

# Quantifying Changes in Site Hazard for Induced Seismicity through Bayesian Inference

Jack W. Baker and Abhineet Gupta

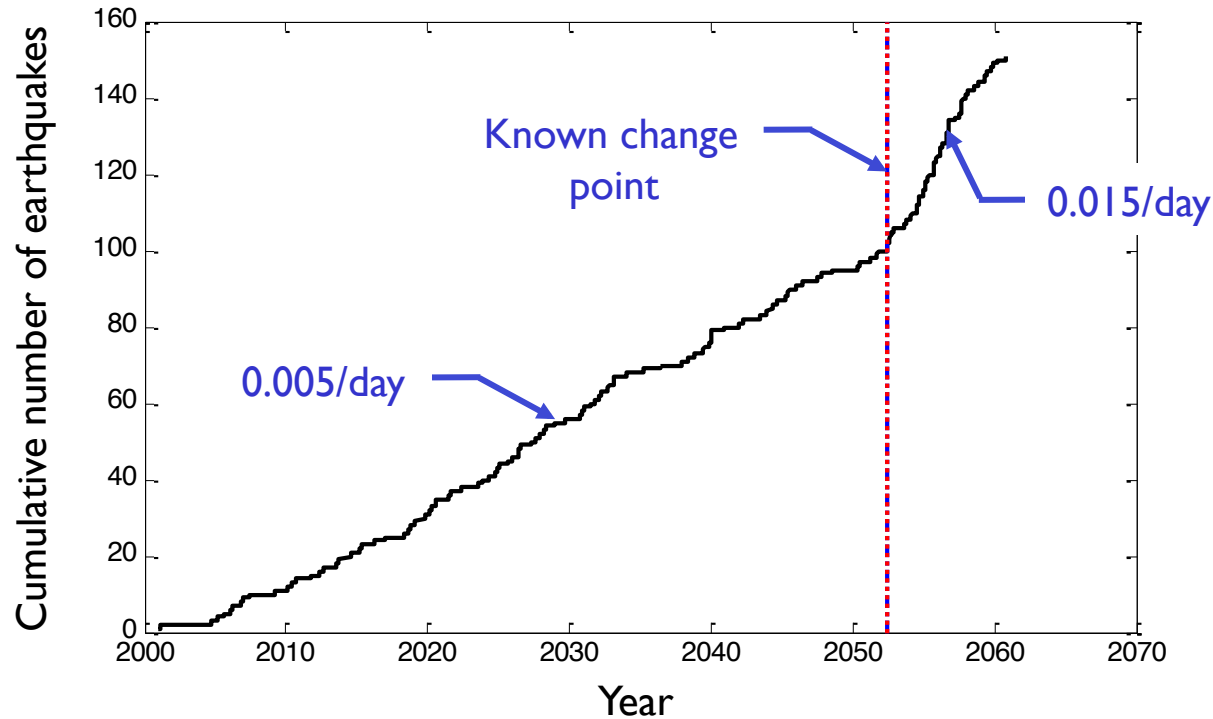
## Motivation

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- Probabilistic seismic hazard analysis (PSHA) is used worldwide to assess risk from natural seismicity
- Its application to induced seismicity is nontrivial
  - Detecting changes in seismicity is important for PSHA (and other decision support—traffic lights)
  - Common assumptions in natural-seismicity hazard analysis may not be appropriate

## Change Point detection illustrated with simulated seismicity data

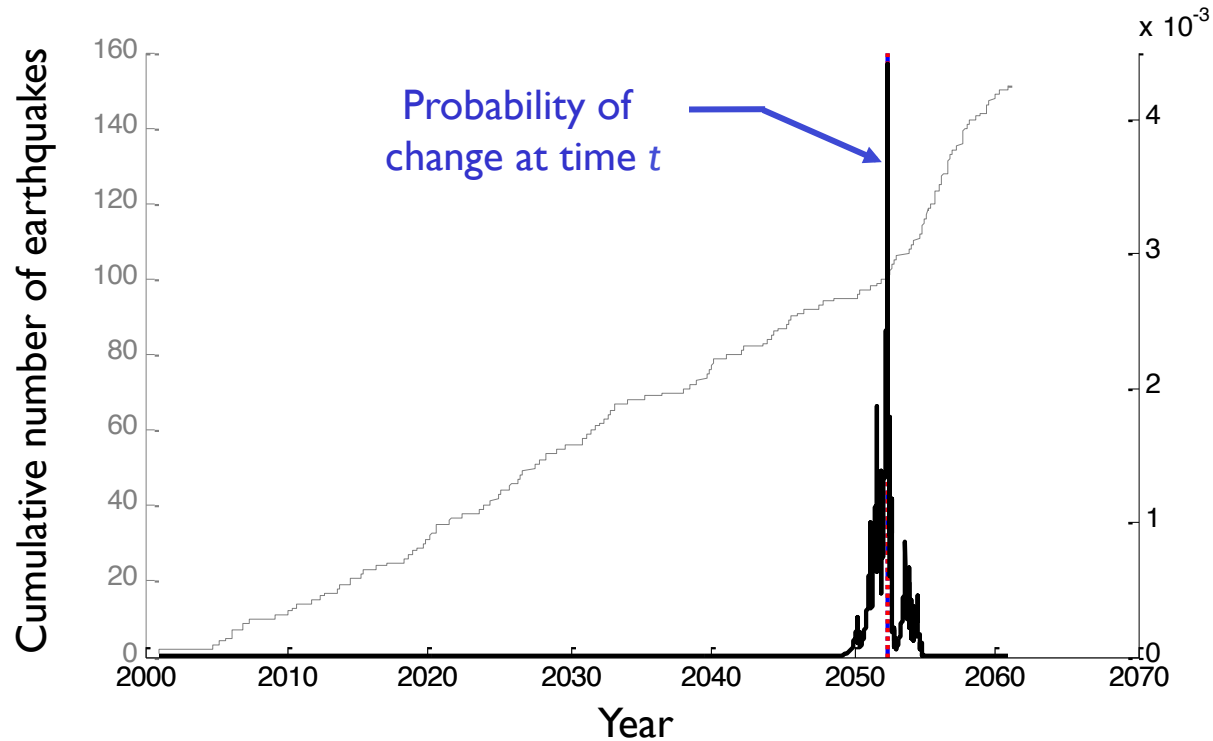
This example data comes from a Poisson process, where the rate of events triples at a known point in time. Can we detect this Change Point using only the observed data?



