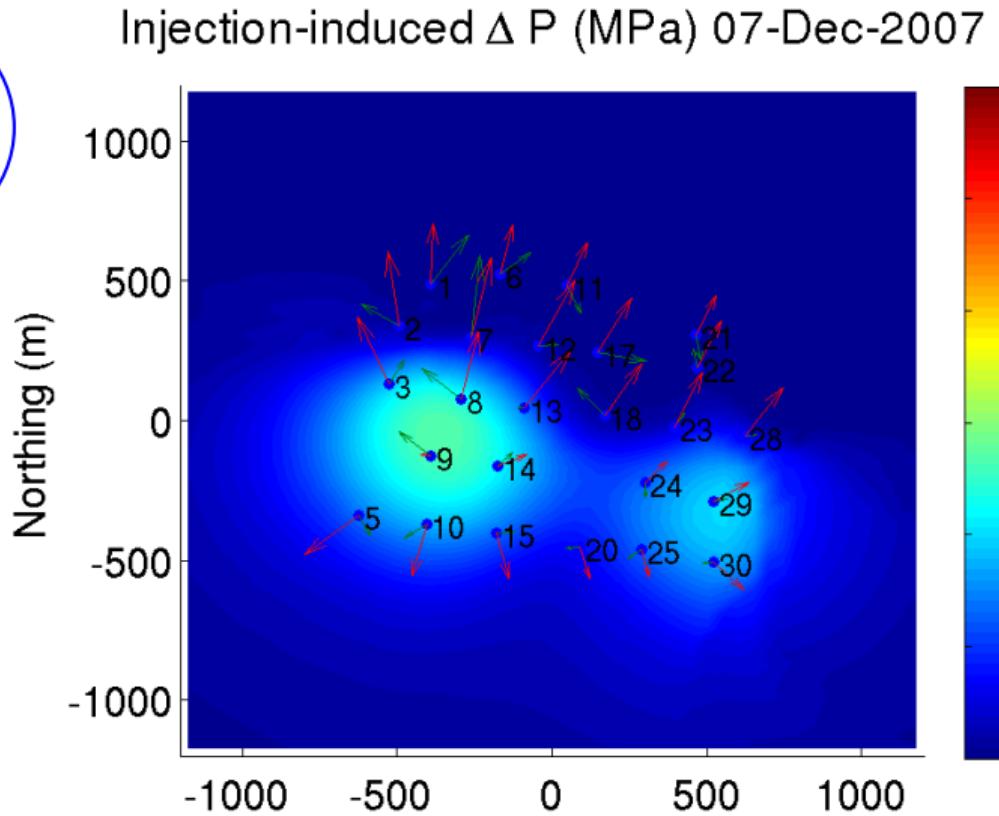
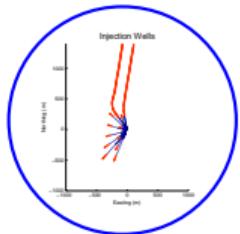
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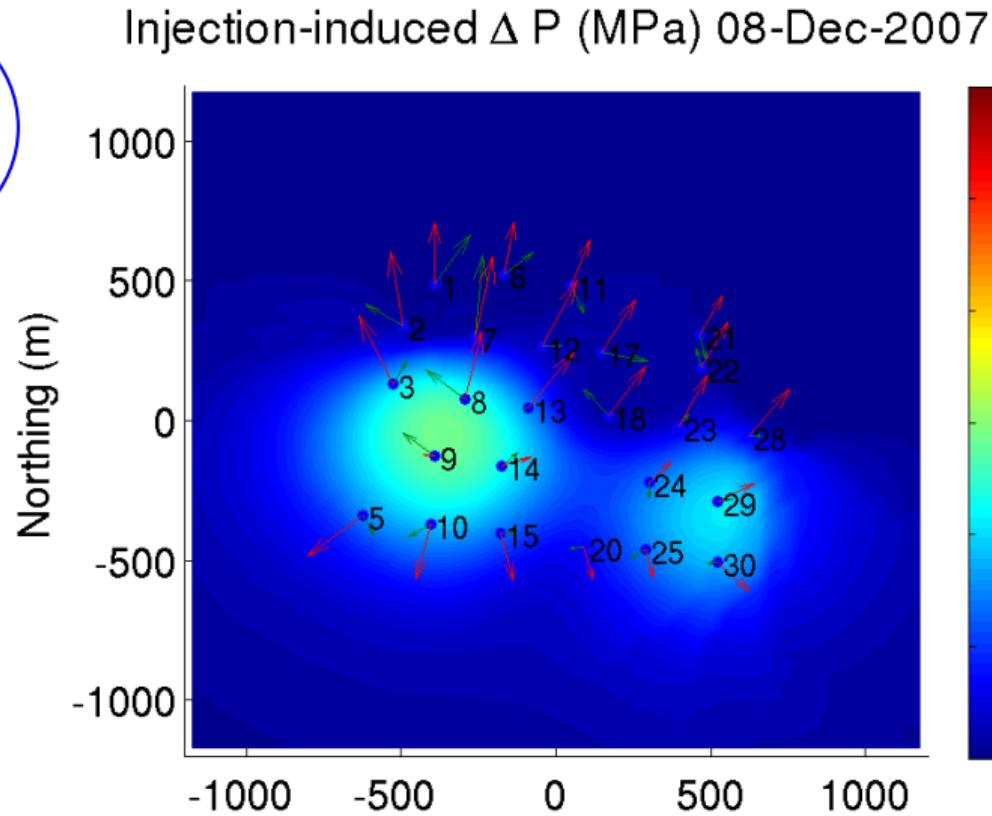
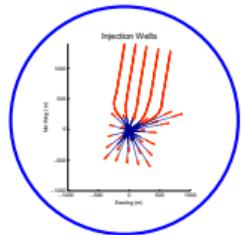
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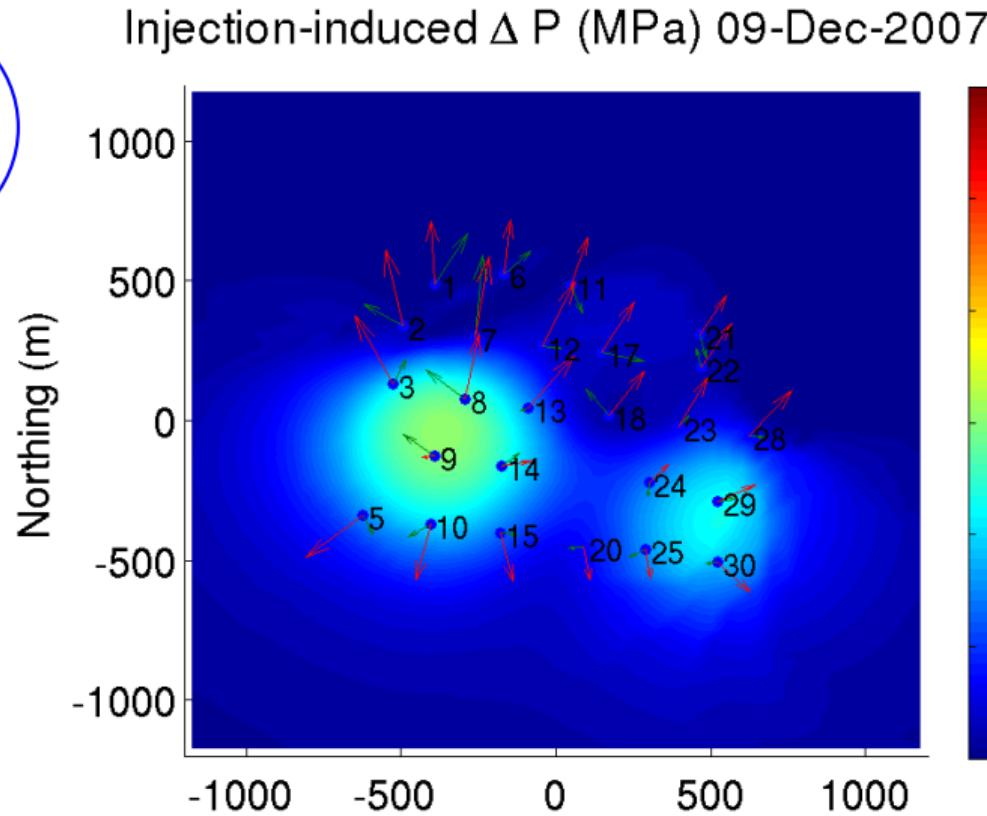
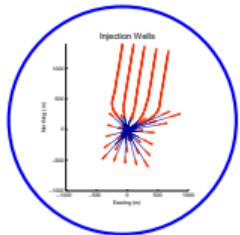
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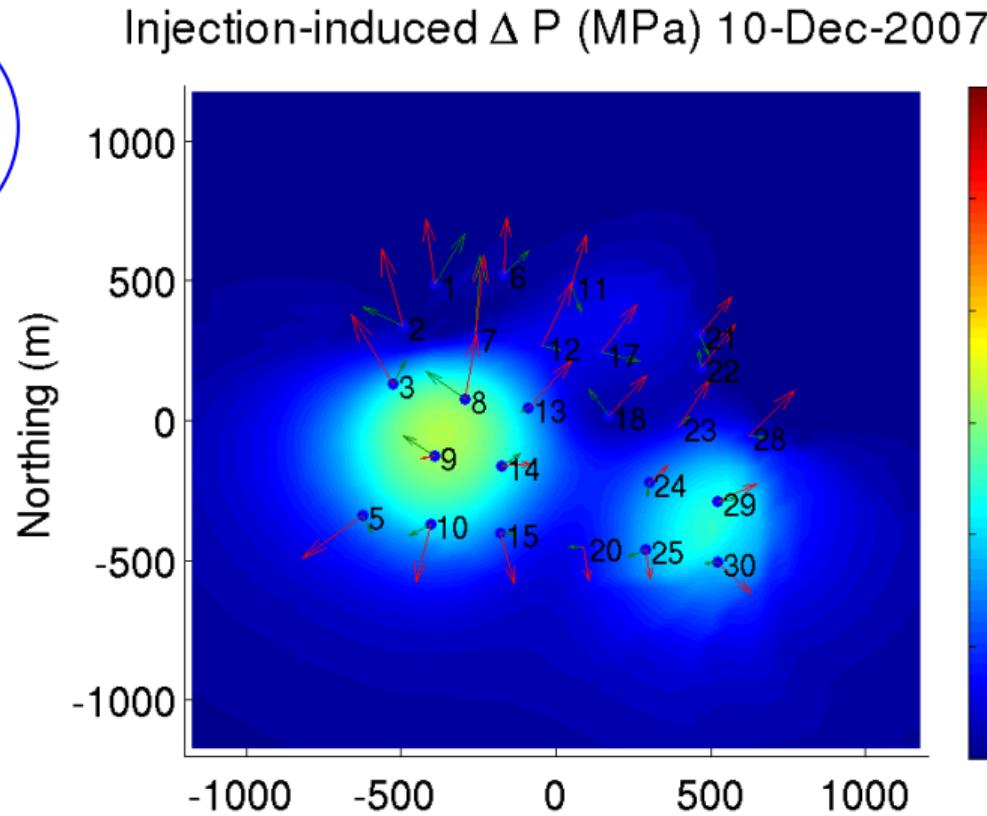
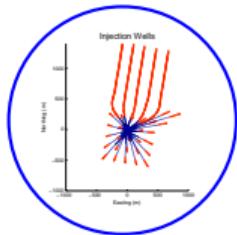
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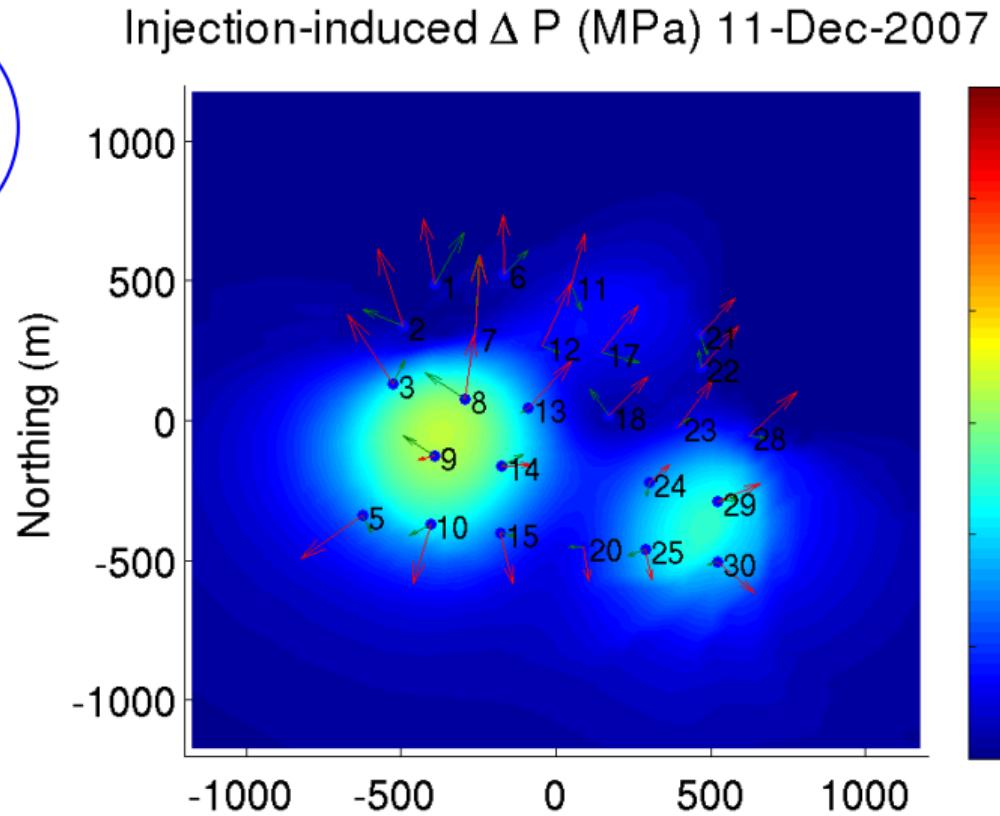
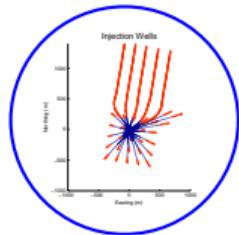
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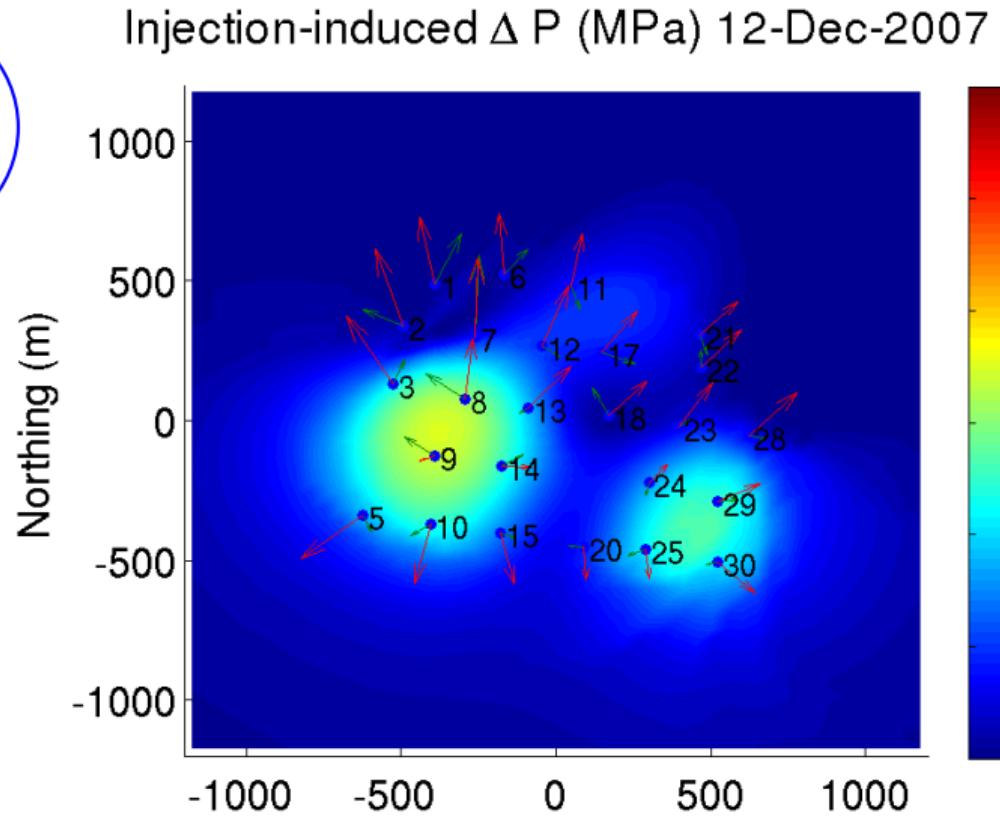
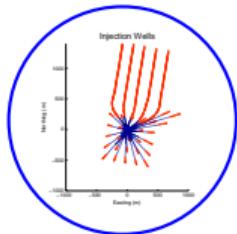
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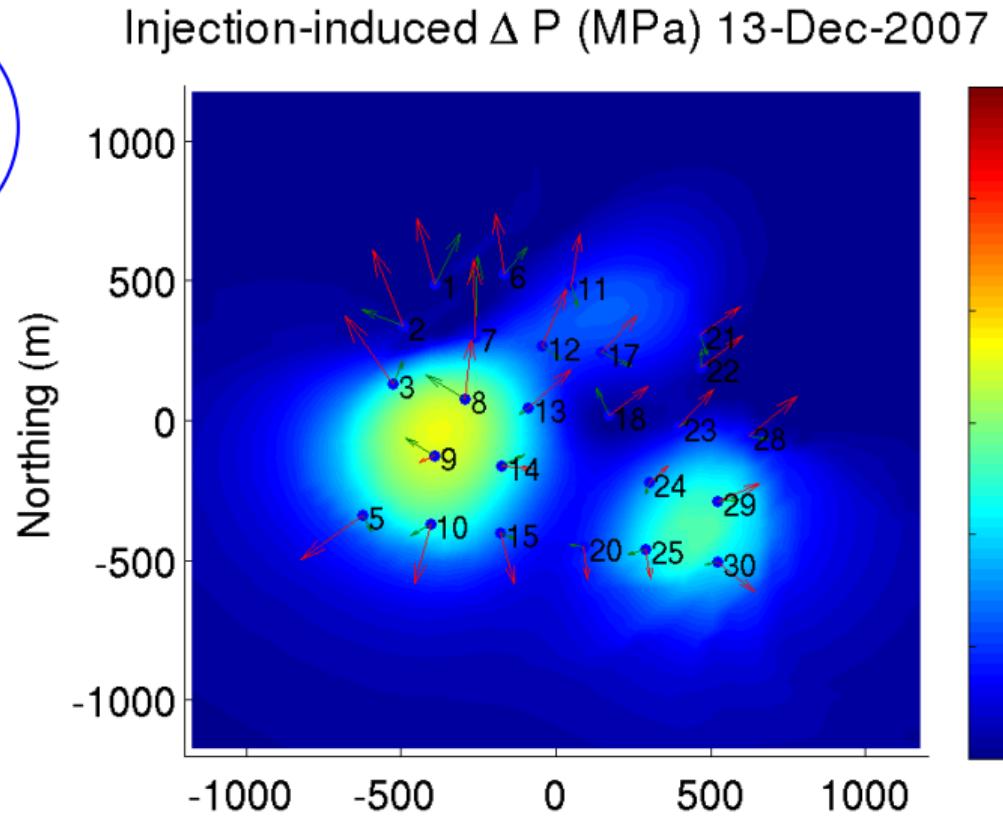
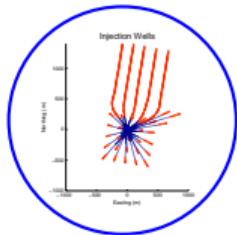
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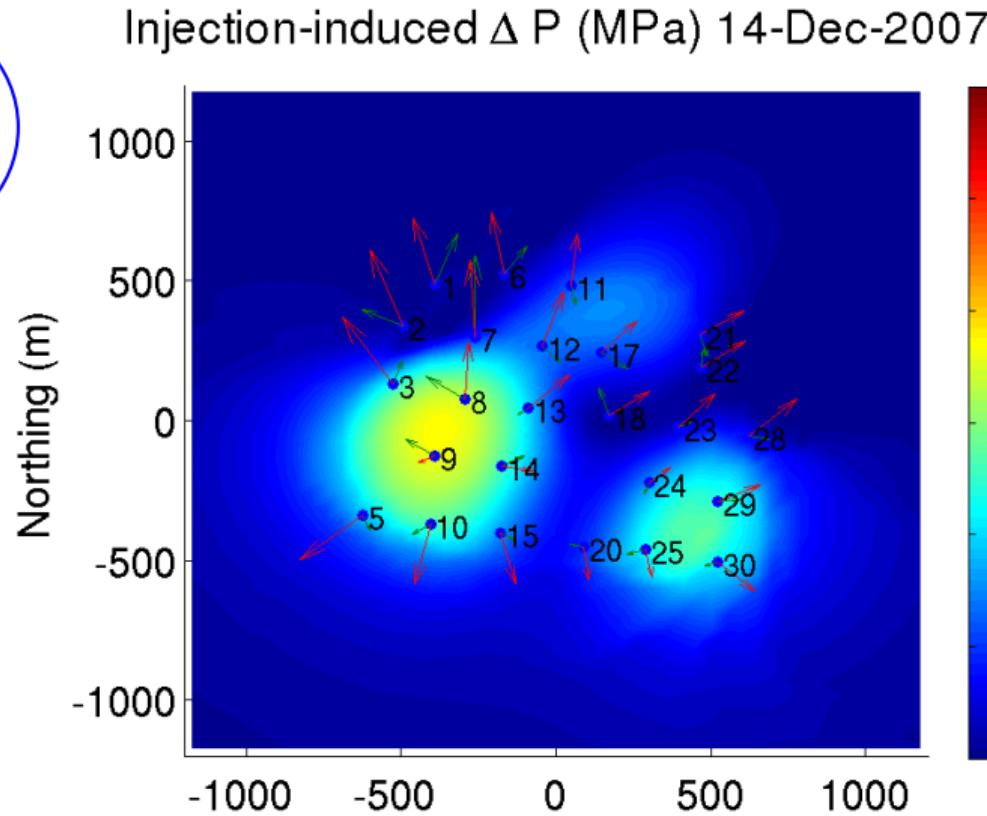
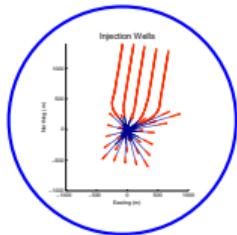
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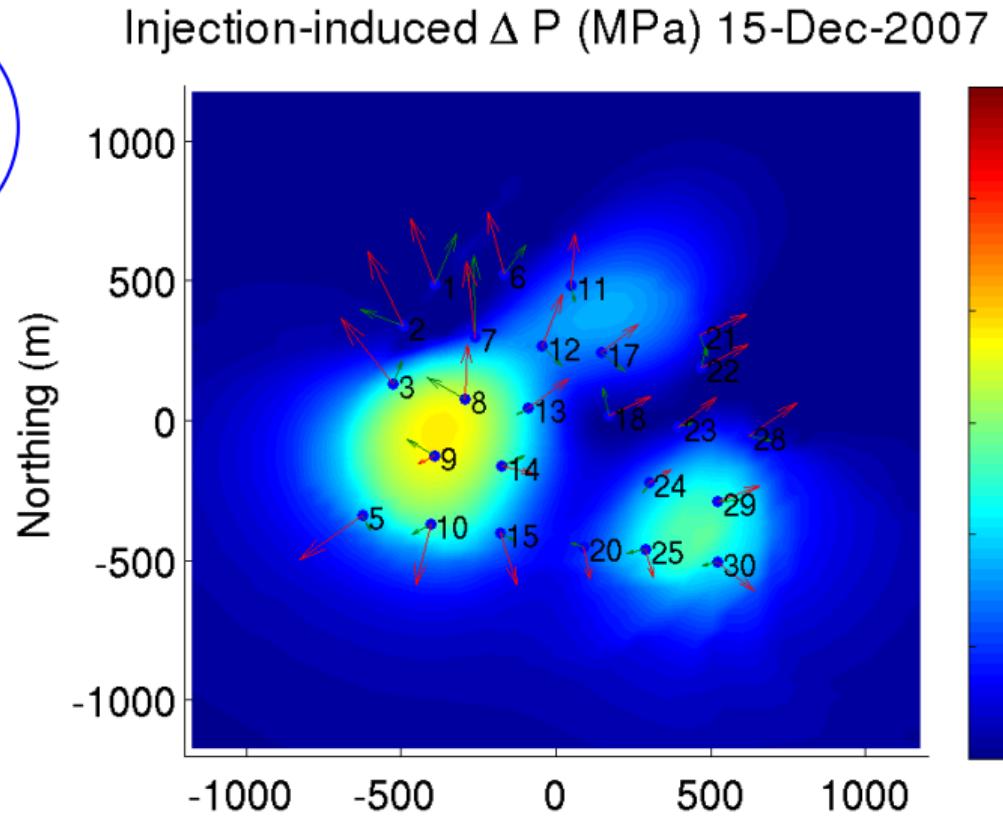
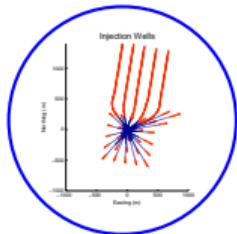
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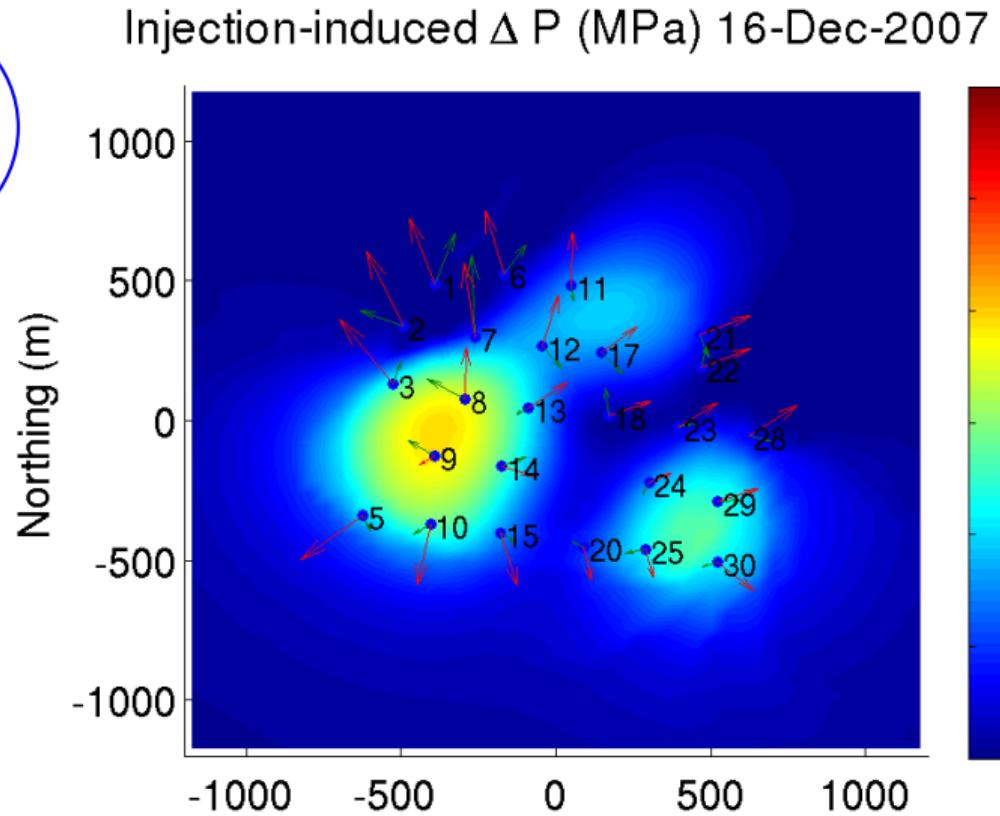
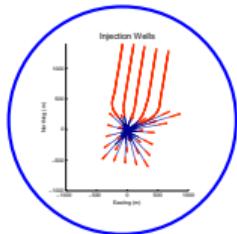
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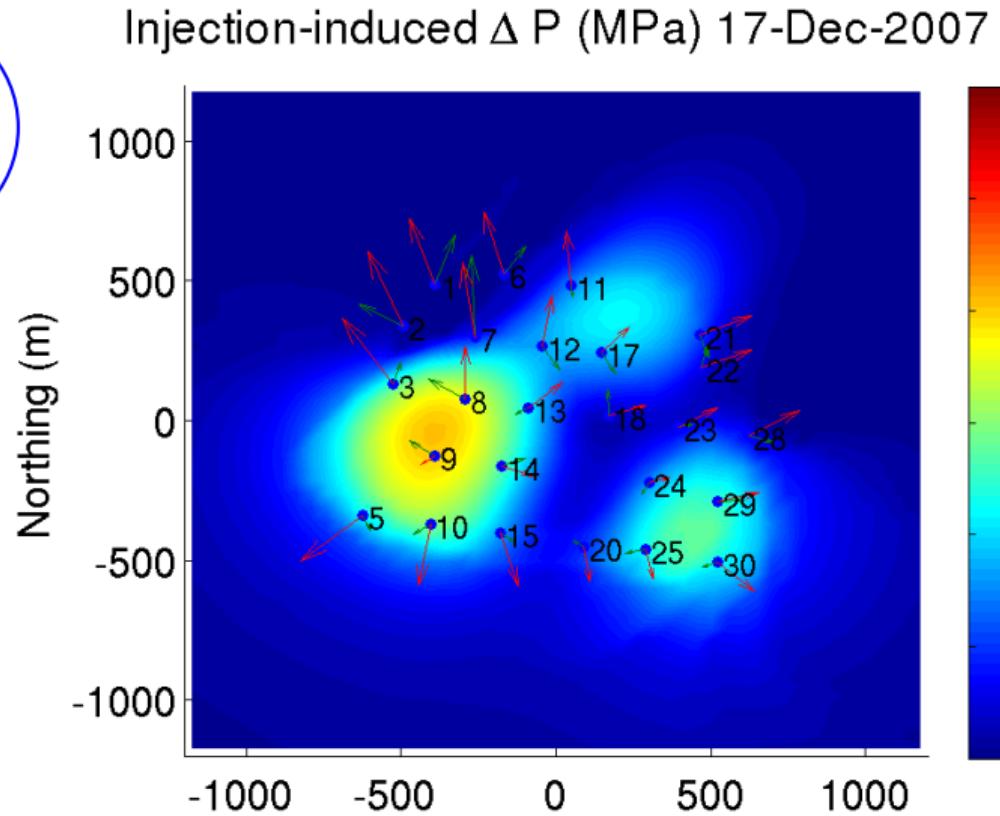
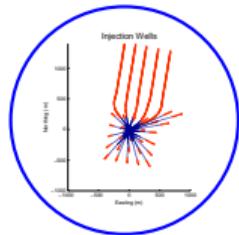
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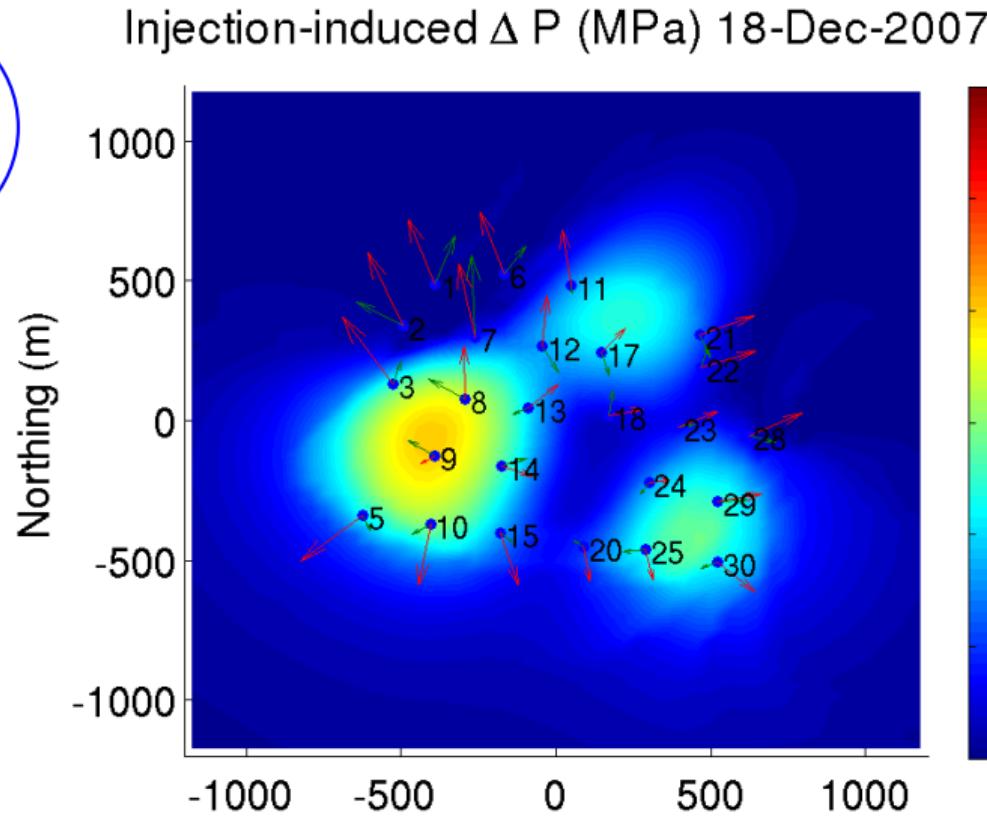
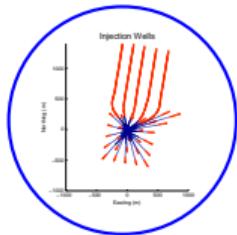
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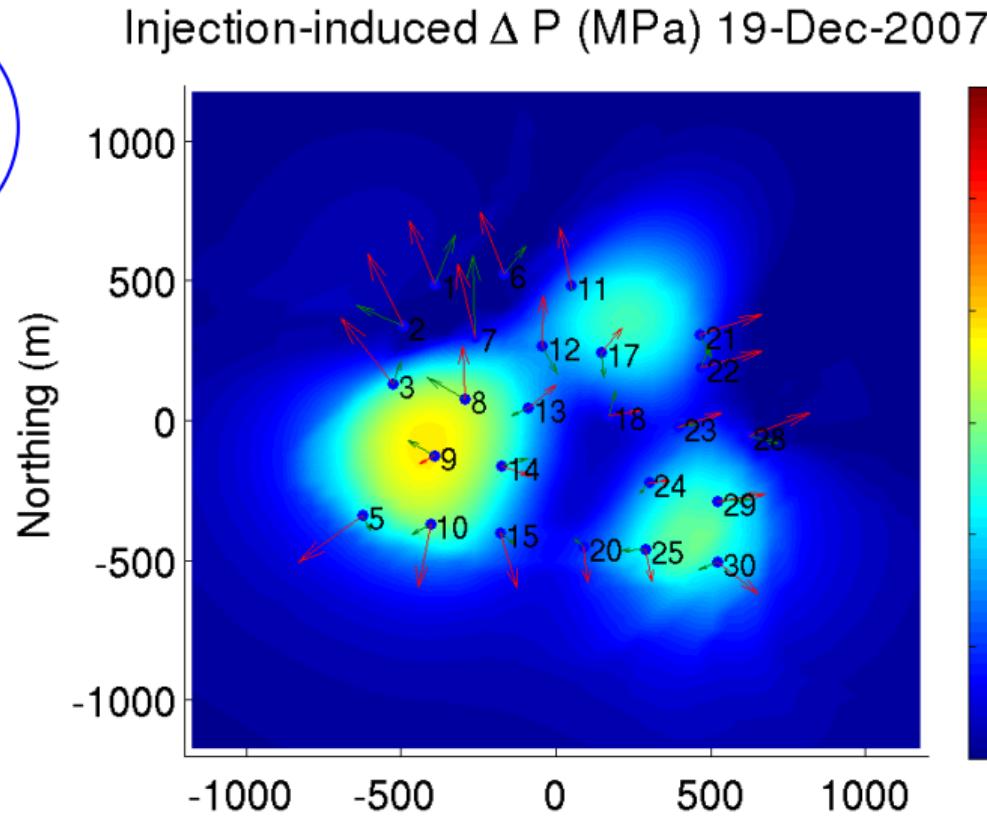
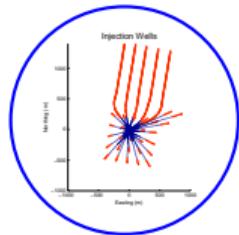
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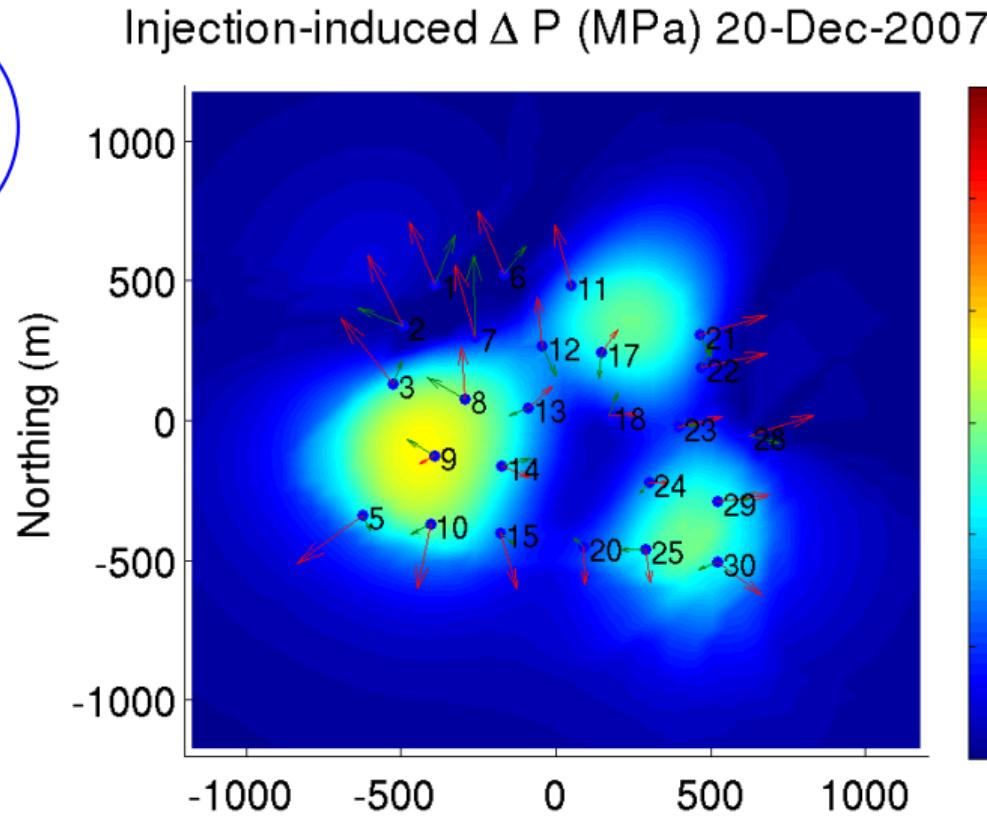
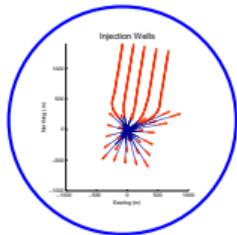
Inverted pore pressure change, $\epsilon = 10^{-3}$



