

# Are Massive Earthquakes Correlated?

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thanks: Charles Ammon (Penn State), Thorne Lay (UCSC),  
Terry Wallace (LANL), Joan Gomberg (USGS), Chunquan Wu (LANL)

E.G. Daub, EB, R.A. Goyer, P.A. Johnson, Geophys. Res. Lett. 39, L06308 (2012)

EB, E.G. Daub, P.A. Johnson, Geophys. Res. Lett. **39**, 3021 (2013)

C. Wu, J. Gomberg, EB, P.A. Johnson, Geophys. Res. Lett. **41**, 1499 (2014)

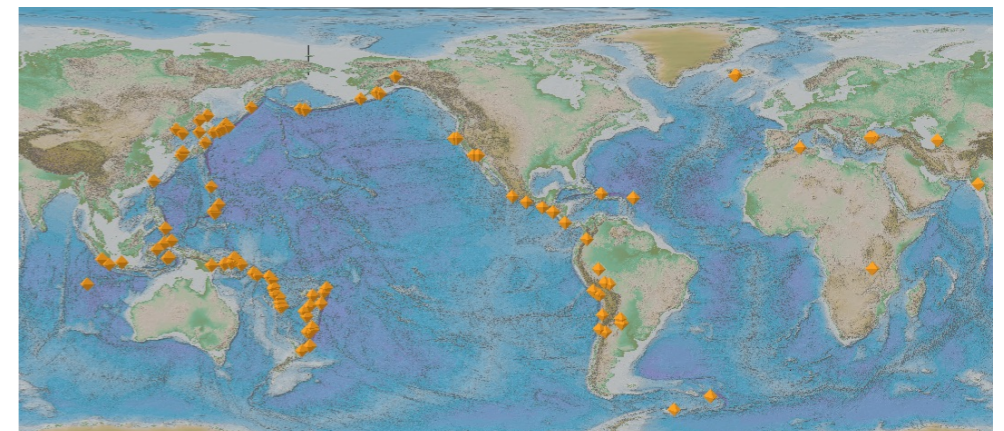
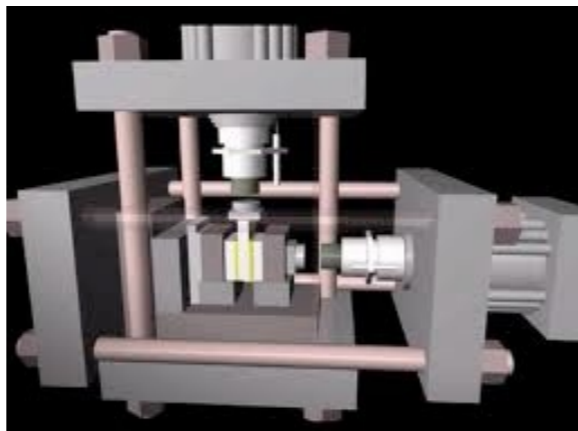
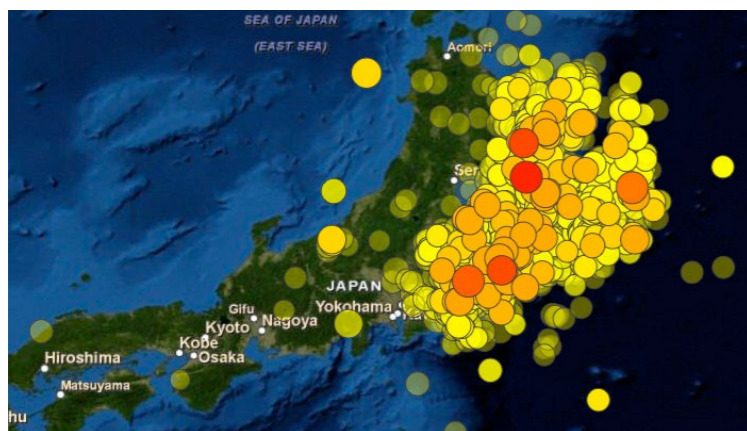
T-4 Blabs, April 20 2015

# Plan

- Remote triggering of earthquakes
- Statistics of number of events in a time interval
- Statistics of time interval between events

# Remote triggering of earthquakes

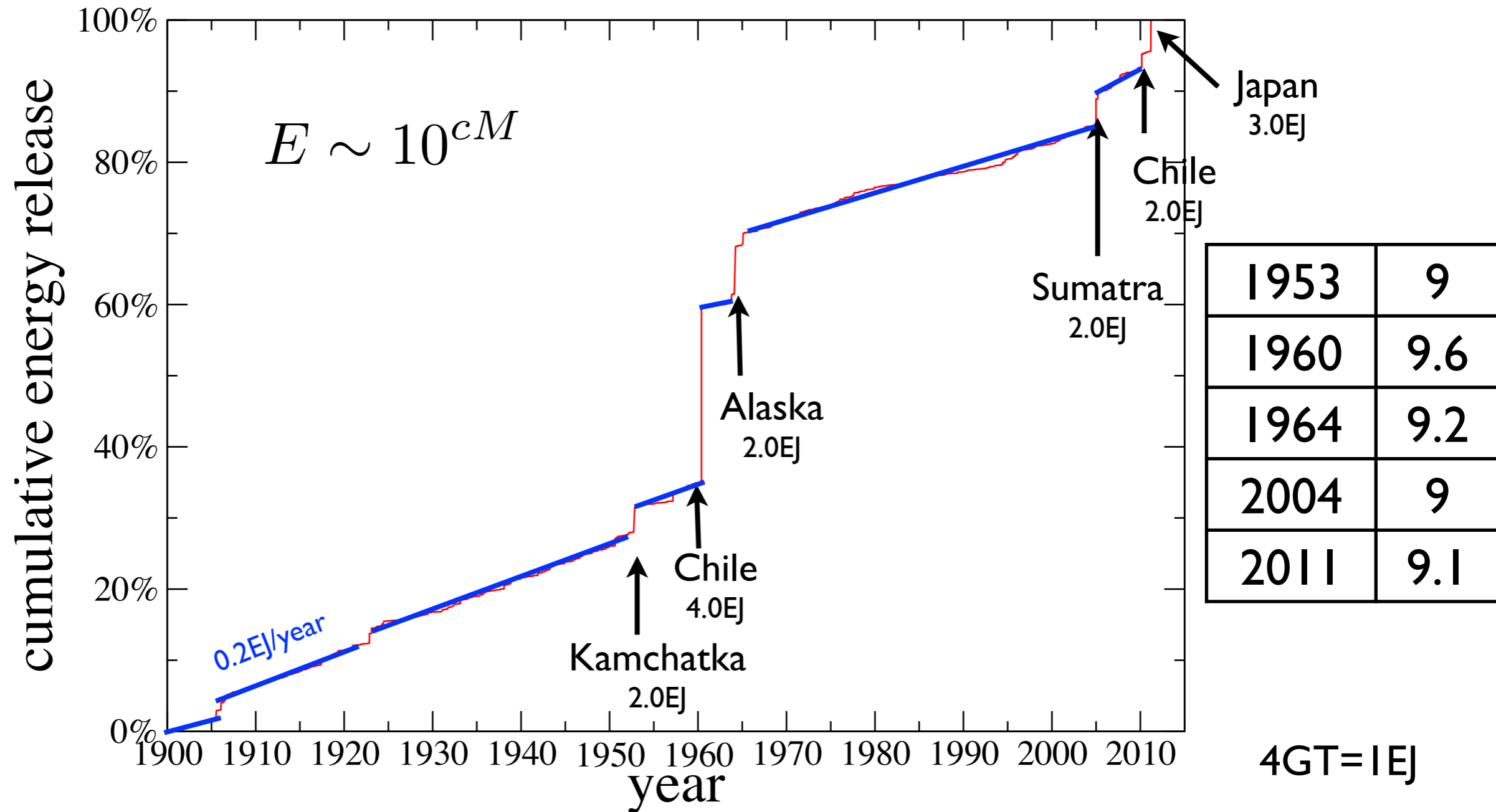
- We know large earthquakes generate smaller earthquakes locally = aftershocks Gomberg 05
- Do large earthquakes trigger large earthquakes globally?
- Growing evidence for global interactions Lay & Ammon 10
- Earthquake triggering & granular matter project Johnson, PI
  - Experiments in sheared granular matter (PSU, LANL)
  - Simulations of sheared granular matter (ETH, LANL)
  - Field observations, acoustics (Parkfield, CA: USGS, LANL)
  - Statistical analysis (LANL)