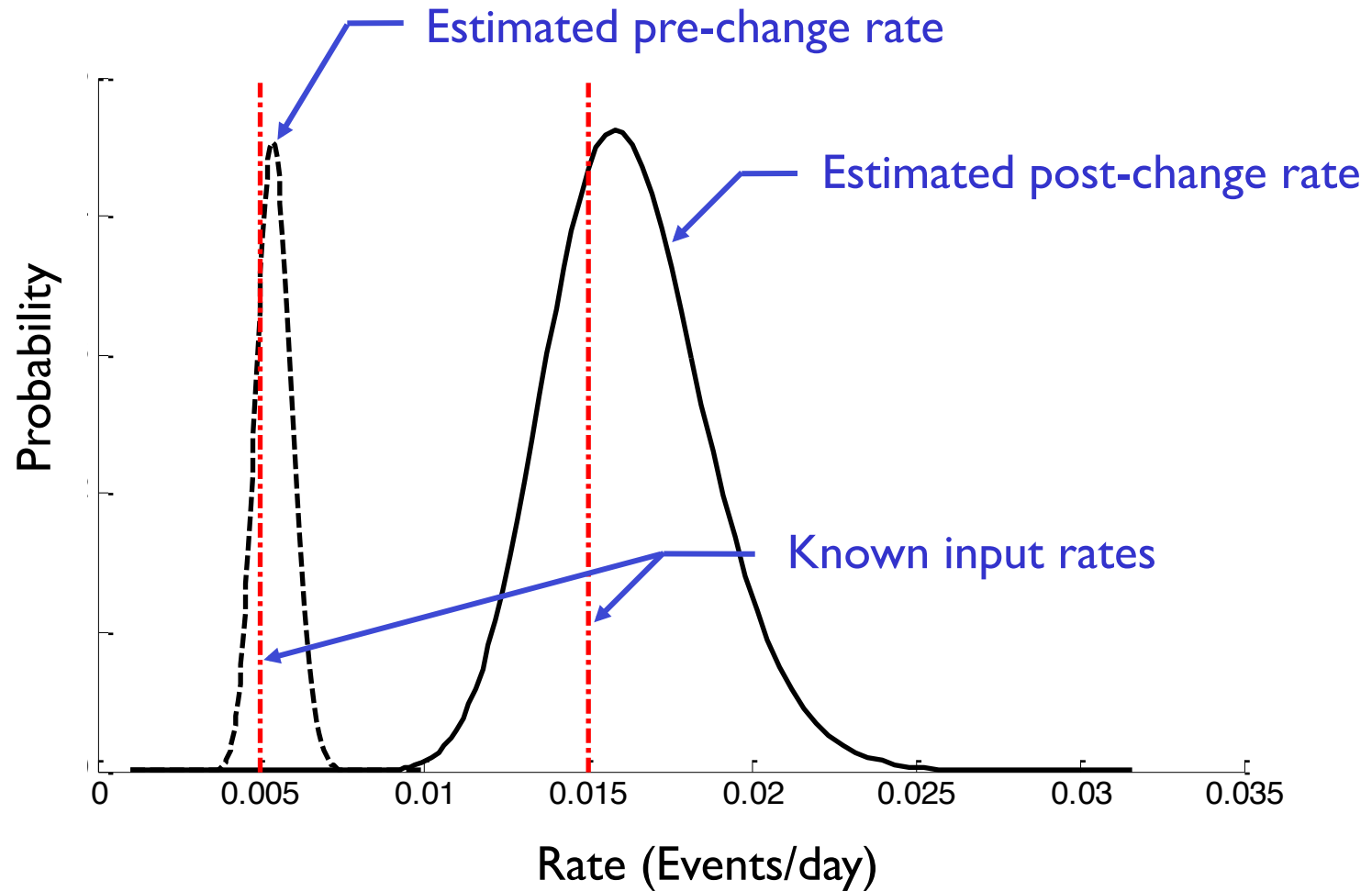
Bayes Factor:  $B_{01} = \frac{p(t | H_0)}{p(t | H_1)}$  ← Likelihood assuming a constant rate  
 ← Likelihood assuming a rate change in the data