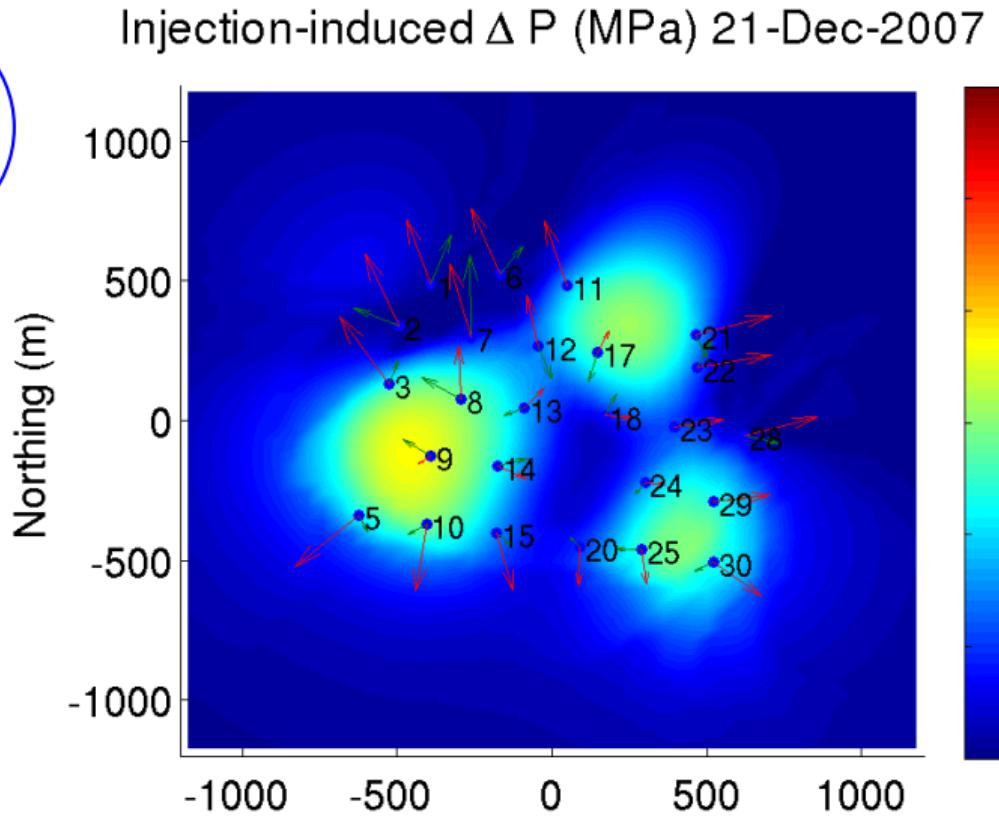
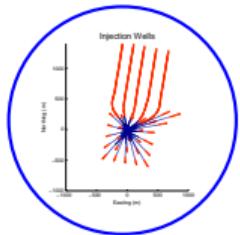
Inverted pore pressure change, $\epsilon = 10^{-3}$