# Plate Tectonics & Mantle Convection



# Earth as an “earthquake machine”

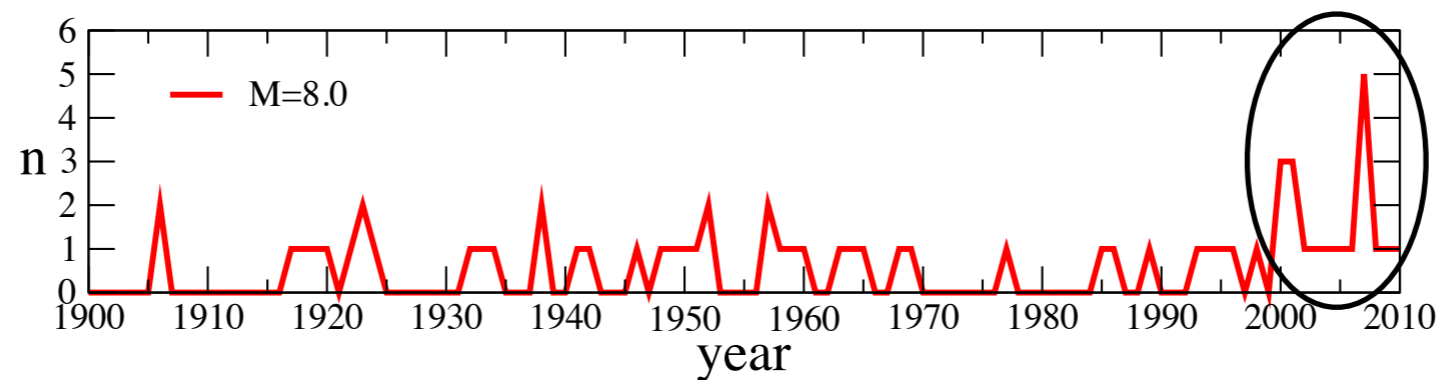
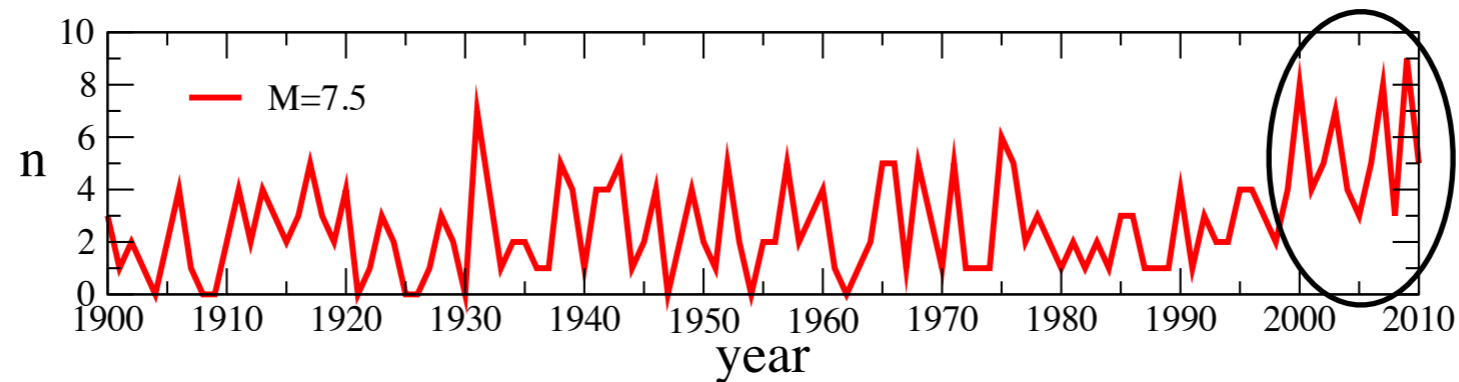
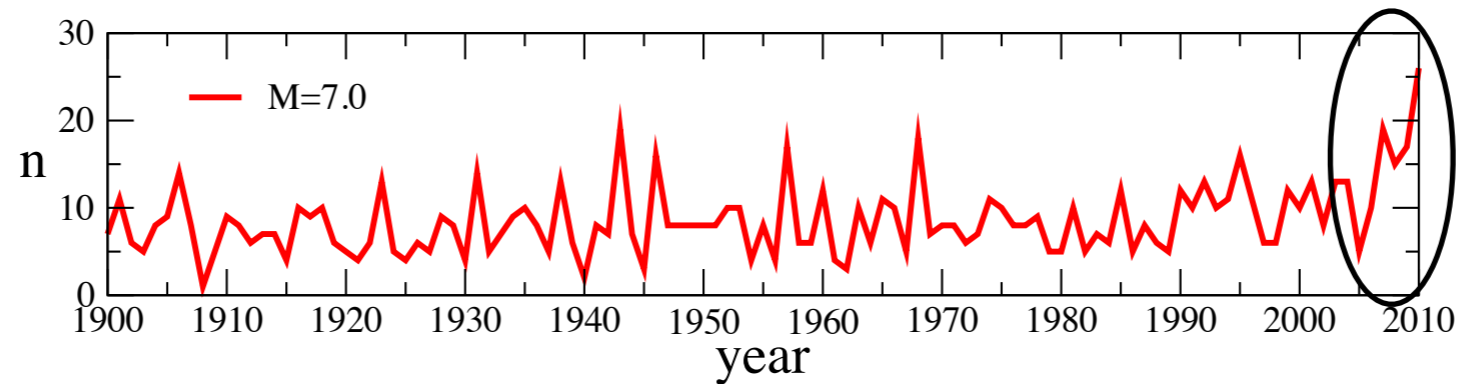


1. Few megaquakes account for a fraction of all energy release!
2. Two “clusters”: 1960-1964, 2004-2010

**Part I:**

**Statistics of the number  
of events a time interval**

# Uptick in large earthquakes?



Increase in number of large earthquakes, latest decade  
**correlations in time?**

# Questions

- Is uptick statistically significant?
- What is the likelihood of such an uptick?
- How to quantify such likelihoods?
- Is data complete? consistent?
- Role of aftershocks?