## Change-Point results: time of change

We can also calculate the probability of the Change Point being at time  $t$

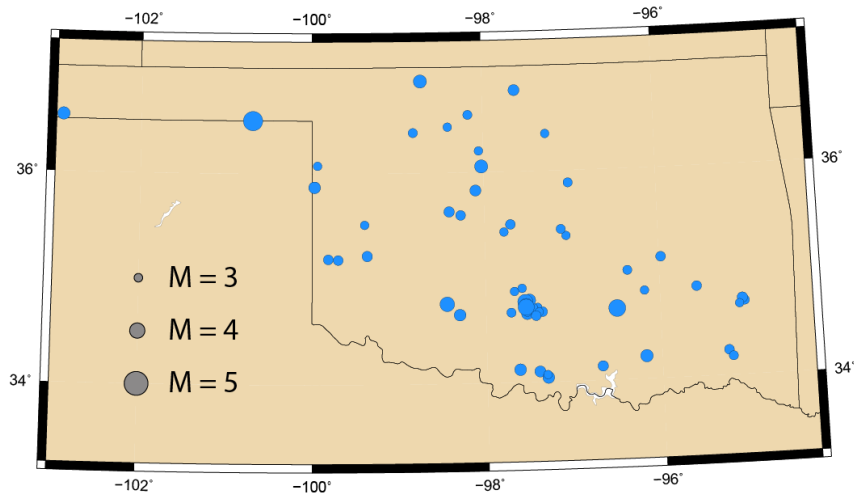


## Change-Point results: event rates

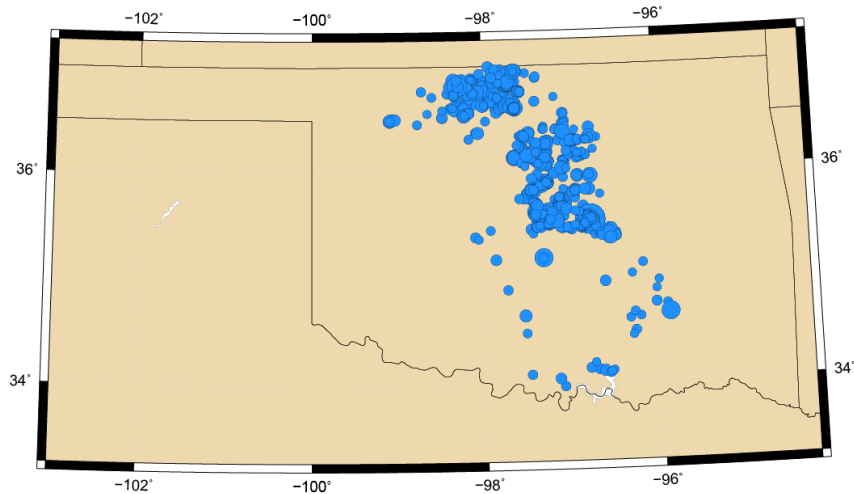


# Change Point detection for Oklahoma seismicity

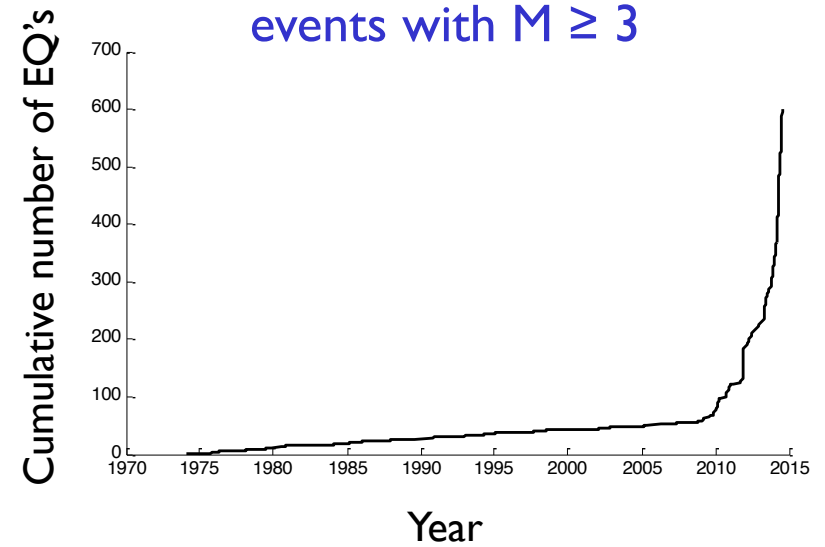
1974 - 2008



2009 - February 2015



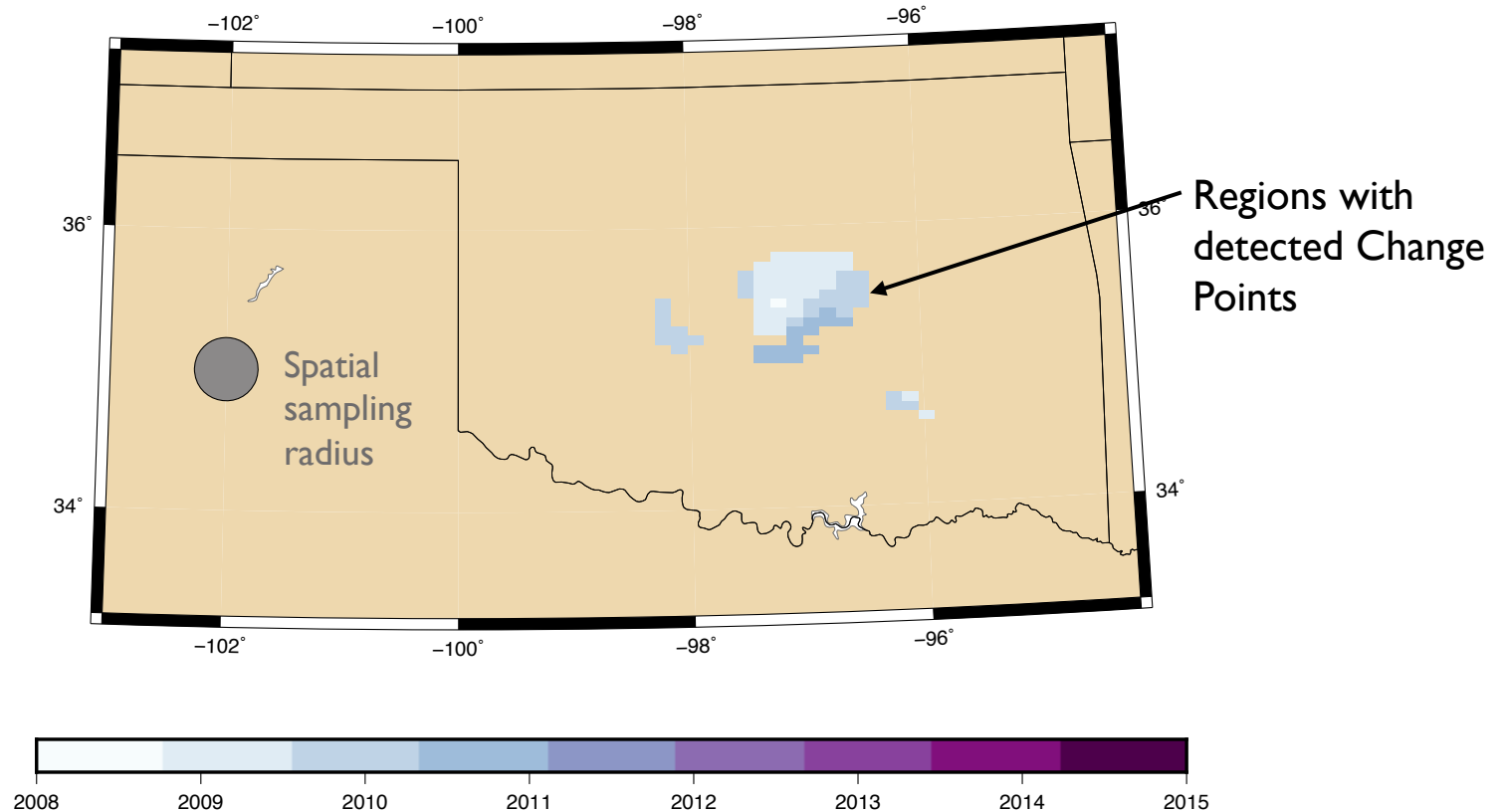
Cumulative number of events with  $M \geq 3$