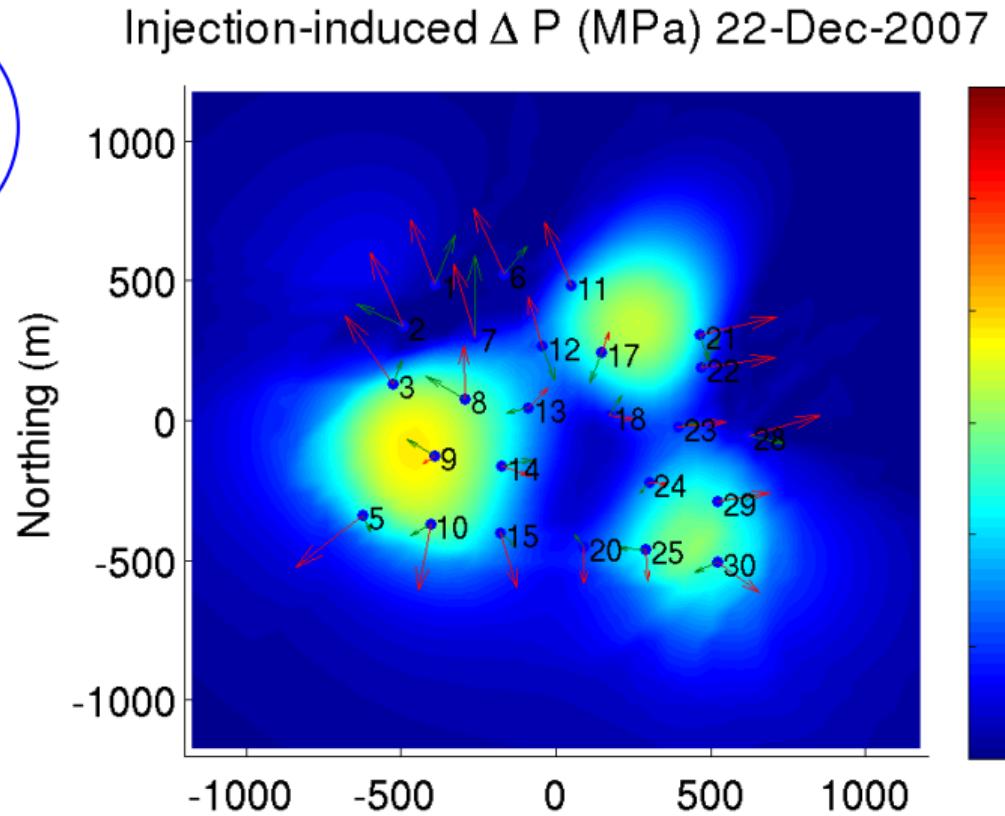
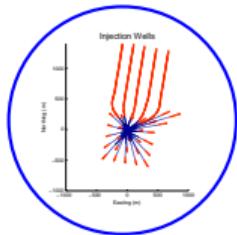
Inverted pore pressure change, $\epsilon = 10^{-3}$



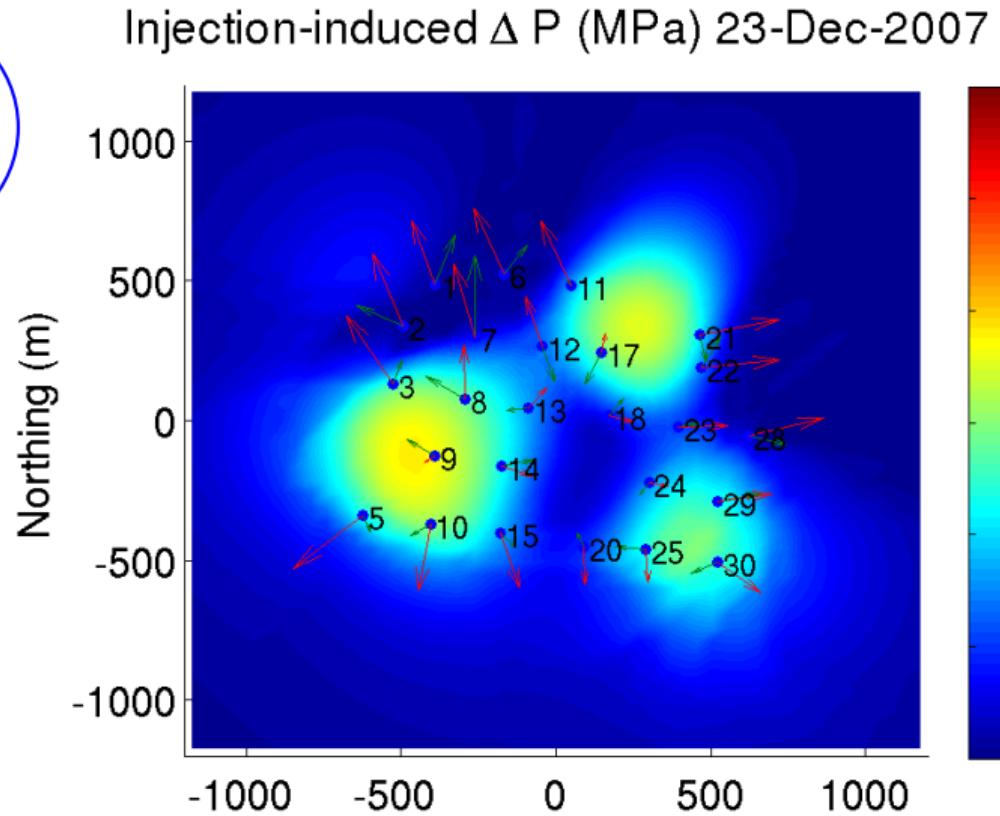
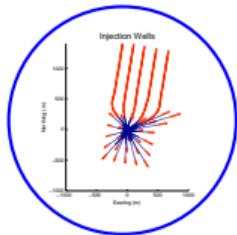
Inverted pore pressure change, $\epsilon = 10^{-3}$