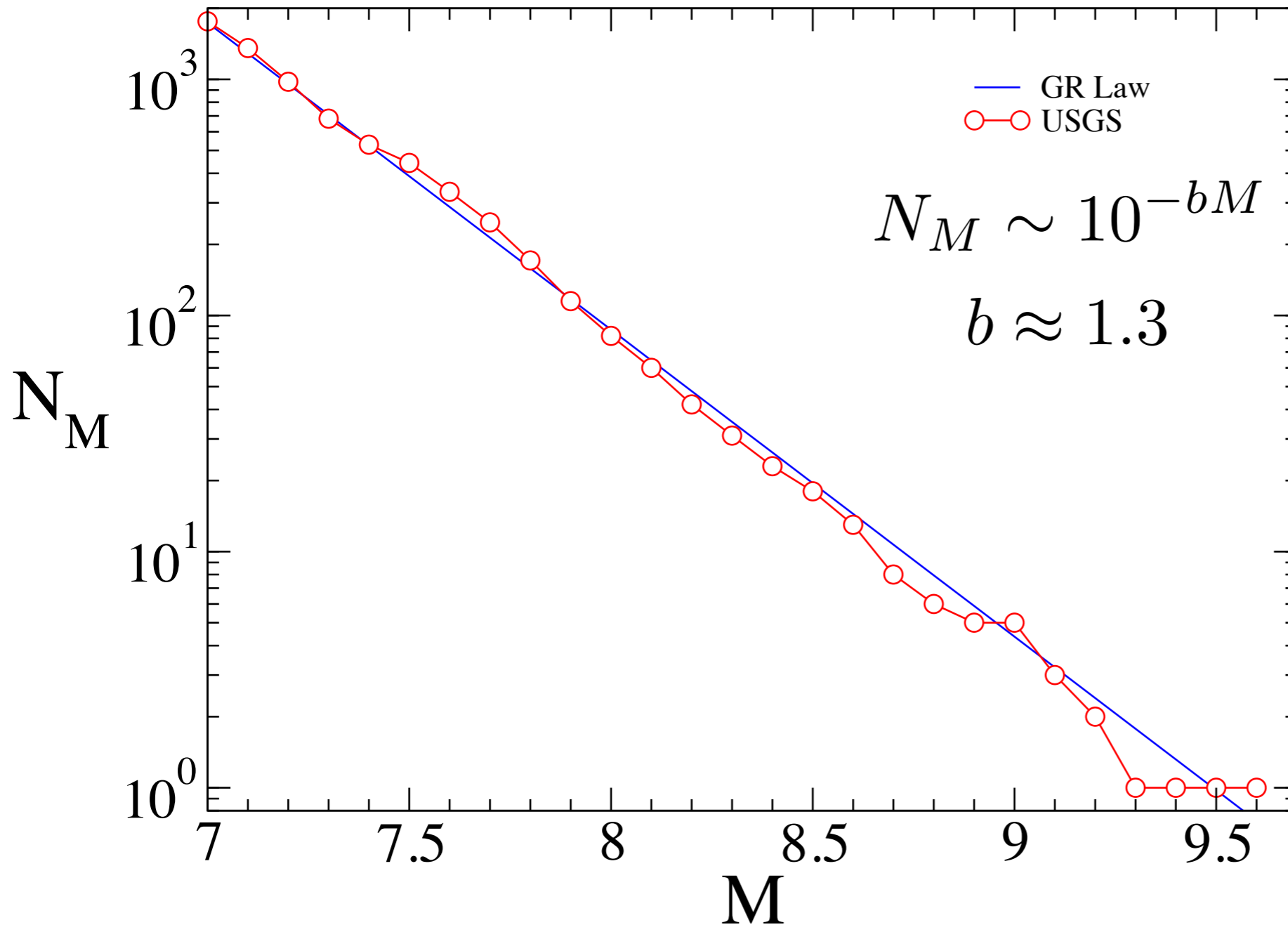
Are large earthquakes correlated in time?  
Are large earthquakes completely random?



# Data

- Catalogs: USGS (PAGER)
- All known magnitude  $> 7.0$  during 1900-2012
- Roughly 2000, 500, 100 magnitude  $>7.0, 7.5, 8.0$
- Dataset for  $M > 7.0$  is mostly complete
- Data is in format (t,M)=time, seismic moment magnitude
- Magnitude  $M = M_w$  surface wave magnitude

# Gutenberg-Richter Law



Magnitude	Annual #
9-9.9	1/20
8-8.9	1
7-7.9	15
6-6.9	134
5-5.9	1300
4-4.9	~13,000
3-3.9	~130,000
2-2.9	~1,300,000

Rundle 89  
Pacheco 92

Universal law, holds at all magnitudes  
even for the largest events

# Poisson Distribution

- Assumes no correlations between events
- Completely characterized by average  $\alpha$
- Specified the probability  $P_n$  of observing  $n$  events in given time interval  $T$  (in months)

$$P_n = \frac{\alpha^n}{n!} e^{-\alpha}$$

- Unique feature: variance equals average

$$\langle n \rangle = \sum_{n=0}^{\infty} n P_n = \alpha \quad V = \langle n^2 \rangle - \langle n \rangle^2 = \alpha$$

Use the random distribution to test for correlations

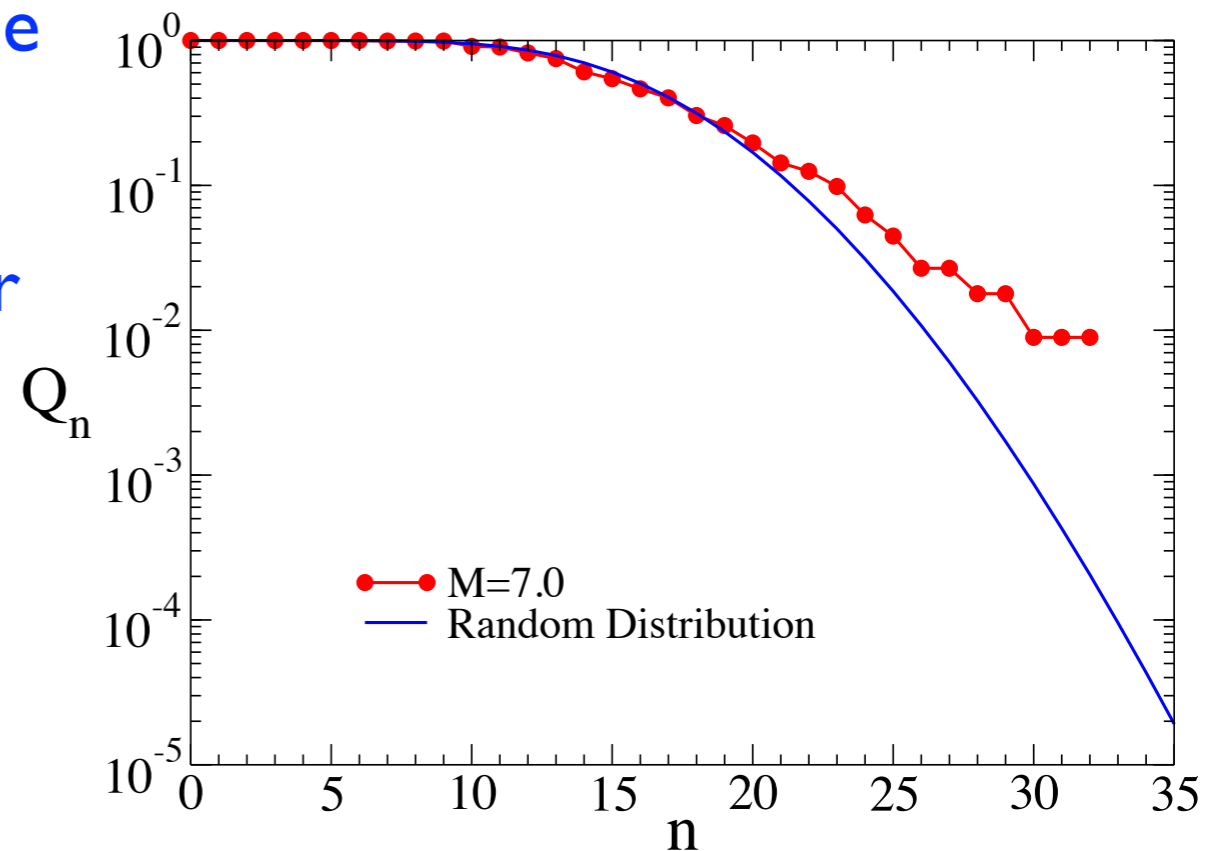
# Overpopulated Tails?