# Change Point detection for Oklahoma

From declustered catalog of  $M \geq 3$  earthquakes (Oklahoma Geological Survey)

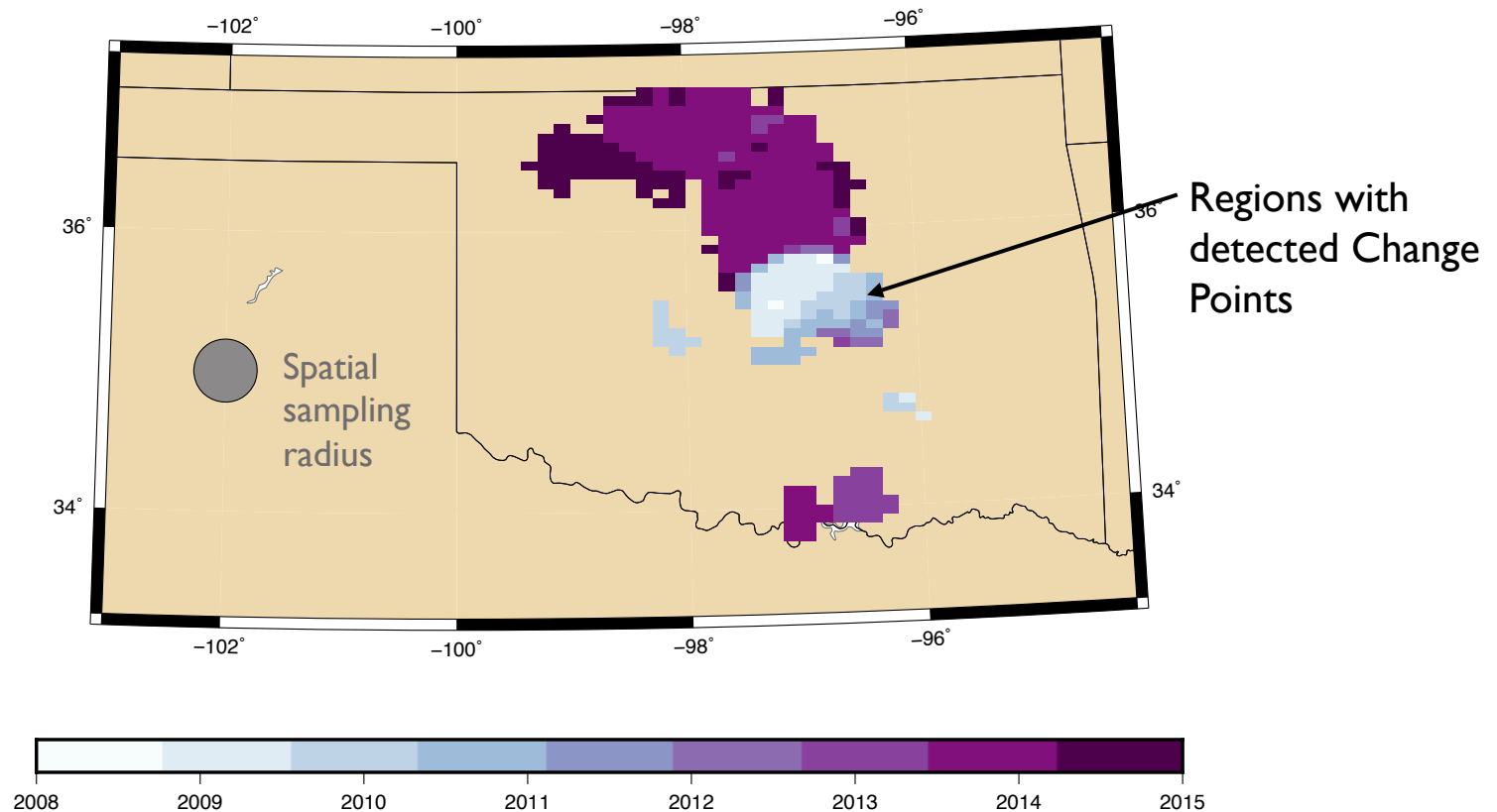
From seismicity through 2010



## Change Point detection for Oklahoma

From declustered catalog of  $M \geq 3$  earthquakes (Oklahoma Geological Survey)