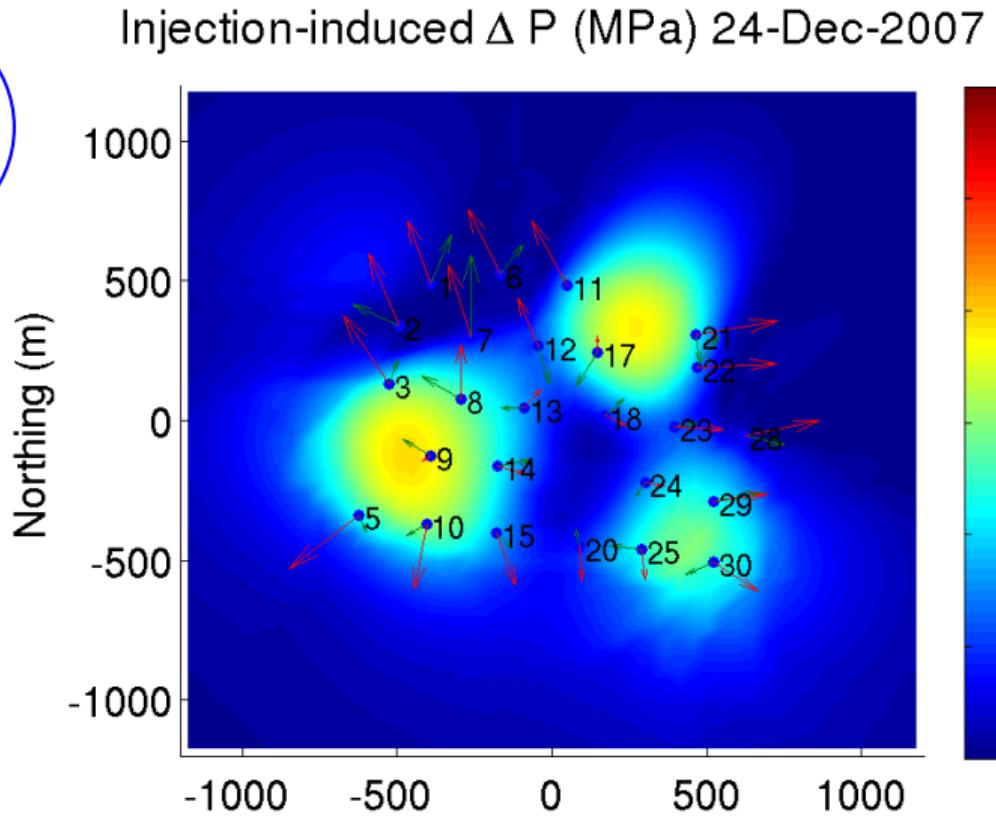
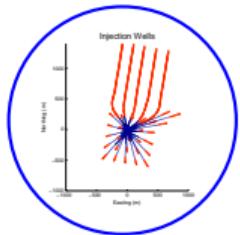
Inverted pore pressure change, $\epsilon = 10^{-3}$



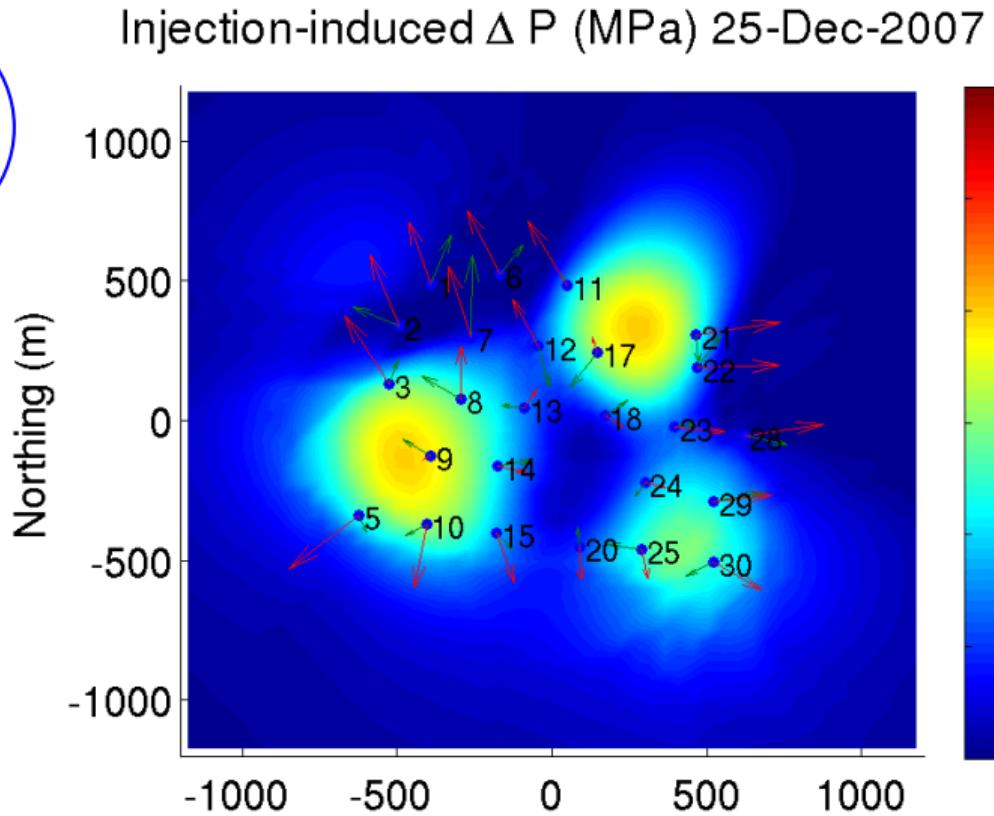
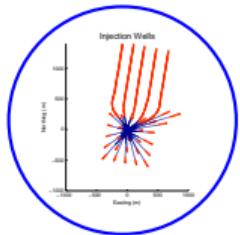
Inverted pore pressure change, $\epsilon = 10^{-3}$



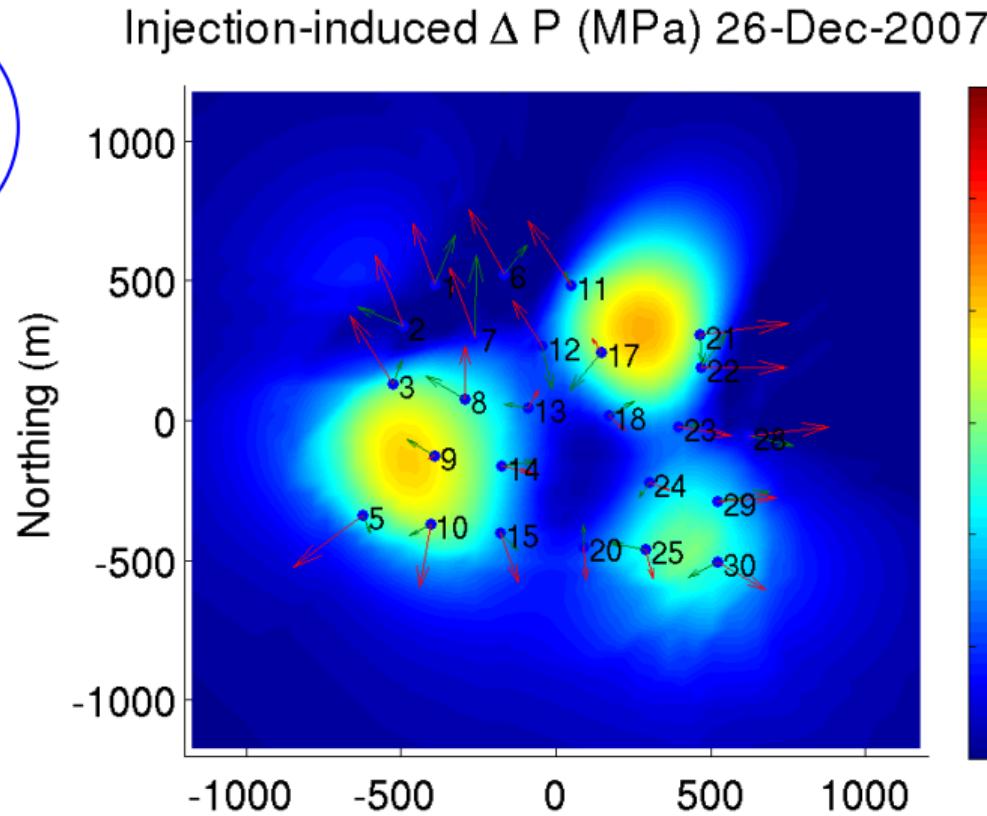
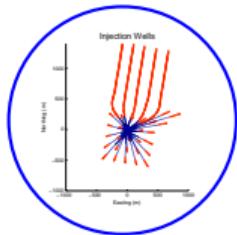
Inverted pore pressure change, $\epsilon = 10^{-3}$



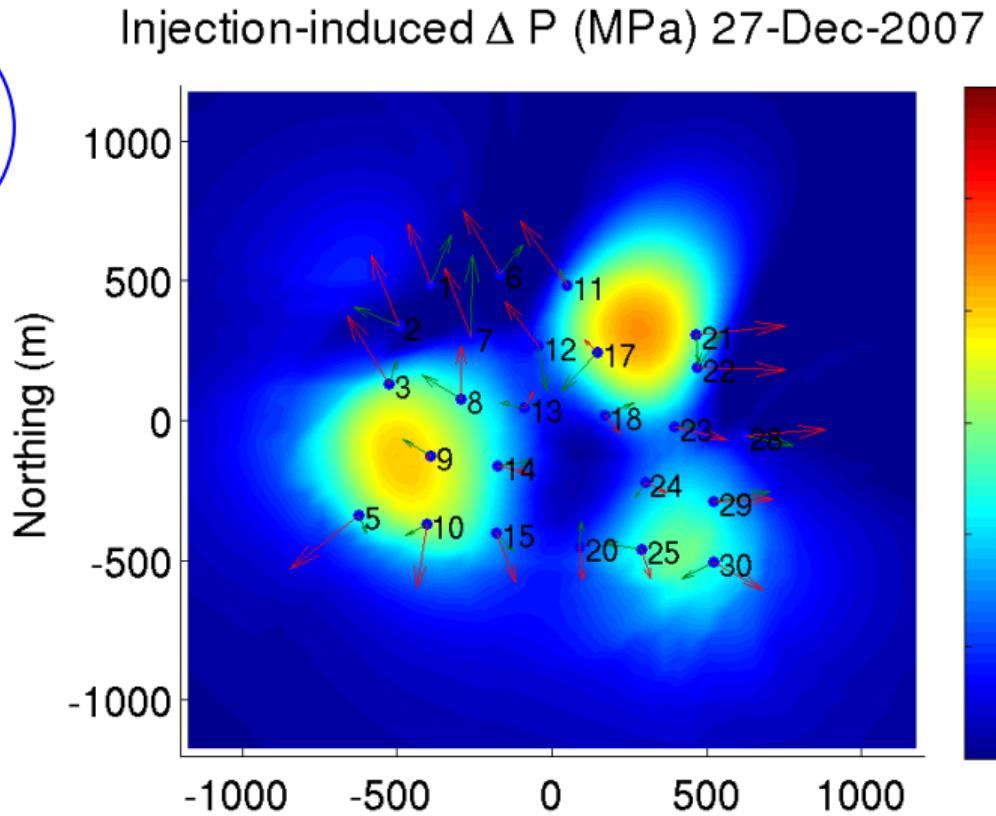
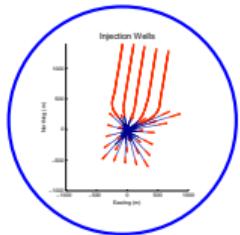
Inverted pore pressure change, $\epsilon = 10^{-3}$



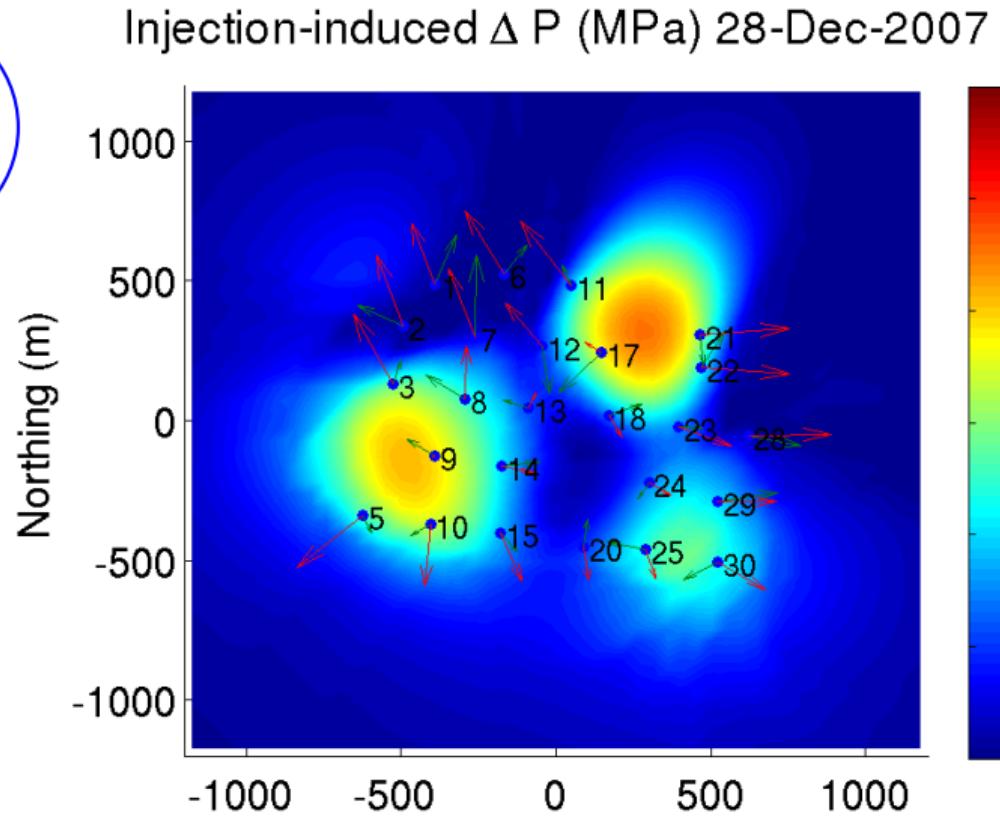
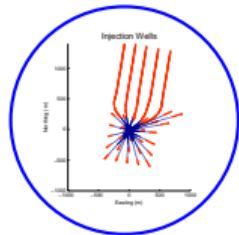
Inverted pore pressure change, $\epsilon = 10^{-3}$



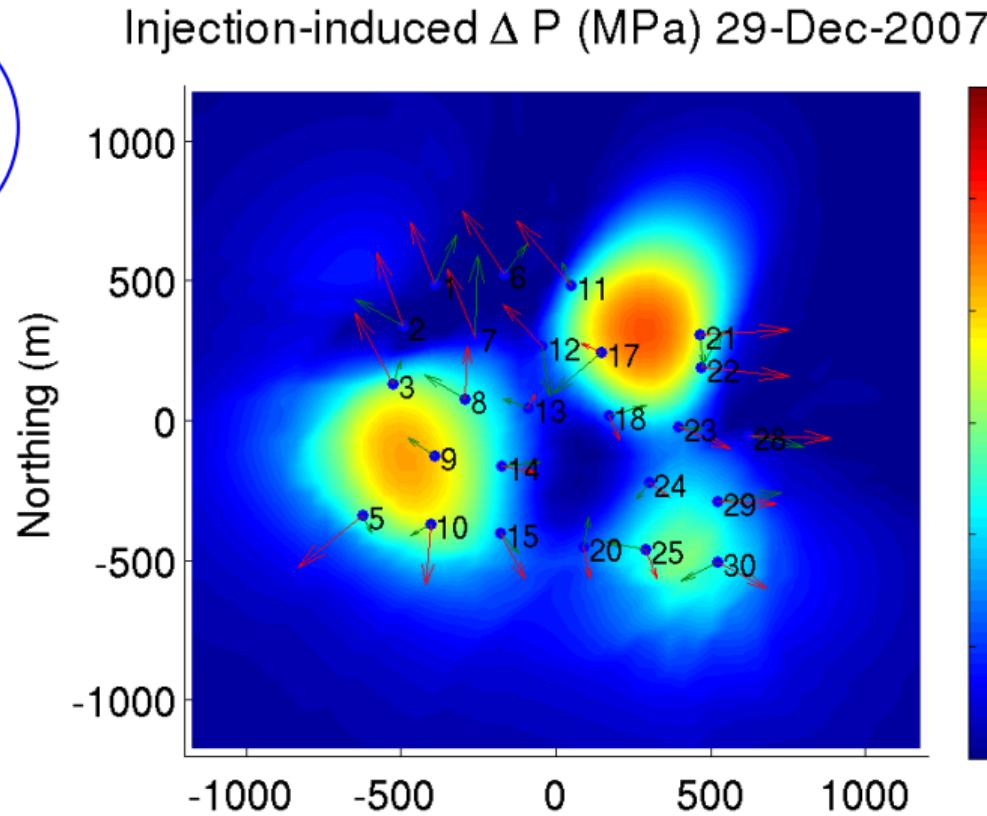
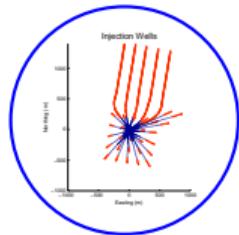
Inverted pore pressure change, $\epsilon = 10^{-3}$