- Event = an earthquake with magnitude larger than thresholds  $M$
- Use cumulative probability  $Q_n$  that there are at least  $n$  events in one year

$$Q_n = \sum_{m=n}^{\infty} \frac{\alpha^m}{m!} e^{-\alpha}$$

- Use average from data

$$\alpha = 15.7$$

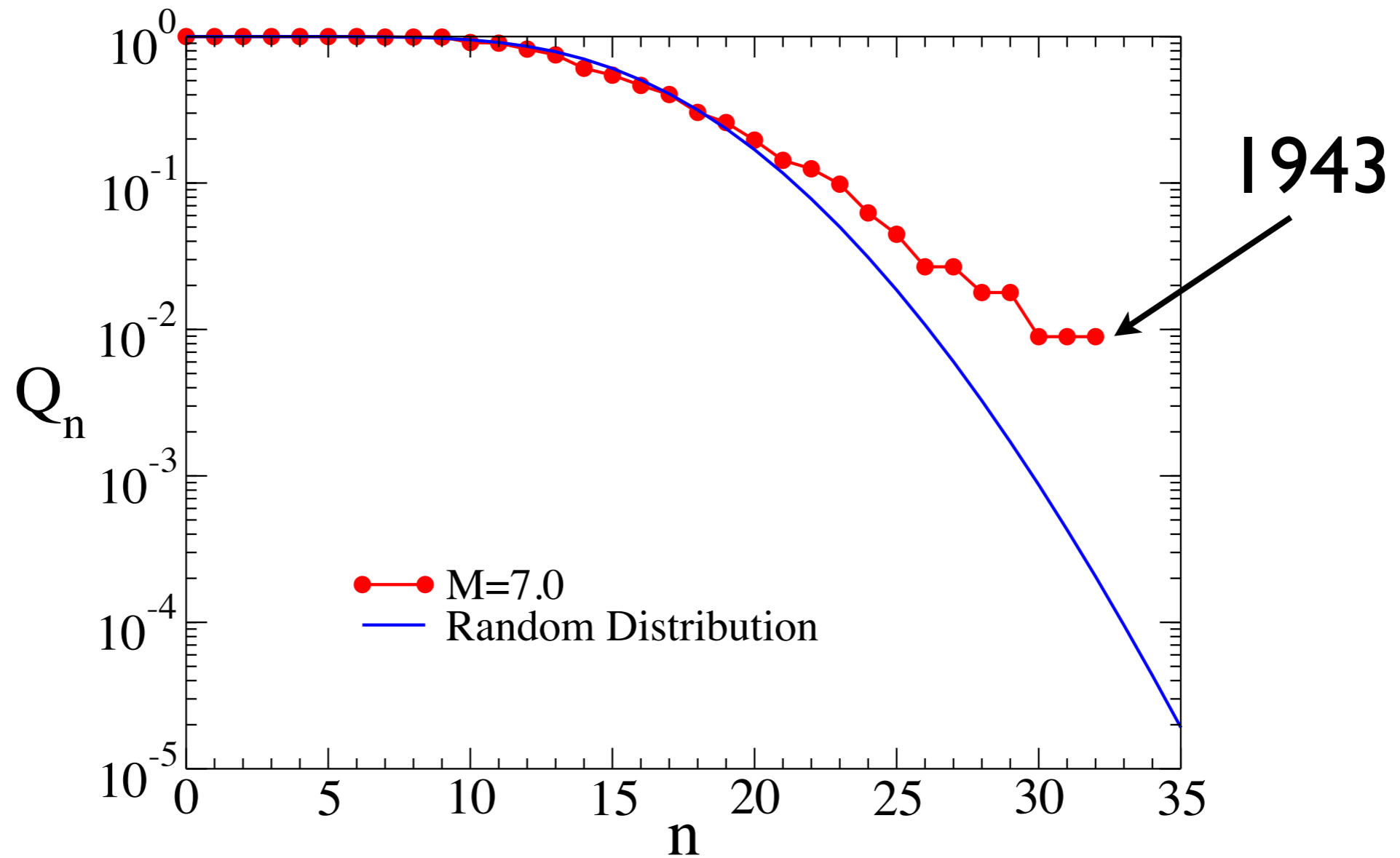


Observed frequency matches random distribution when  $n < \alpha$

Observed frequency larger than random distribution when  $n > \alpha$

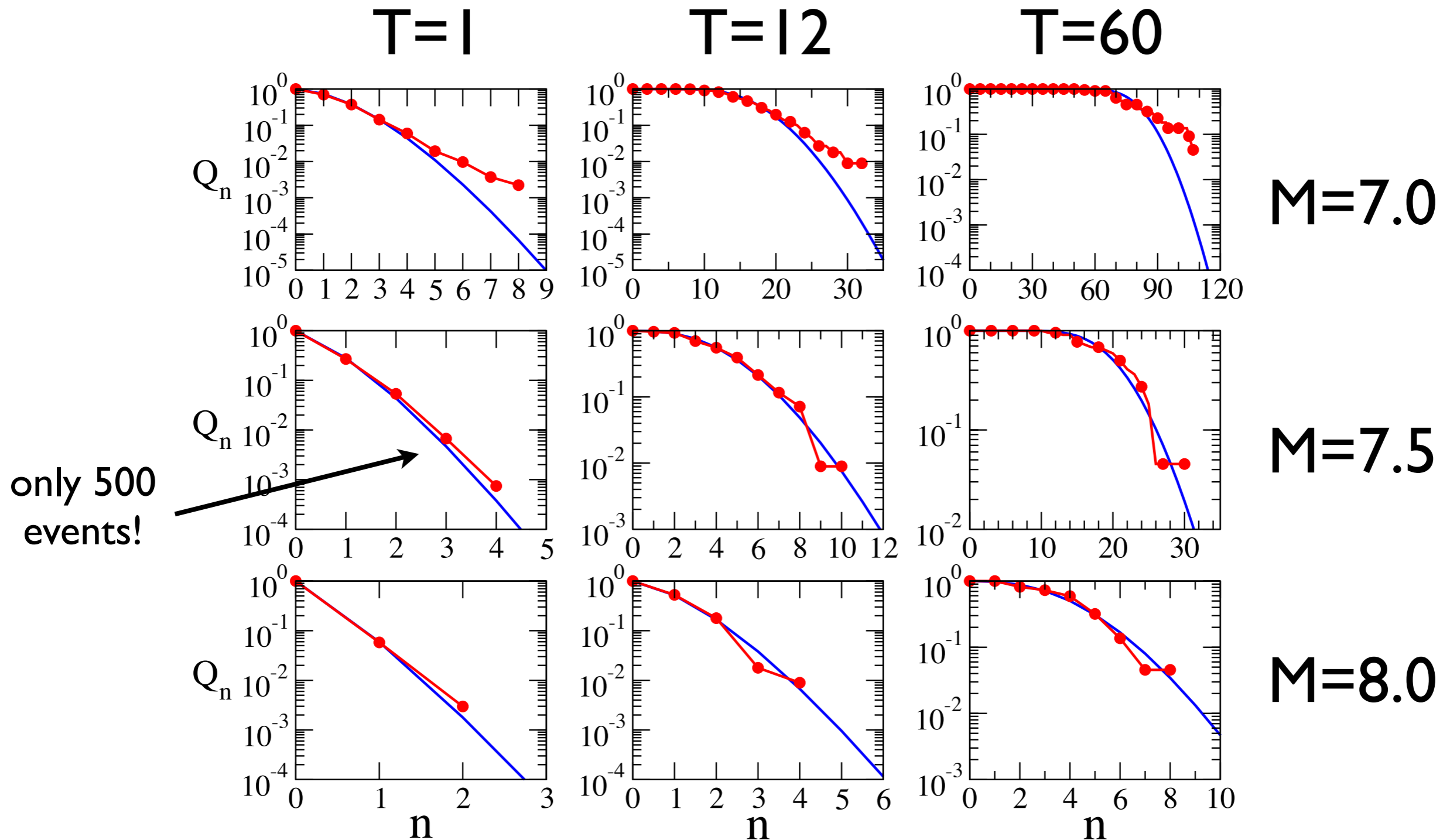
Number of large earthquakes appears to be enhanced  
Large earthquakes appear to be correlated in time