From seismicity through 2014

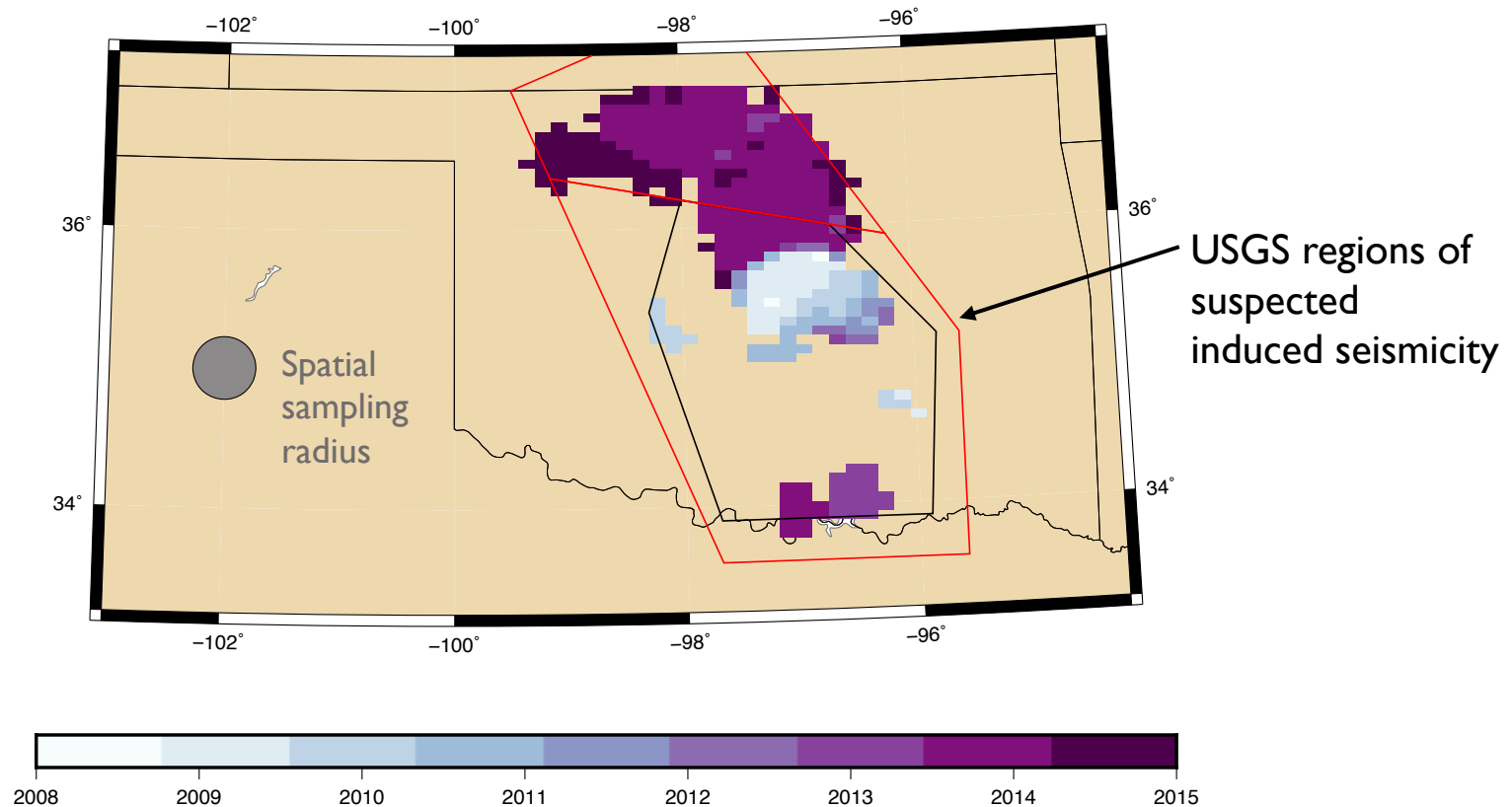




# Change Point detection for Oklahoma

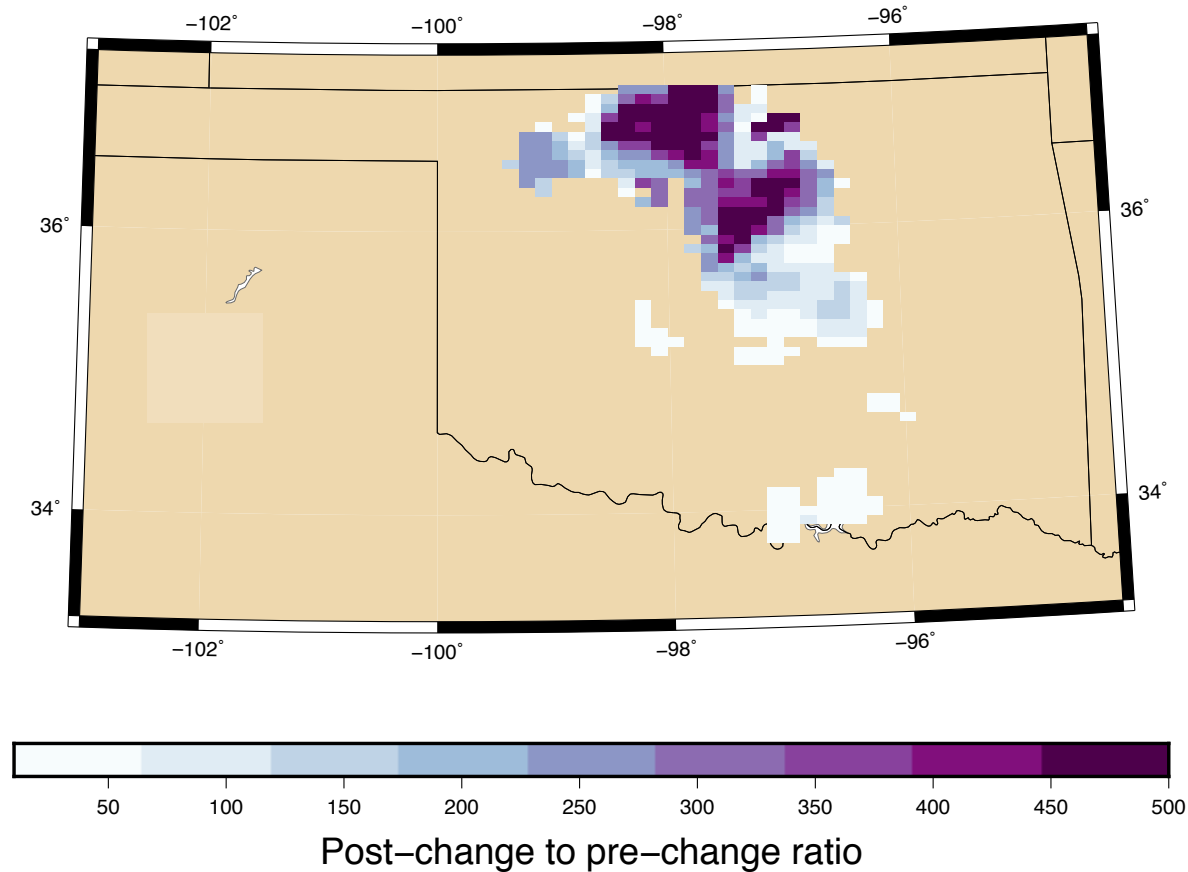
From declustered catalog of  $M \geq 3$  earthquakes (Oklahoma Geological Survey)