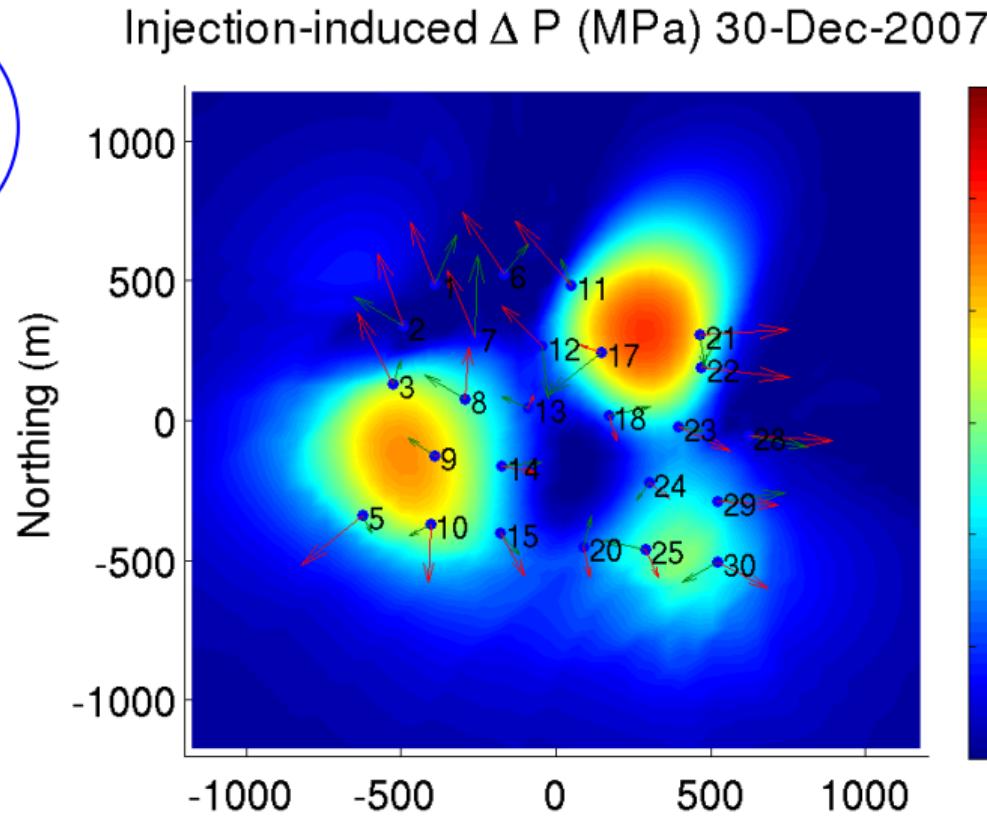
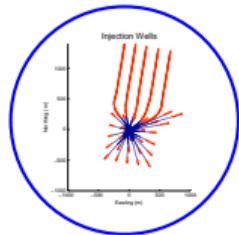
Inverted pore pressure change, $\epsilon = 10^{-3}$



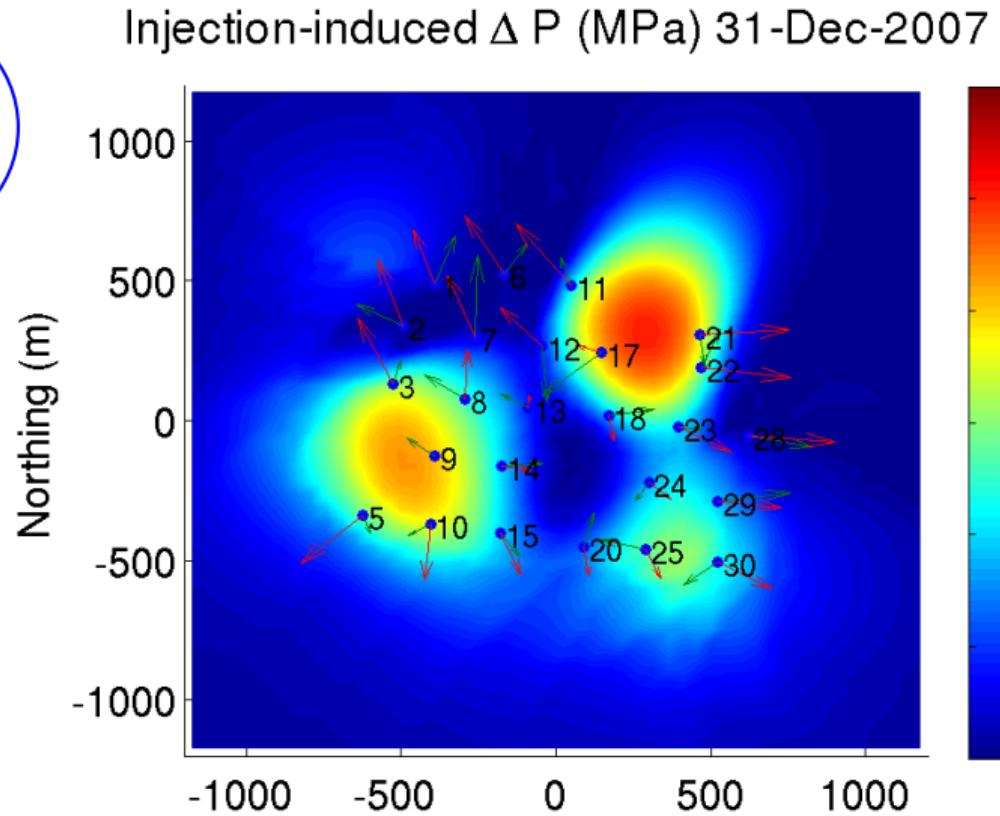
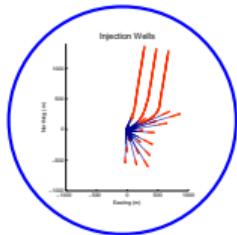
Inverted pore pressure change, $\epsilon = 10^{-3}$



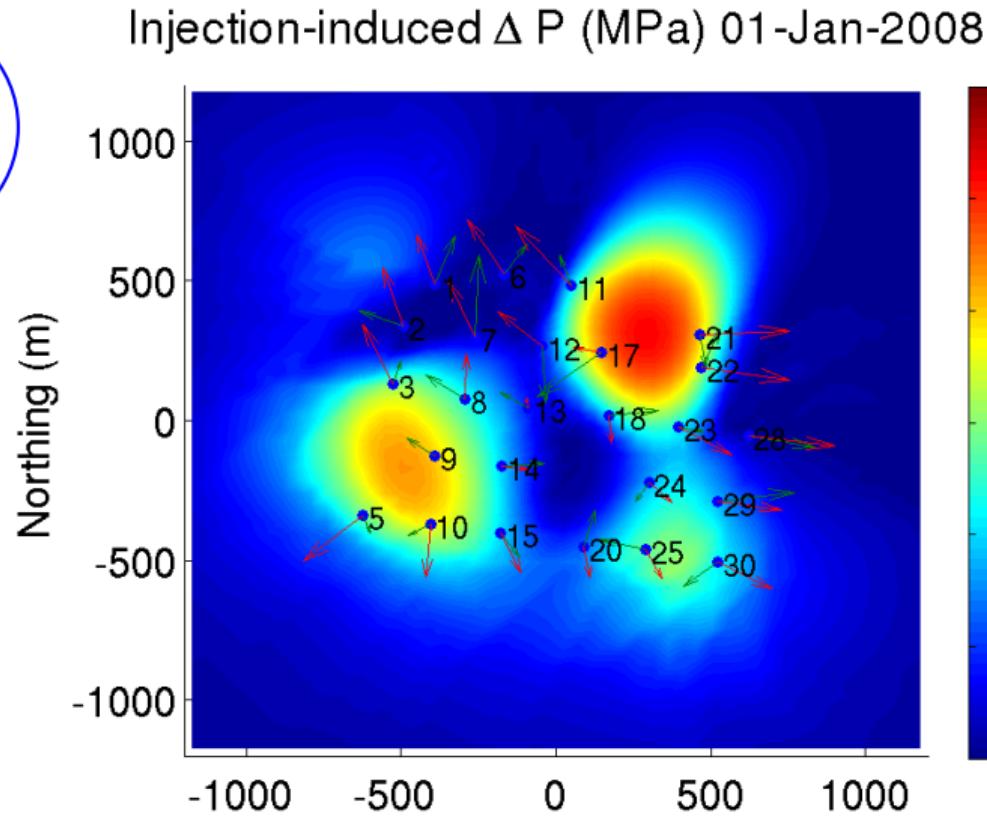
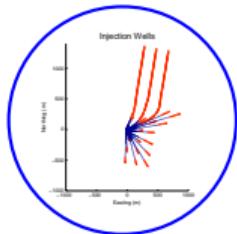
Inverted pore pressure change, $\epsilon = 10^{-3}$



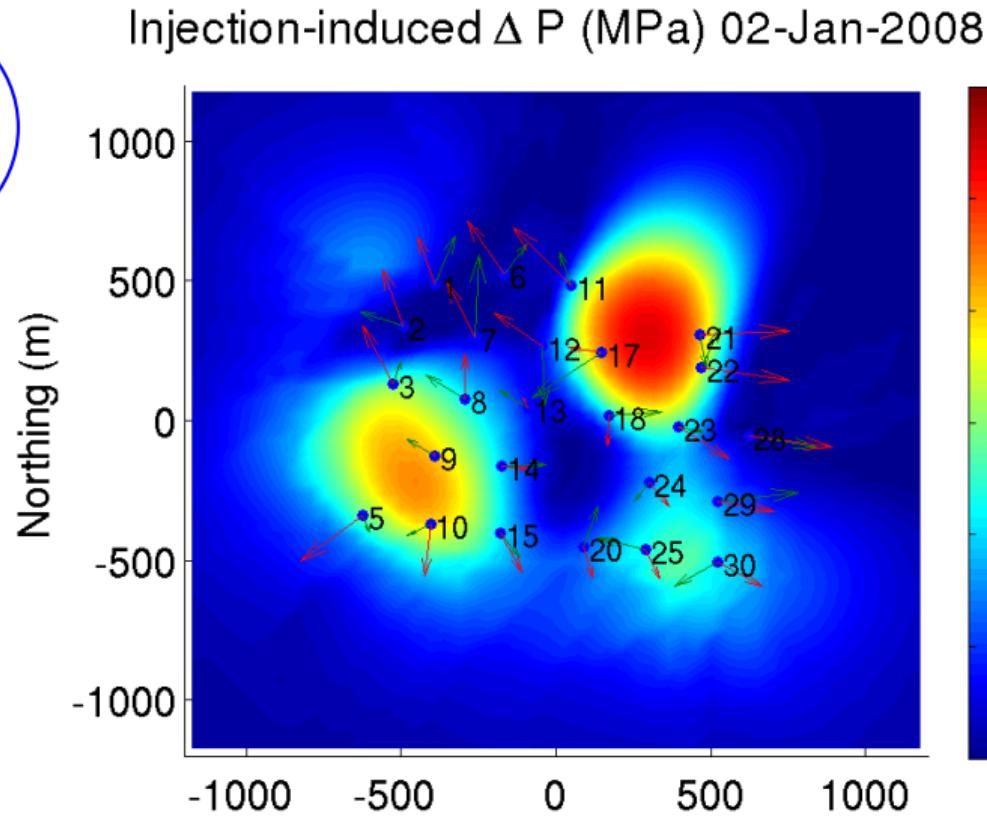
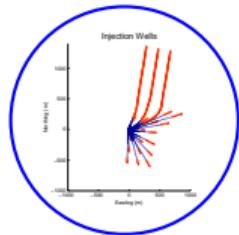
Inverted pore pressure change, $\epsilon = 10^{-3}$



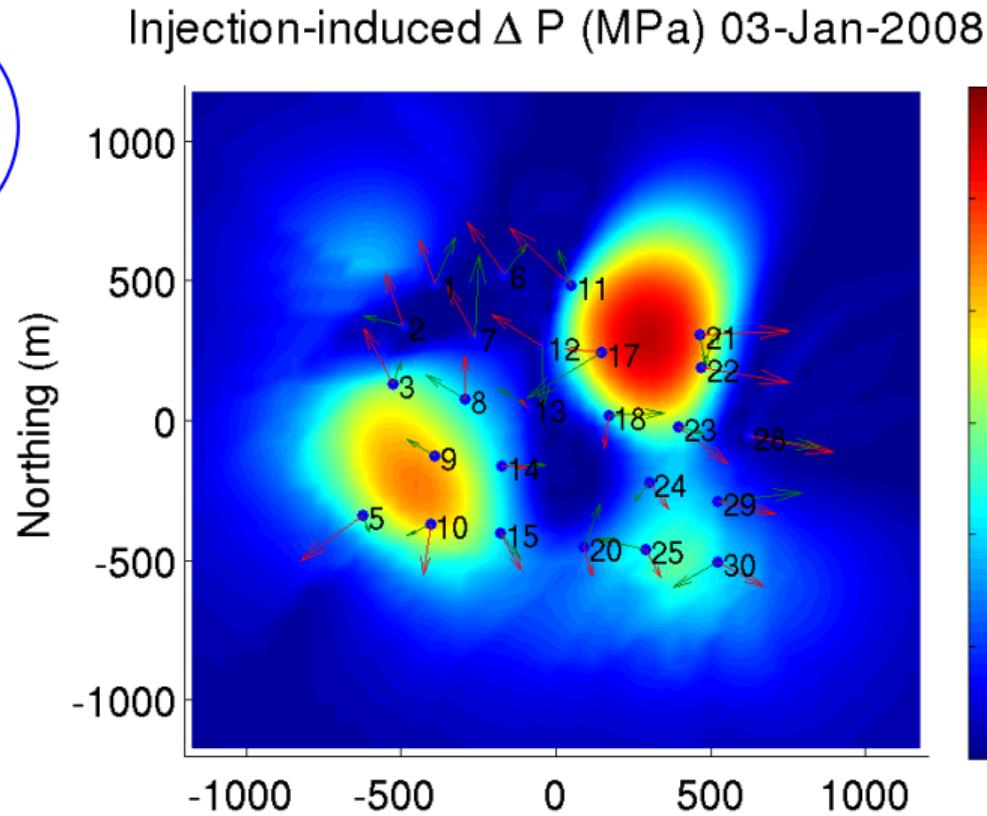
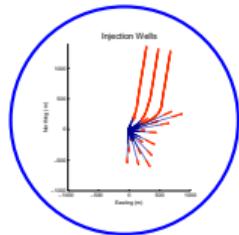
Inverted pore pressure change, $\epsilon = 10^{-3}$