# Overpopulated Tails



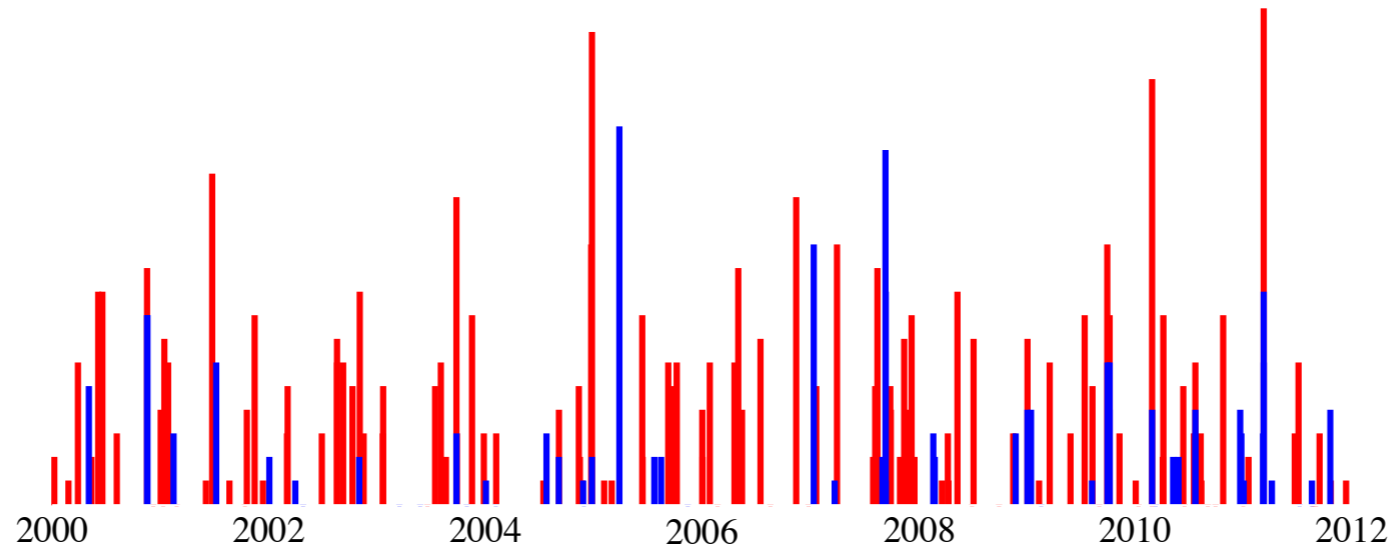
Distribution of number of events per year has an enhanced tail  
 $0.02 =$  expected number of years with 32 events if record is random!

# Dependence on threshold & time interval



Overpopulation significant only at  $M=7.0$   
Attribute to aftershocks, at least for short intervals  
Good agreement with random statistics otherwise

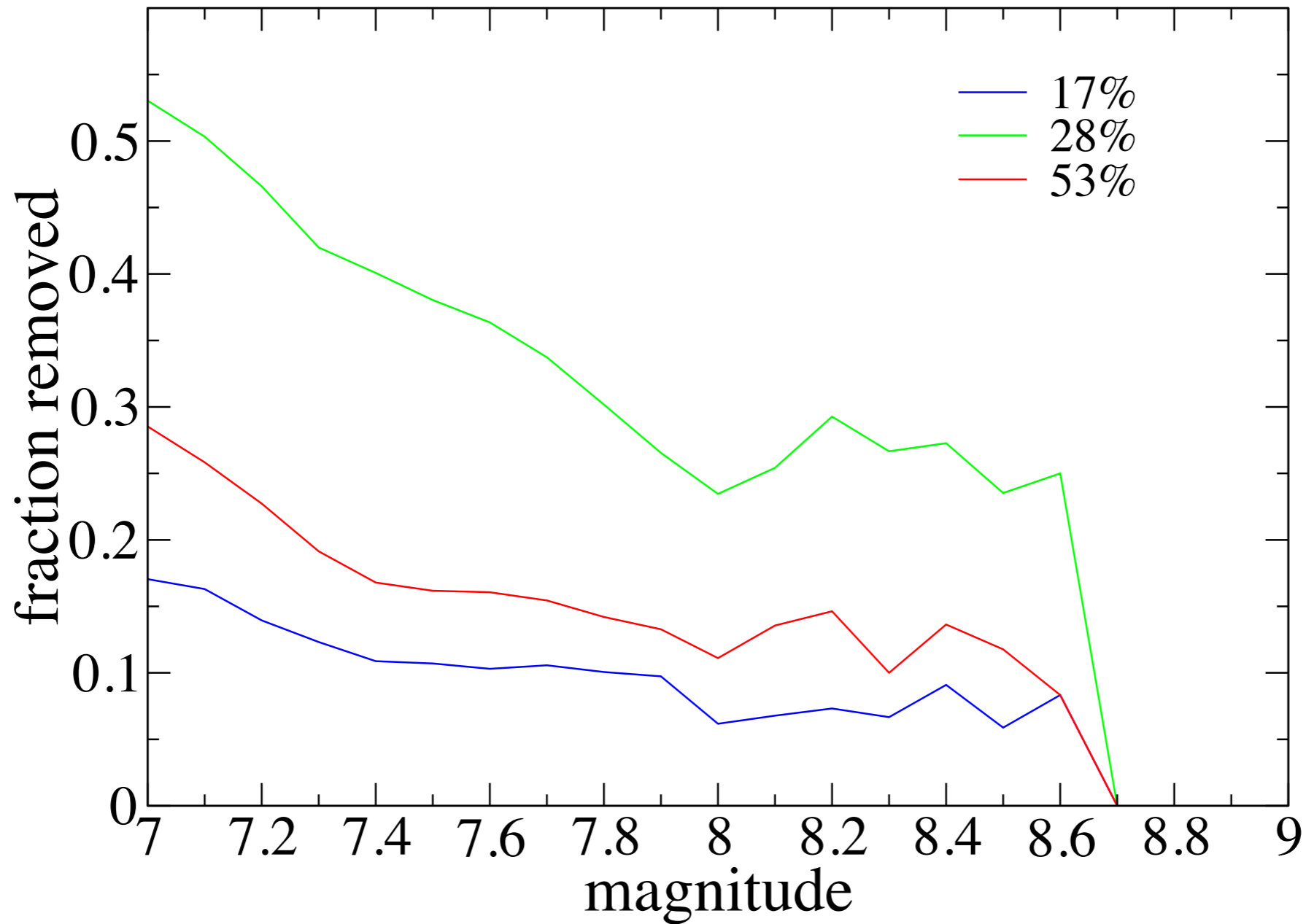
# Aftershock removal



- Use standard procedure (Gardner & Knopoff 74)
- Flag events as aftershocks according to
  - ▶ Time window
  - ▶ Distance window  $\sim$  rupture length of shock
- Incomplete data
- Use empirical rupture length formula (Wells & Coppersmith 94)
- Vary strictness of procedure