From seismicity through 2014



## Increases in seismicity rates

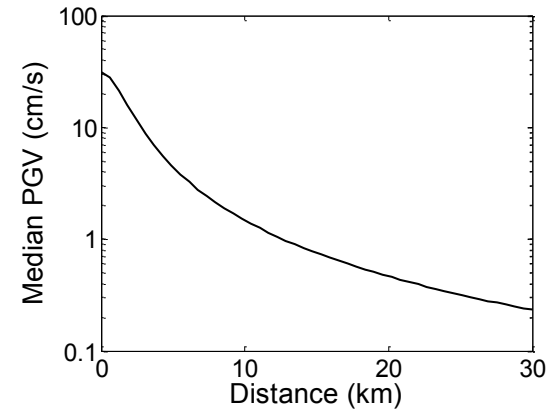
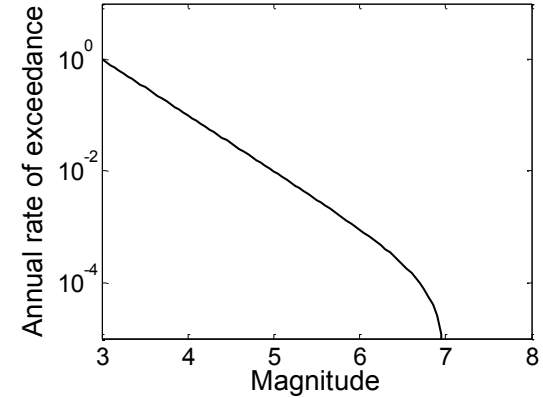
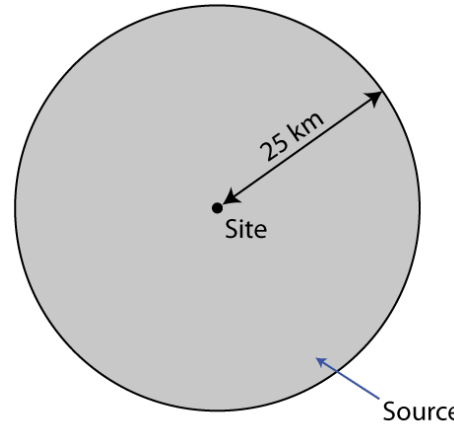
The seismicity rate is increased in many regions by a factor of 100



# Effect of seismicity models on seismic hazard

## Base model

- Areal source (25 km radius considered)
- Gutenberg-Richter recurrence model
  - one  $M=3$  earthquake per year
  - $b=1, M_{min} = 3, M_{max} = 7$
- Atkinson (2015) ground motion prediction model (calibrated for induced seismicity)



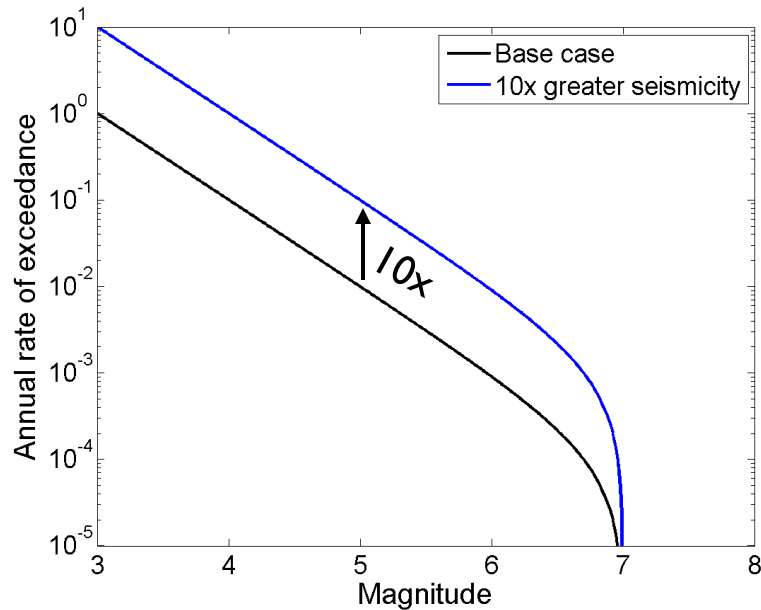
Hazard  $\swarrow$  Ground motion prediction  $\swarrow$  Distance distribution  $\swarrow$

$$\lambda(PGV > x) = \sum_{sources} \left[ \lambda(m_{min}) \cdot \sum_M \sum_R P(PGV > x | m, r) P(M = m) P(R = r) \right]$$

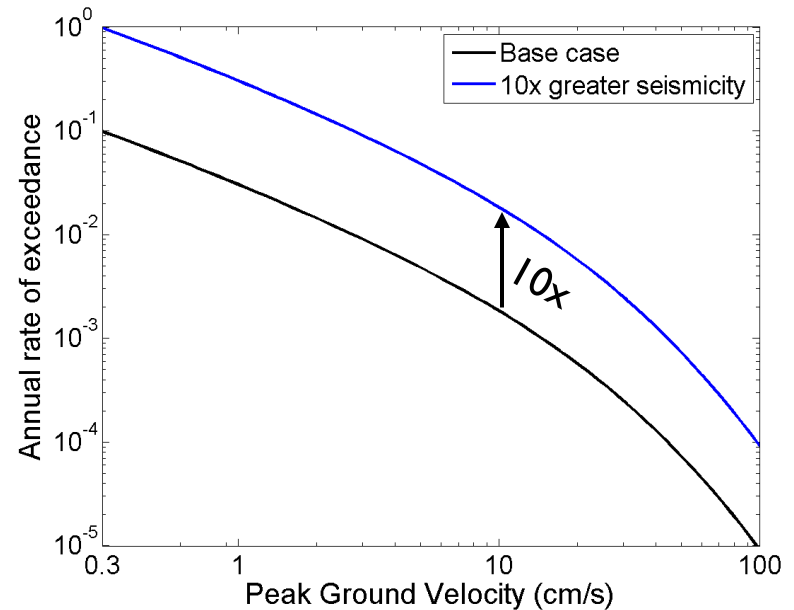
Seismicity rate  $\nearrow$  Magnitude distribution  $\nearrow$