Inverted pore pressure change, $\epsilon = 10^{-3}$

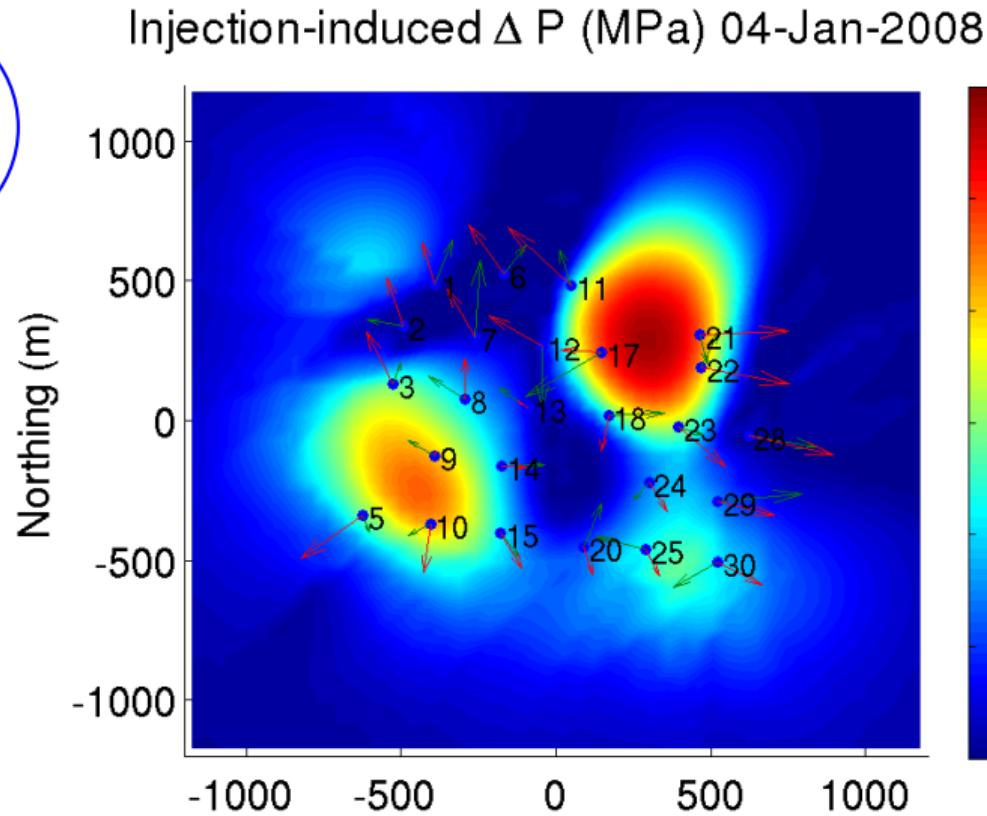
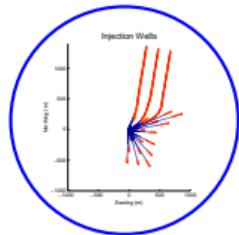


Inverted pore pressure change, $\epsilon = 10^{-3}$

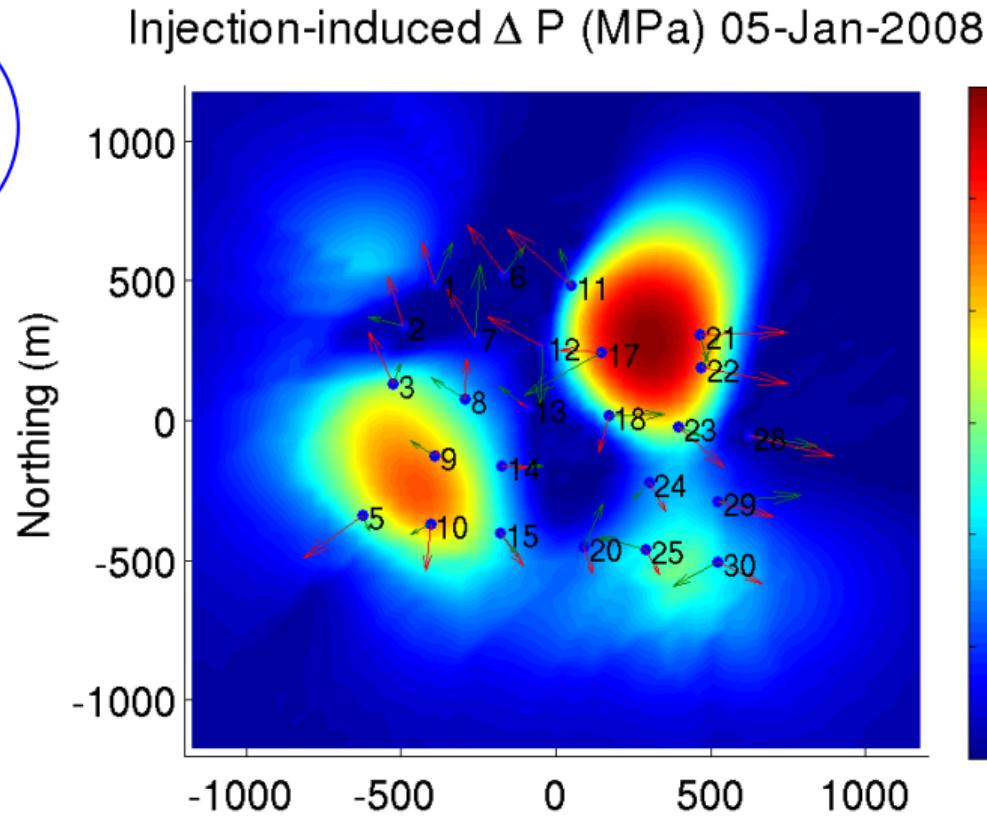
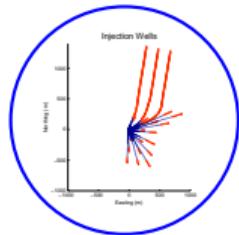




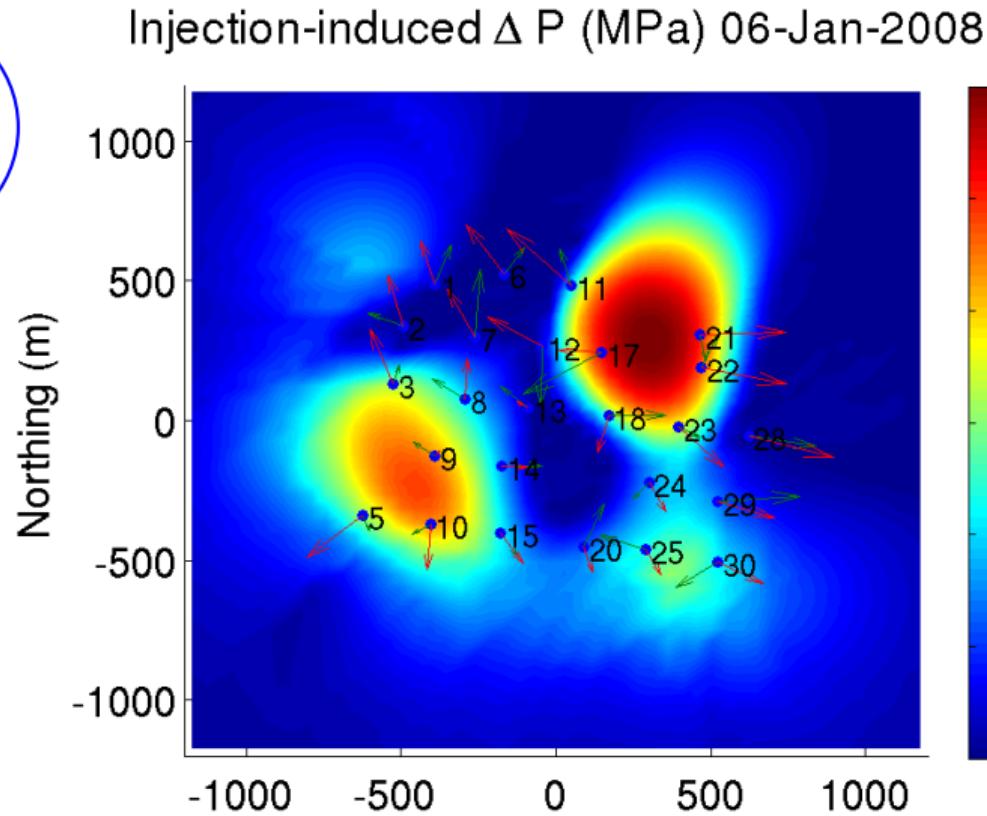
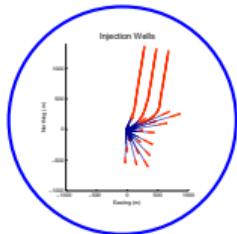
Inverted pore pressure change, $\epsilon = 10^{-3}$



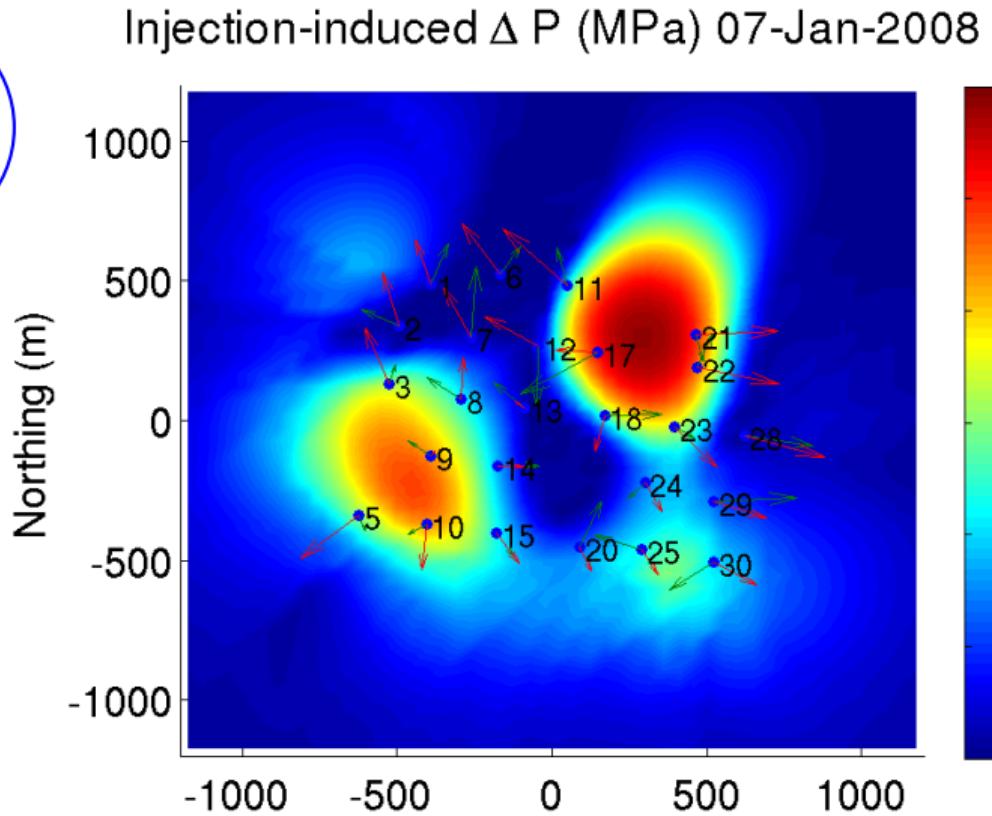
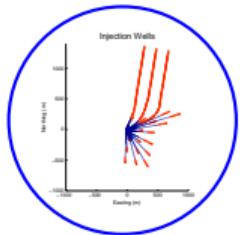
Inverted pore pressure change, $\epsilon = 10^{-3}$



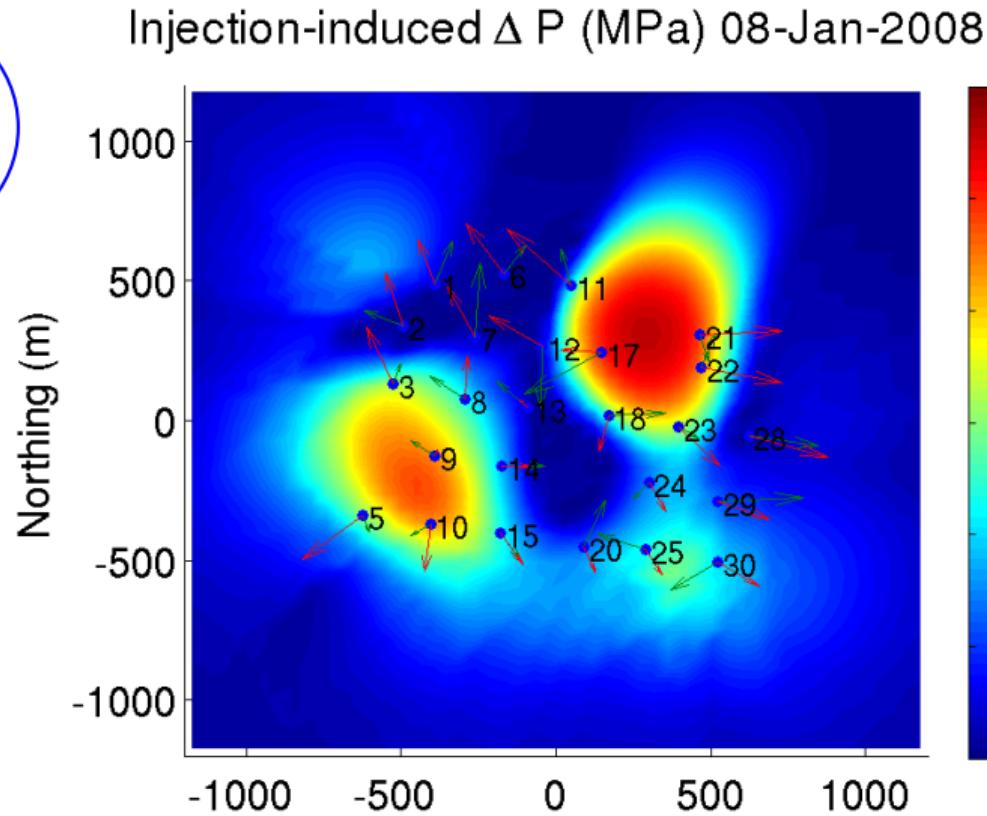
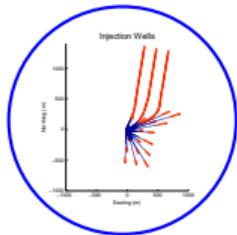
Inverted pore pressure change, $\epsilon = 10^{-3}$



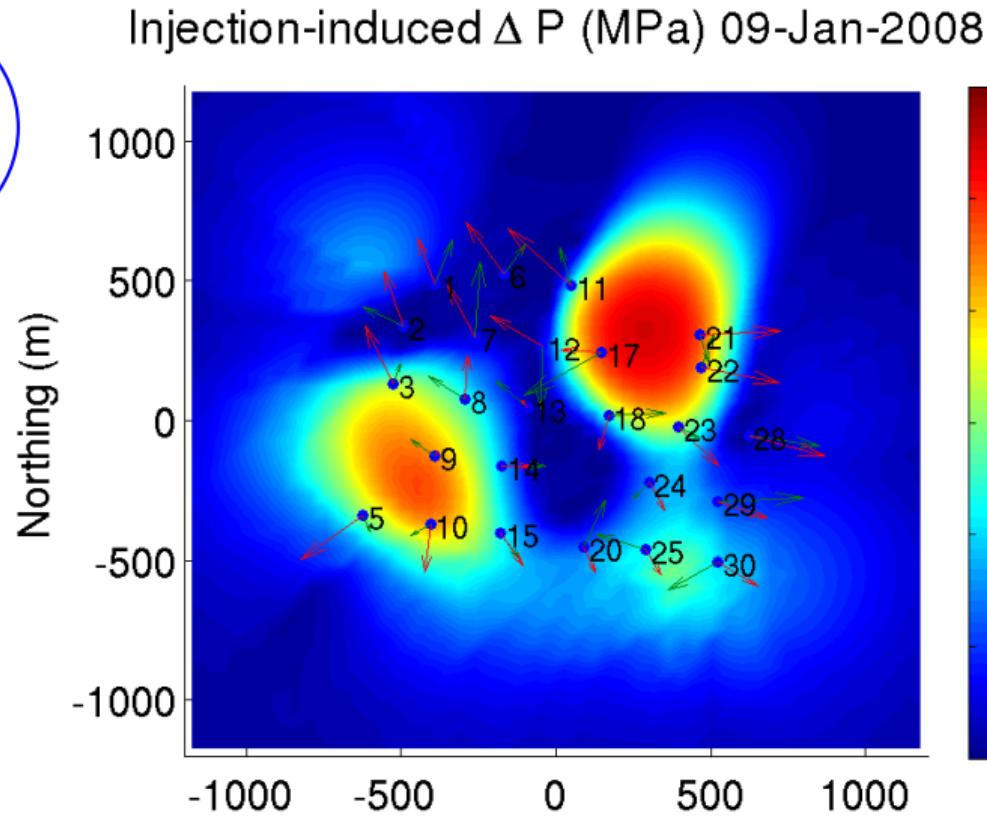
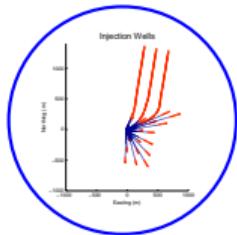
Inverted pore pressure change, $\epsilon = 10^{-3}$