Results largely independent of details of  
aftershock removal procedure

# How many aftershocks?



**Use intermediate procedure**



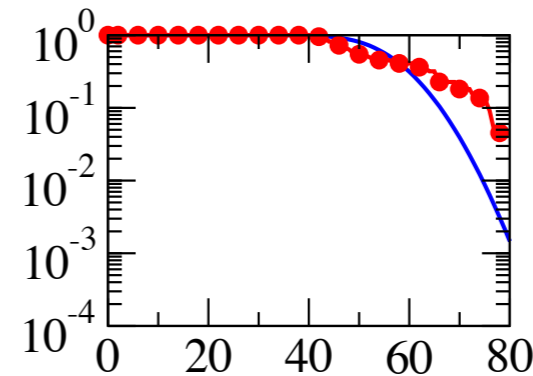
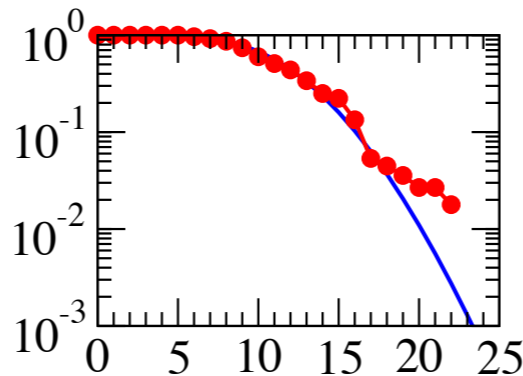
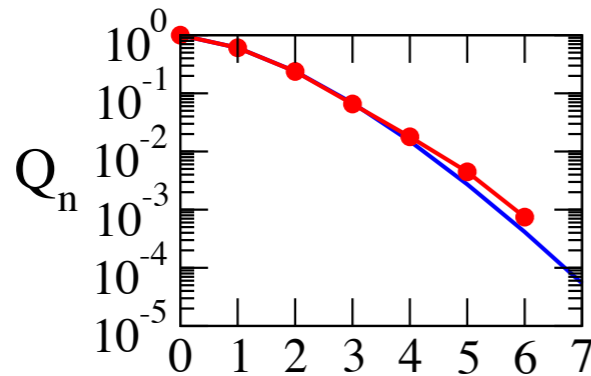
# Aftershocks removed:

## Dependence on threshold & time interval

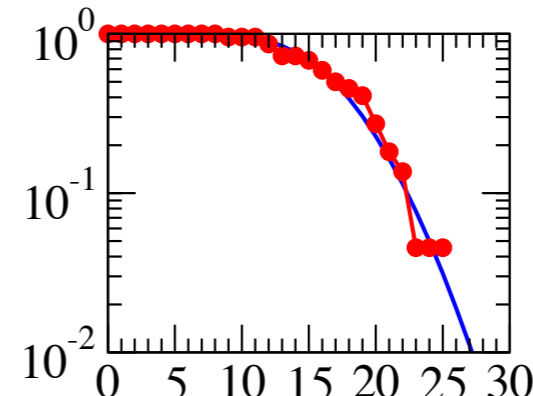
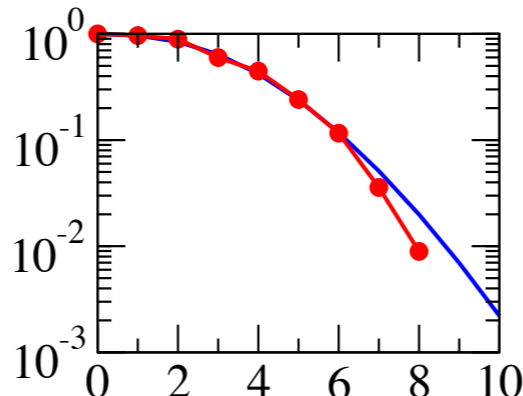
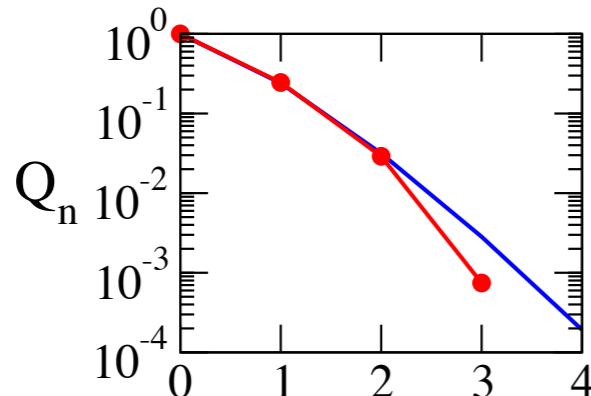
T=1

T=12

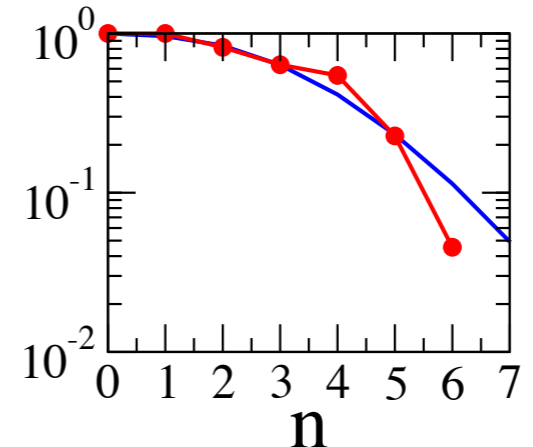
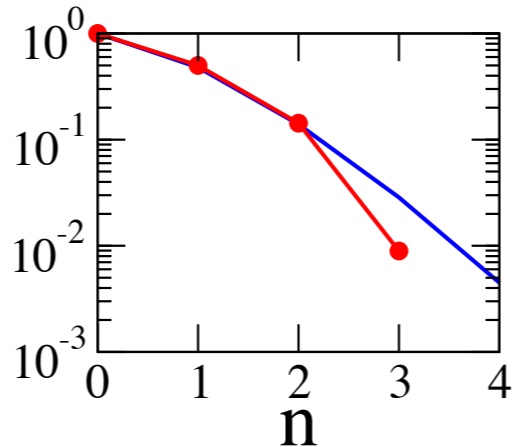
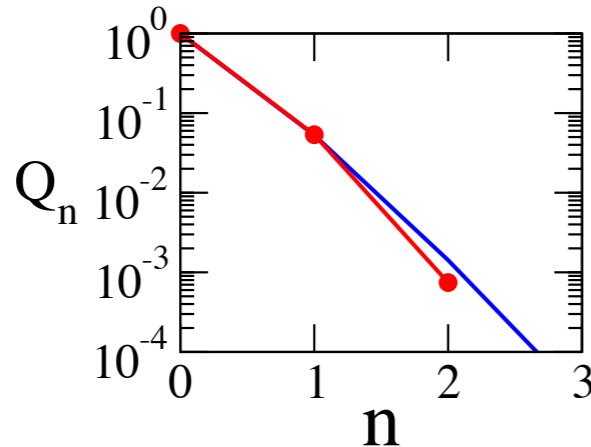
T=60