# Impact of seismicity rate on PSHA results

## Earthquake rates



## Ground motion hazard

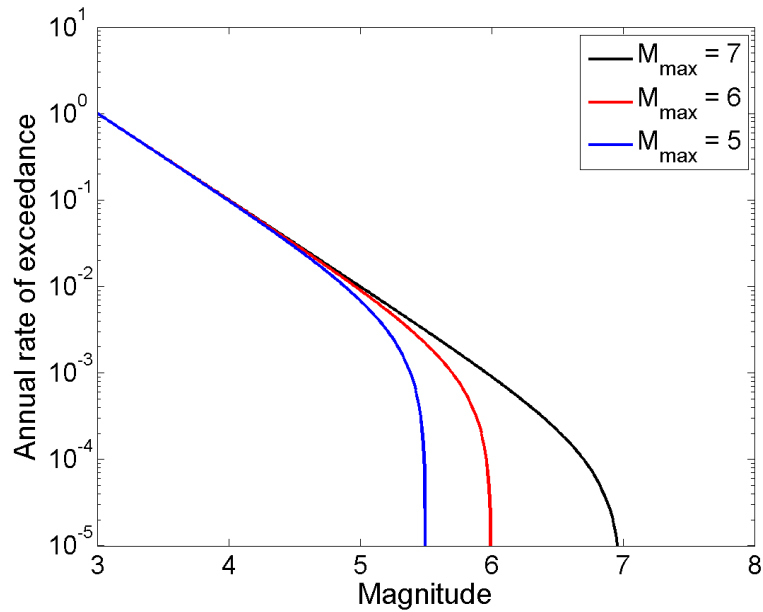


$$\lambda(PGV > x) = \sum_{sources} \left[ \lambda(m_{min}) \cdot \sum_M \sum_R P(PGV > x | m, r) P(M = m) P(R = r) \right]$$