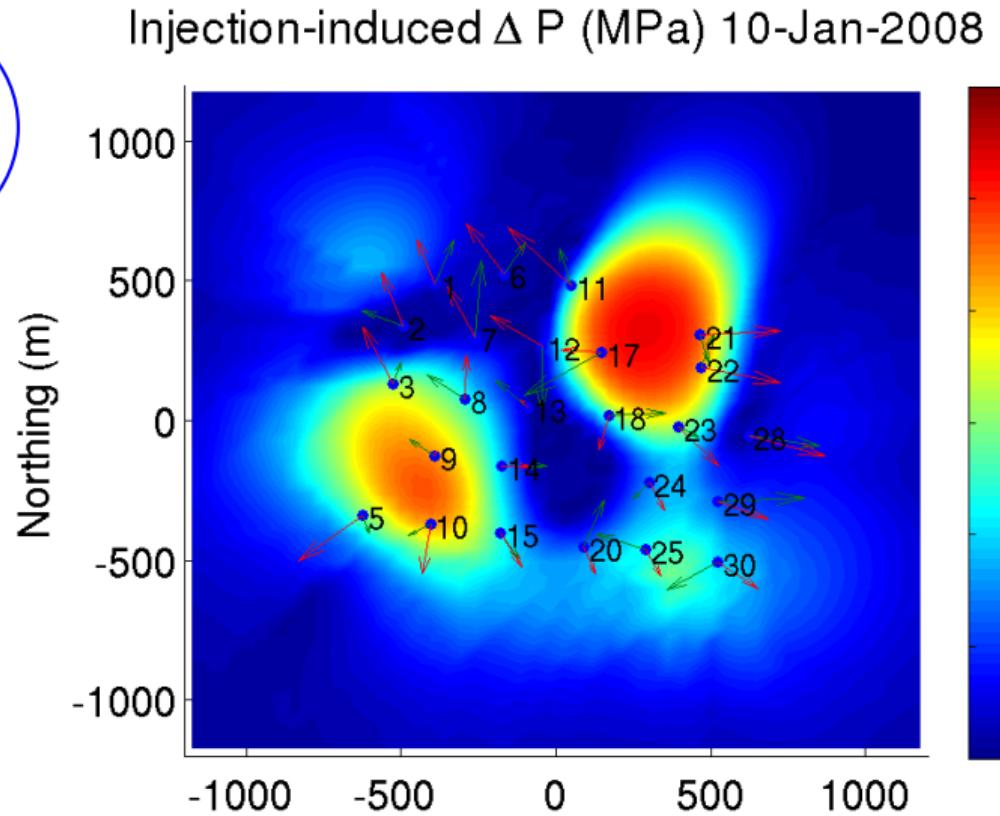
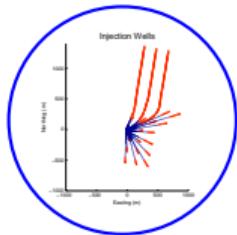
Inverted pore pressure change, $\epsilon = 10^{-3}$



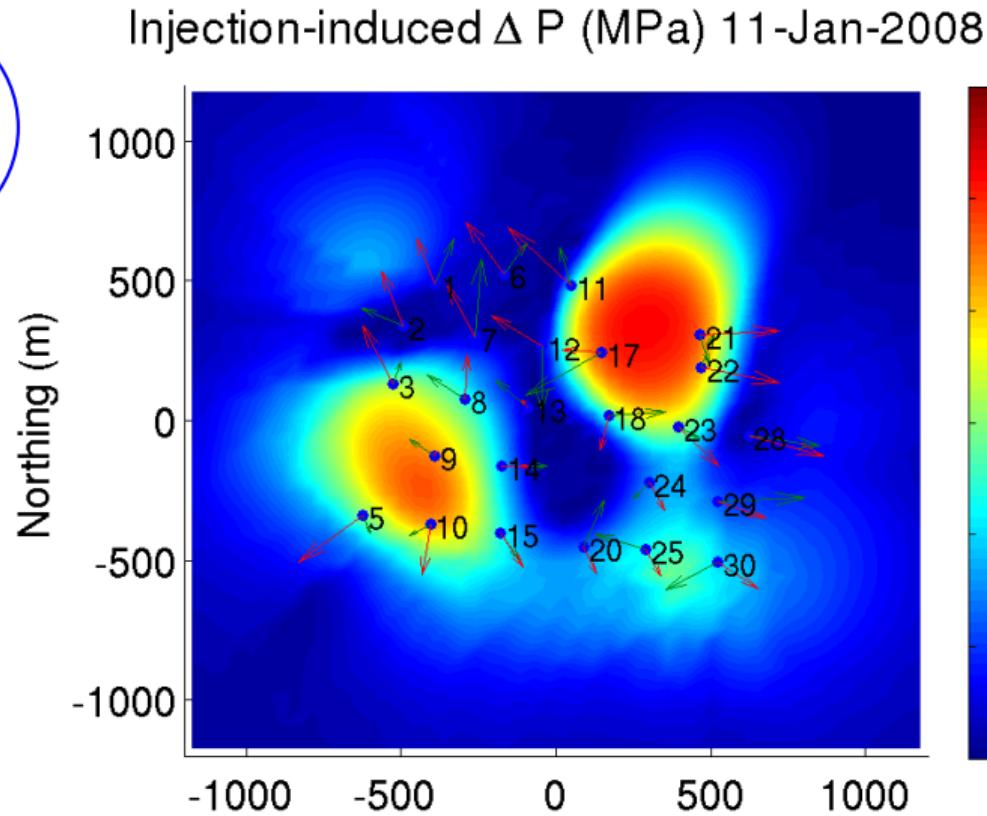
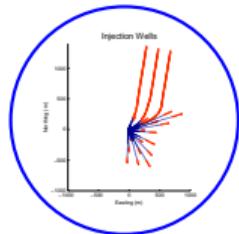
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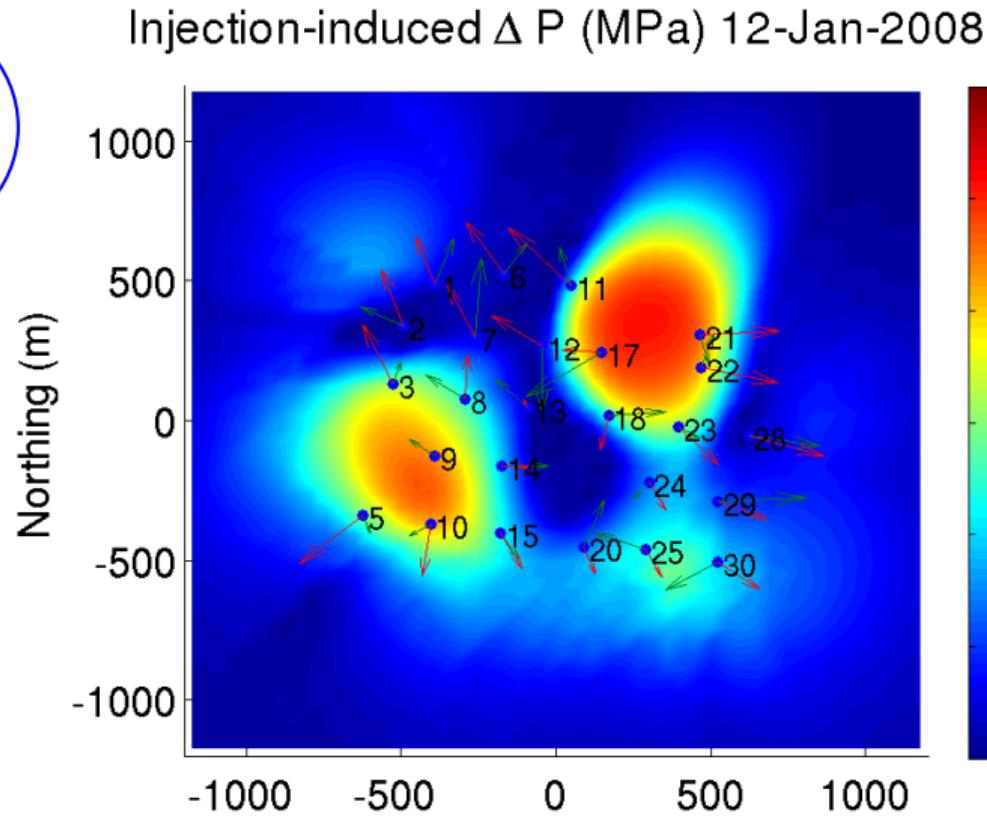
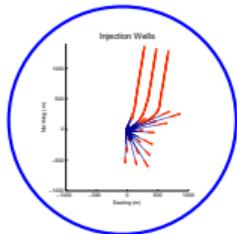
Inverted pore pressure change, $\epsilon = 10^{-3}$



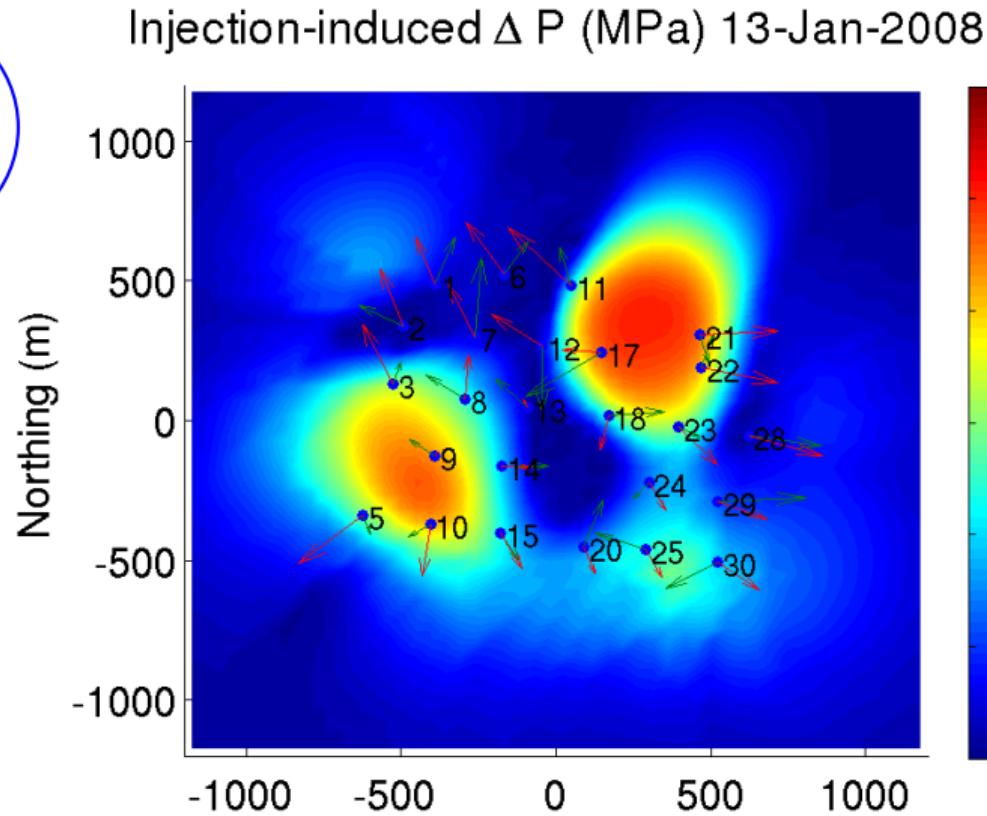
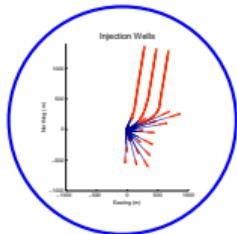
Inverted pore pressure change, $\epsilon = 10^{-3}$



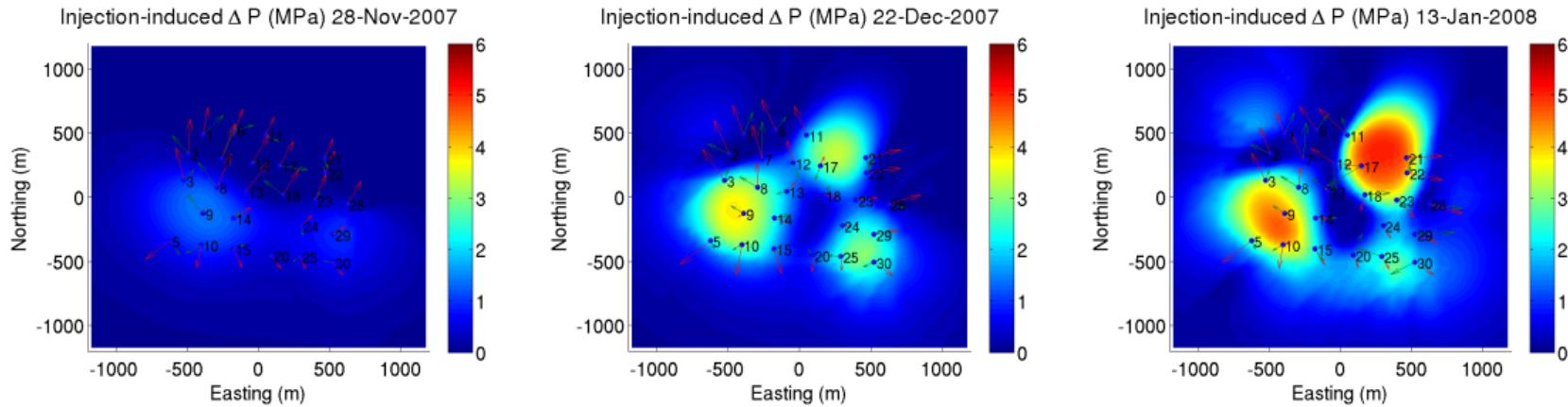
Inverted pore pressure change, $\epsilon = 10^{-3}$



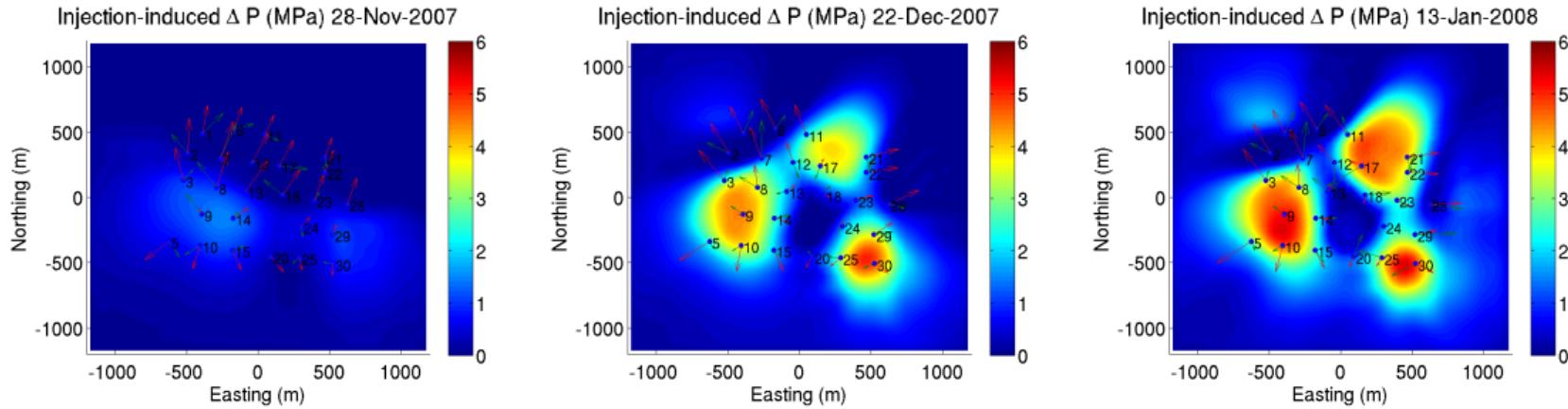
Inverted pore pressure change, $\epsilon = 10^{-3}$