M=7.0



M=7.5



M=8.0

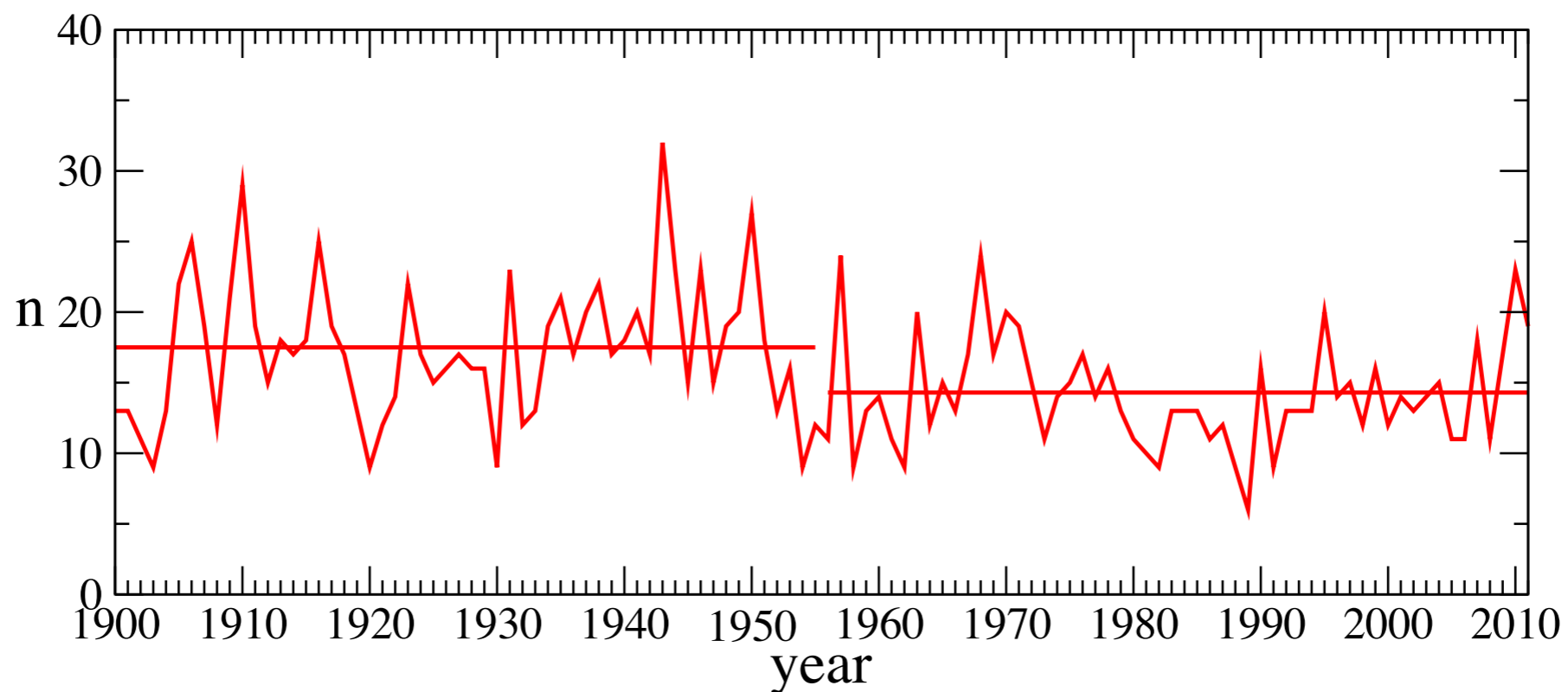
M=7, T=1 is now Poissonian

Overpopulation at M=7, T>12 persists

Underpopulation due to overzealous aftershock removal

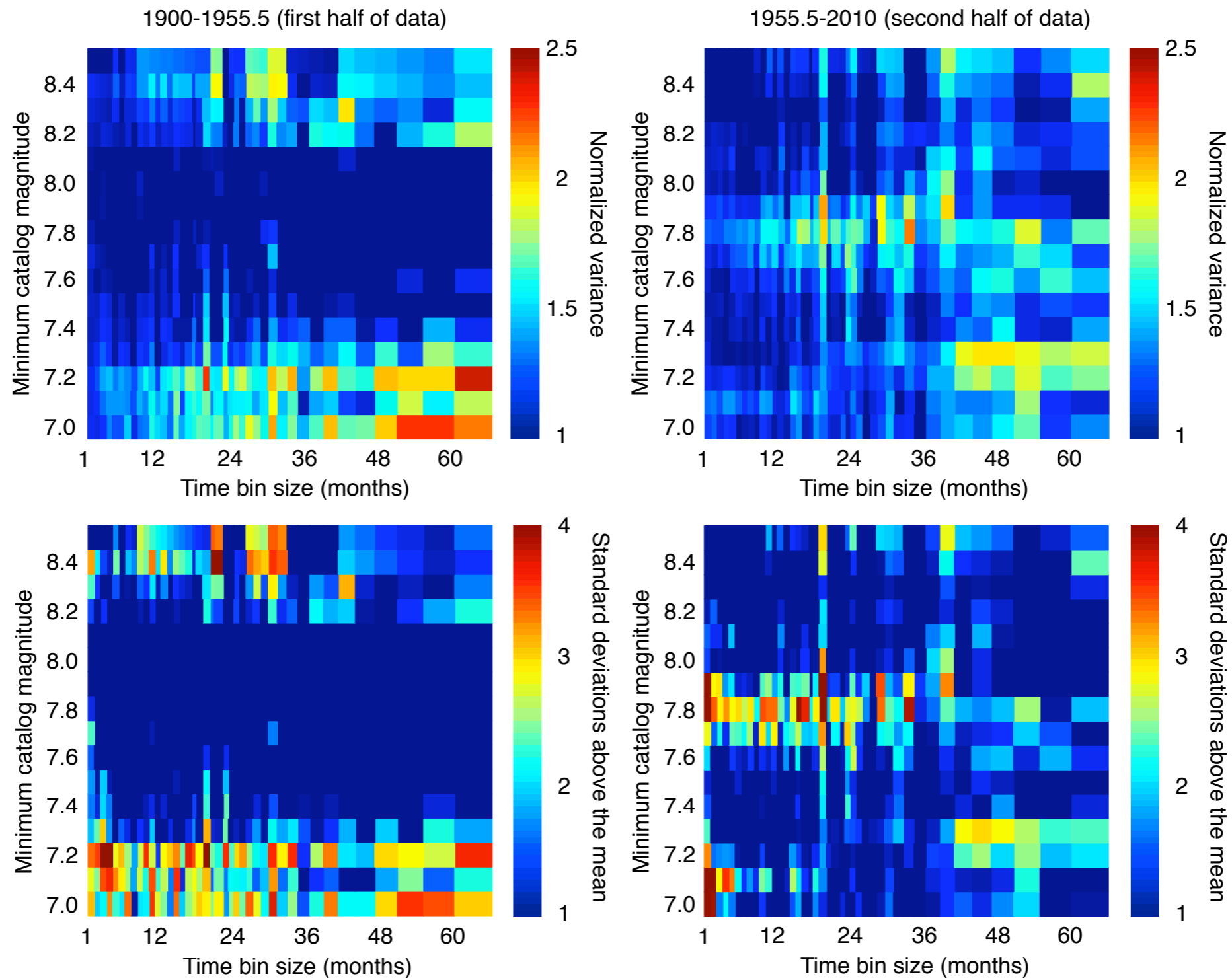
# Comparing first and second halves of century

17.5 events/year (1900-1955) vs 14.3 events/year (1955-2011)