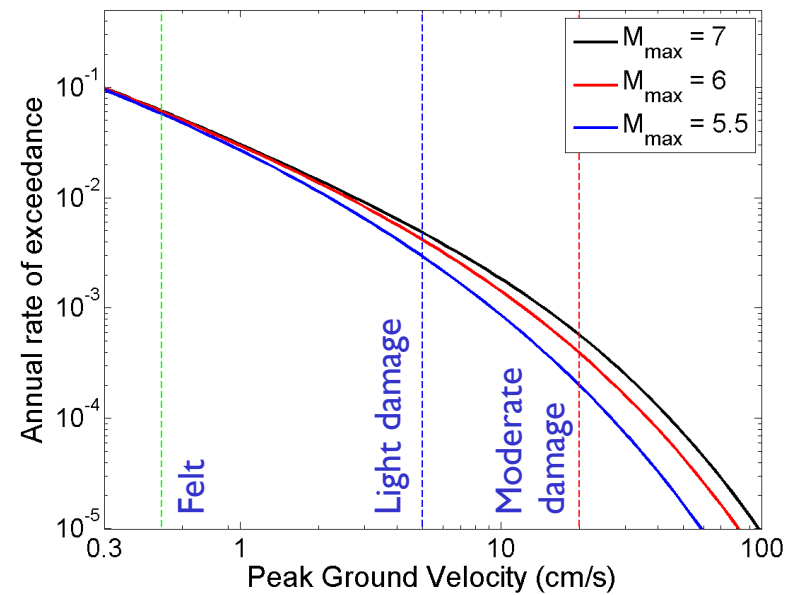
Seismicity rate

# Impact of $M_{max}$ on PSHA results

## Earthquake rates

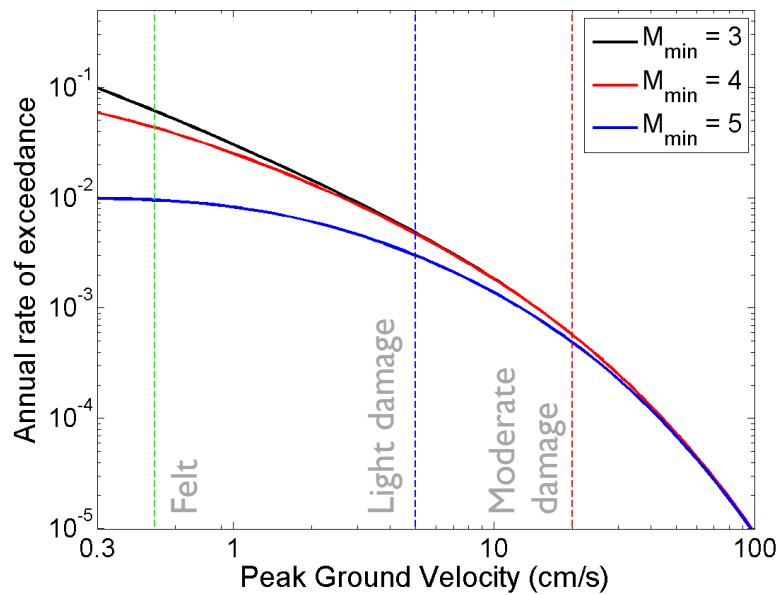


## Ground motion hazard

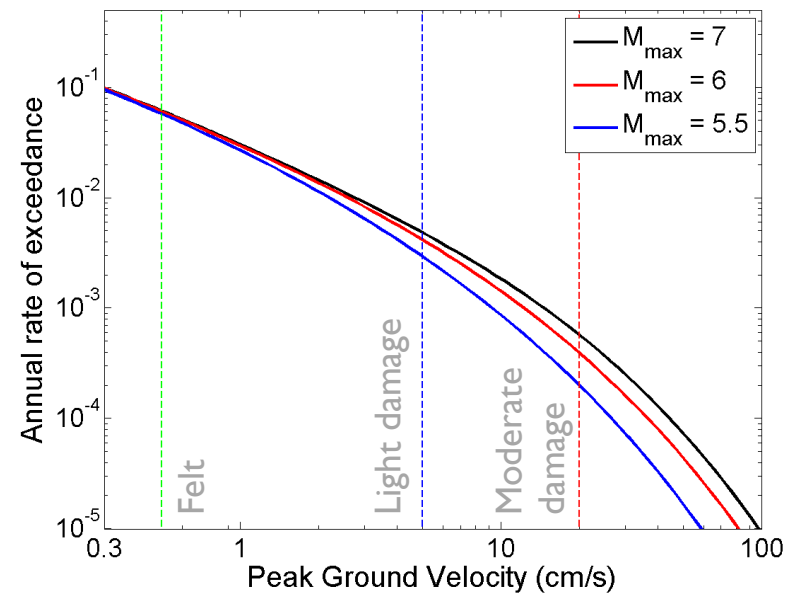


# Impact of $M_{min}$ and $M_{max}$ on PSHA results

## Varying $M_{min}$

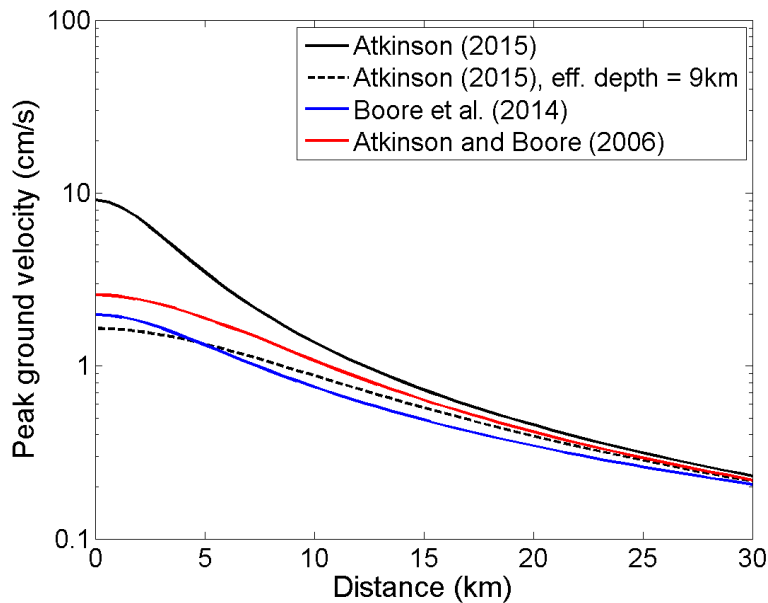


## Varying $M_{max}$

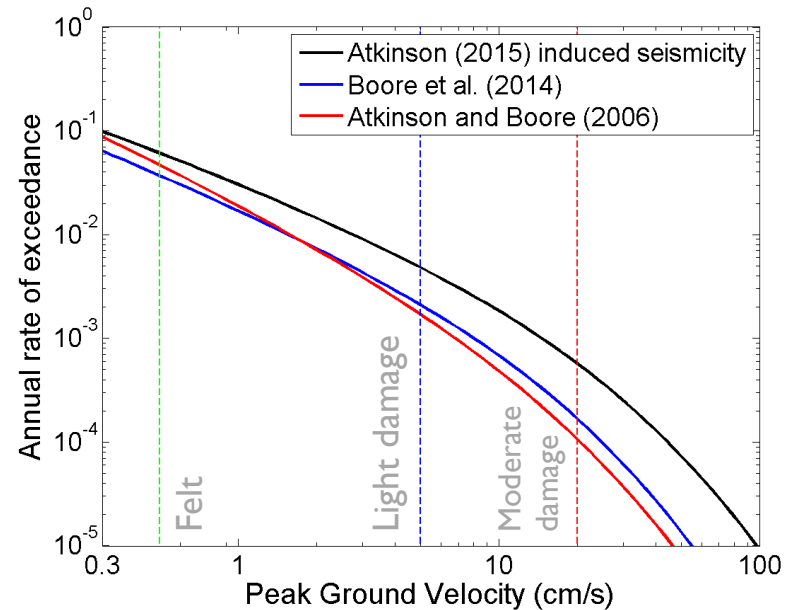


# Impact of ground motion prediction model on PSHA results

## Ground motion predictions (M=5)

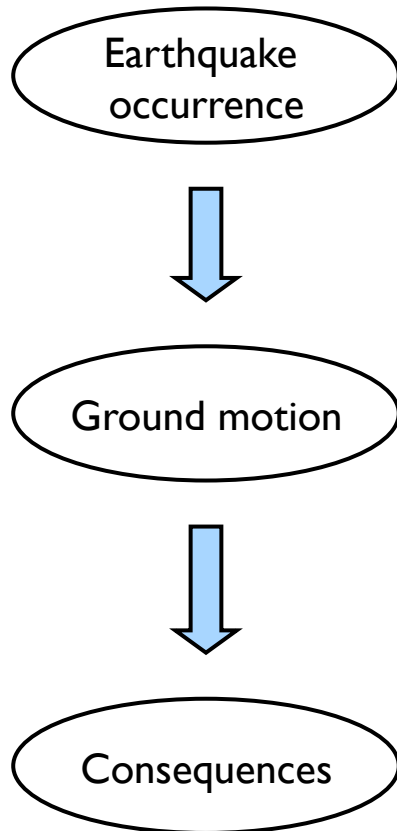


## Ground motion hazard

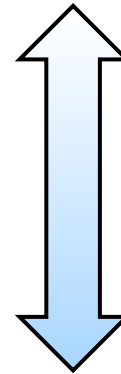


## Potential risk management actions

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- Simpler to make decisions or rules (fewer models required)
- Poor link to risk (ground motions cause damage, not earthquakes)



- Most direct measure of risk
- Requires more models



## Conclusions

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- Seismicity rates are a key input to seismic hazard analysis, and changes in seismicity rates can be detected and quantified using the Bayesian Change-Point calculations
- The results have relevance to seismic calculations and stop-light systems for risk management
- Traditional intuition regarding PSHA important parameters for PSHA calculations may not apply when considering frequent low-amplitude events

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