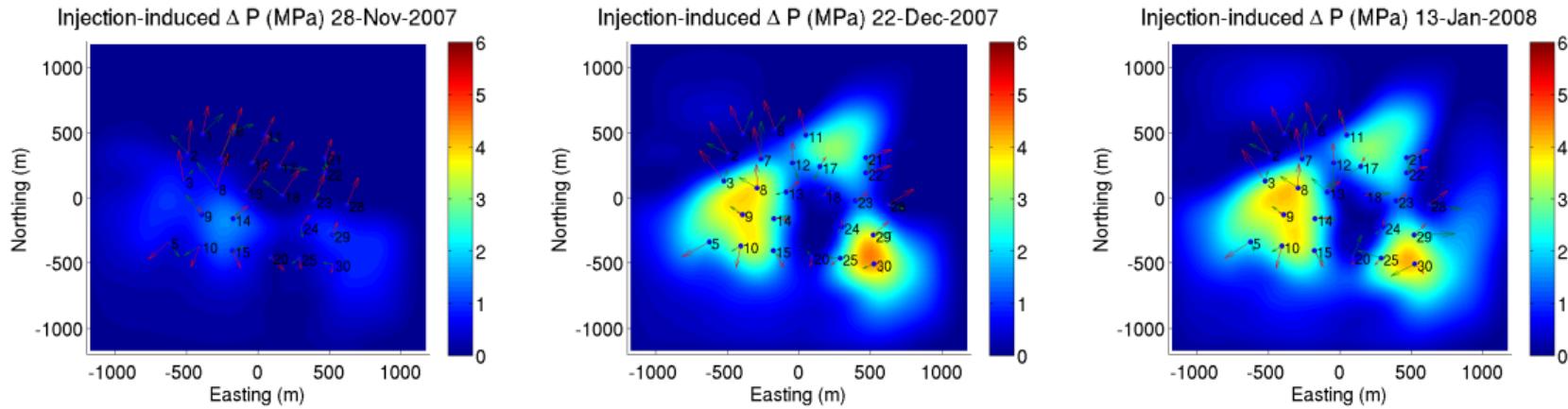
Stability with respect to regularization, $\epsilon = 10^{-3}$



Stability with respect to regularization, $\epsilon = 5 \times 10^{-3}$



Stability with respect to regularization, $\epsilon = 10^{-2}$





NEW (SEP158, pp 271-278): **resolving sharp pressure contrasts**
(methodology and a synthetic example)



Boundary-preserving inversion

Achieve better resolution of subsurface heterogeneities (e.g, **permeability barriers**) by using edge-preserving total-variation regularization:

$$\| \mathbf{A}p - \mathbf{u} \|_{L_2}^2 + \boxed{\epsilon \||\nabla p|\|_{L_1}} \rightarrow \min, \quad (\text{BOUNDTVREG})$$
$$p_1 \leq p \leq p_2.$$

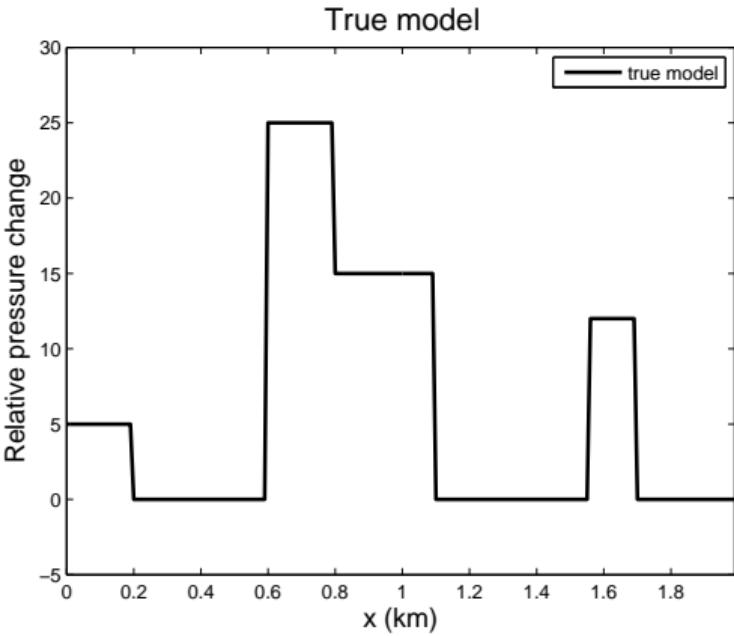
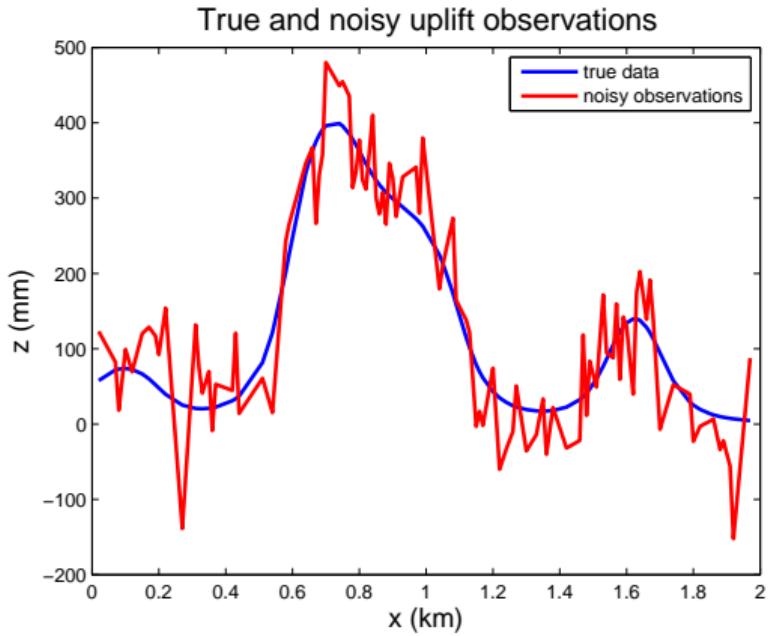


Boundary-preserving inversion

Achieve better resolution of subsurface heterogeneities (e.g, **permeability barriers**) by using **edge-preserving total-variation** regularization:

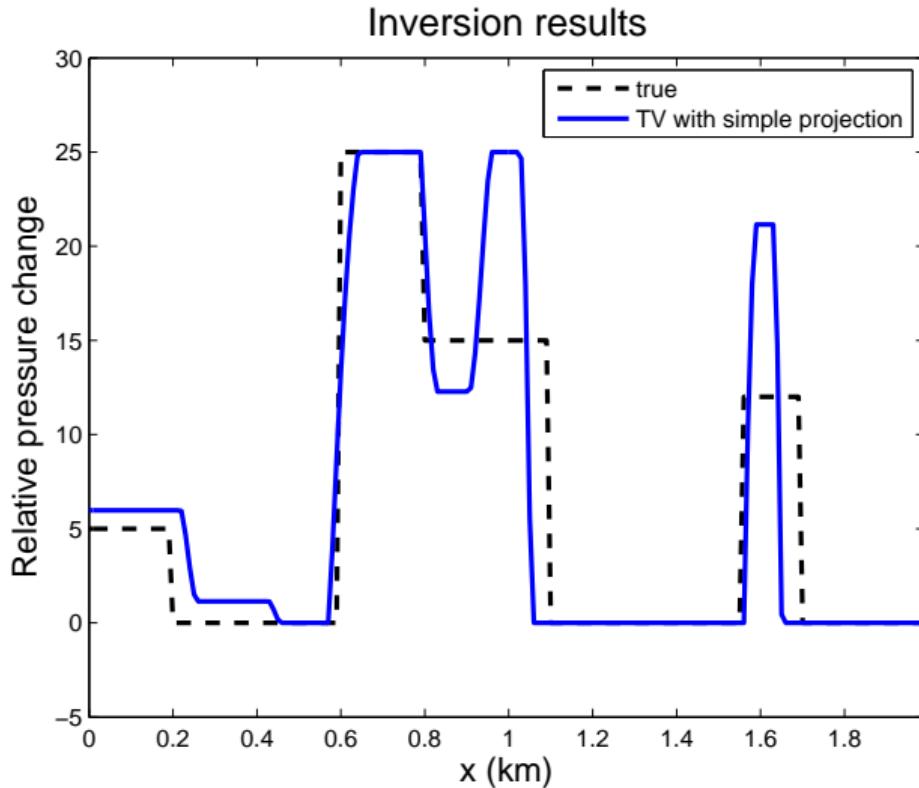
$$\|\mathbf{A}p - \mathbf{u}\|_{L_2}^2 + \epsilon \|\nabla p\|_{L_1} \rightarrow \min, \quad (\text{BOUNDTVREG})$$
$$p_1 \leq p \leq p_2.$$

Resolving sharp pressure contrasts

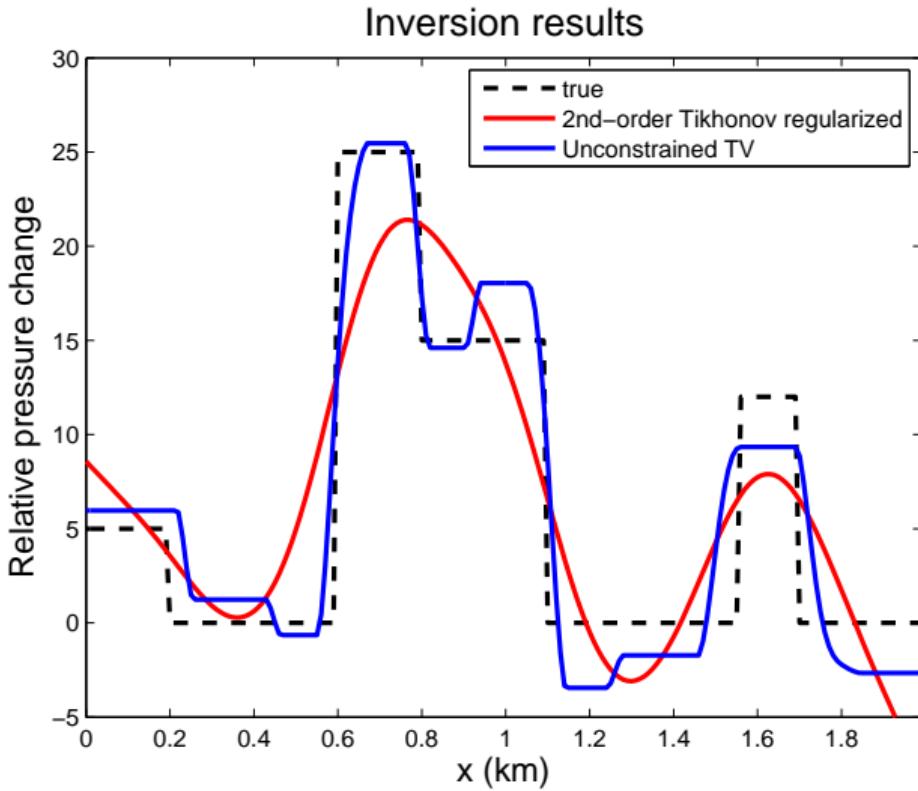




Naive constrained inversion—false contrasts

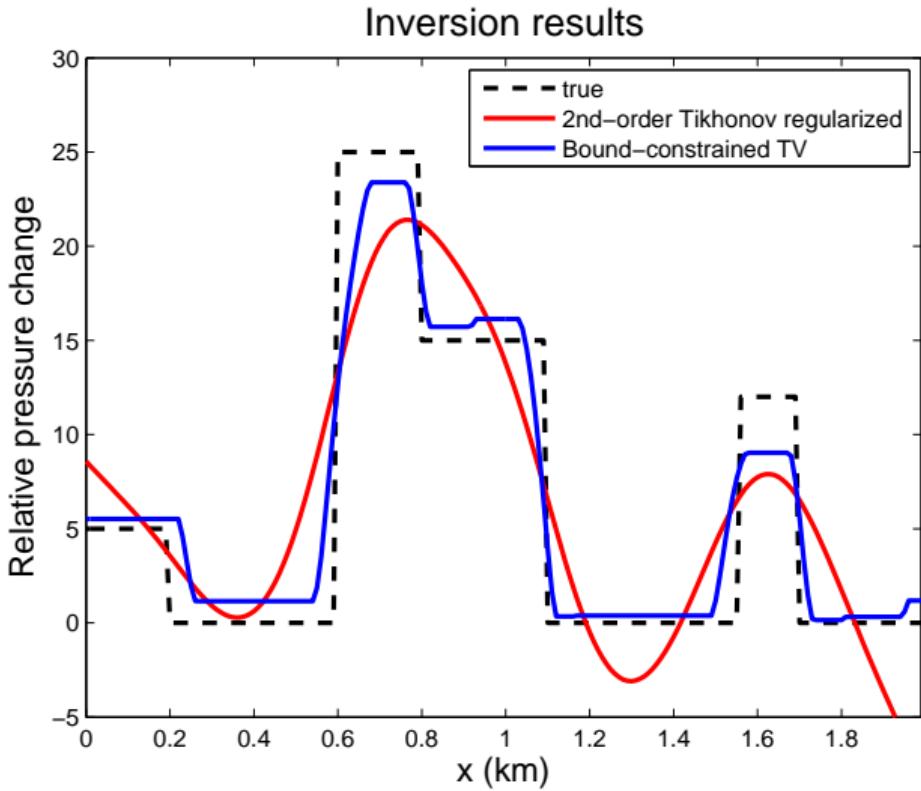


Unconstrained inversion—false contrasts and violated bounds





New constrained inversion





1. Can estimate pressure front evolution from surface deformation
2. “Wormholes” (Hinkle and Batzle, 2006) and fluid-conducting faults require a different treatment
3. Not limited to directly measurable deformation; e.g., can estimate induced deformation from time-lapse (Hodgson, 2007)

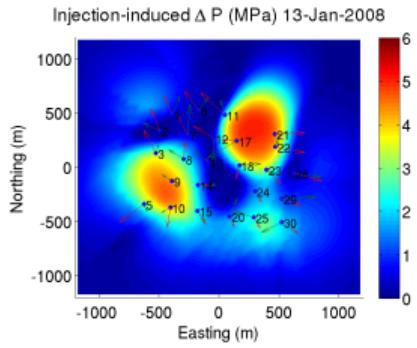
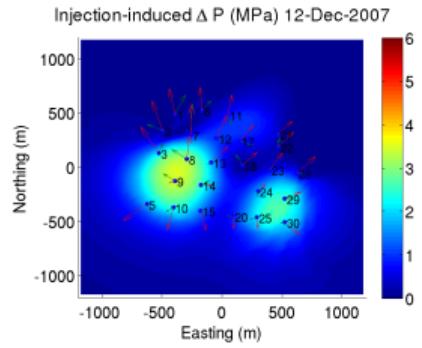
4. **SEP158 synthetic:** TV-regularization with bound constraints \Rightarrow location of sharp pressure contrasts



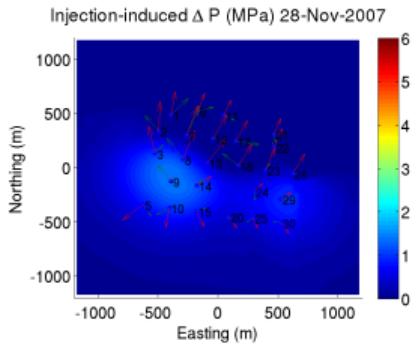
Acknowledgements

The authors thank **Biondo Biondi** and **Randi Walters** for a number of useful discussions

Q&A



Q&A





Appendices – discussion slides

Heavy Oil Sands, from Mossop (1979)