Rate mismatch suggests difference in measurement or different methodology

# Mainshocks and Aftershocks



Separately, each 50 year record is random

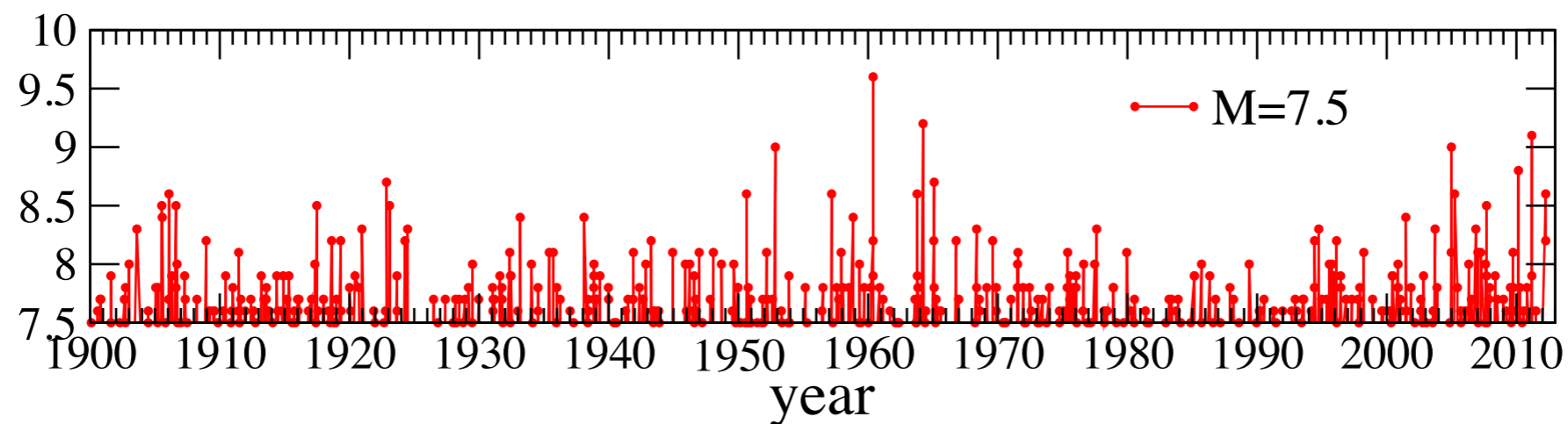
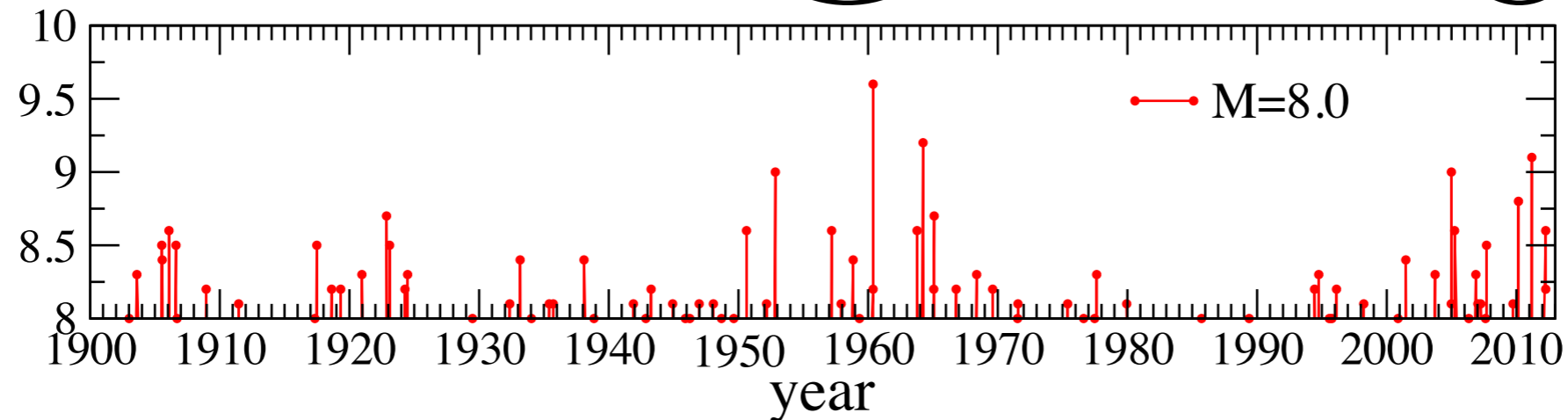
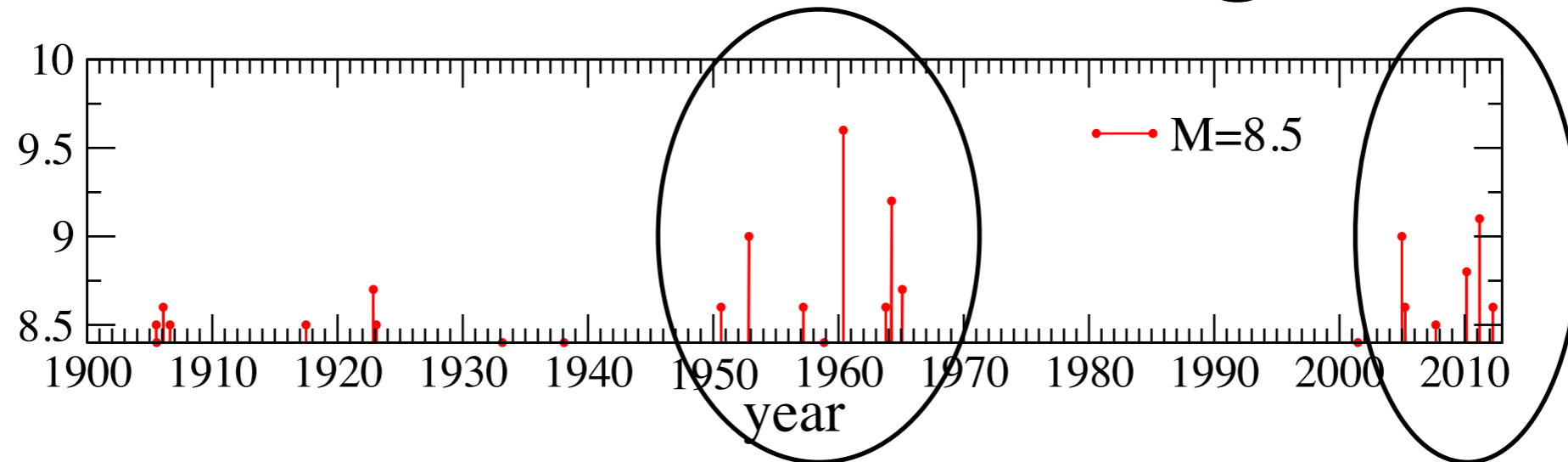
# Summary I

- Number of events in a time interval
- Analysis of probability distribution function
- Megaquakes largely consistent with random statistics
- Aftershock removal not crucial
- Aftershock removal useful at small time intervals
- No significant deviations from random process
- Suggests that large earthquakes are random in time
- Results reinforce several recent studies

Michaels I I  
Shearer & Stark I I

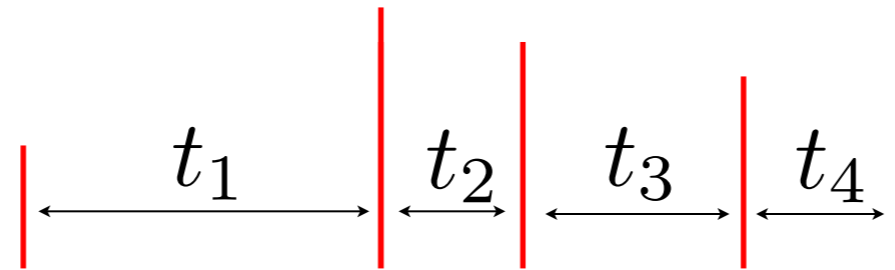
**Part II:**  
**Statistics of the time  
interval between events**

# A second look at the largest events



Focus on even larger magnitudes

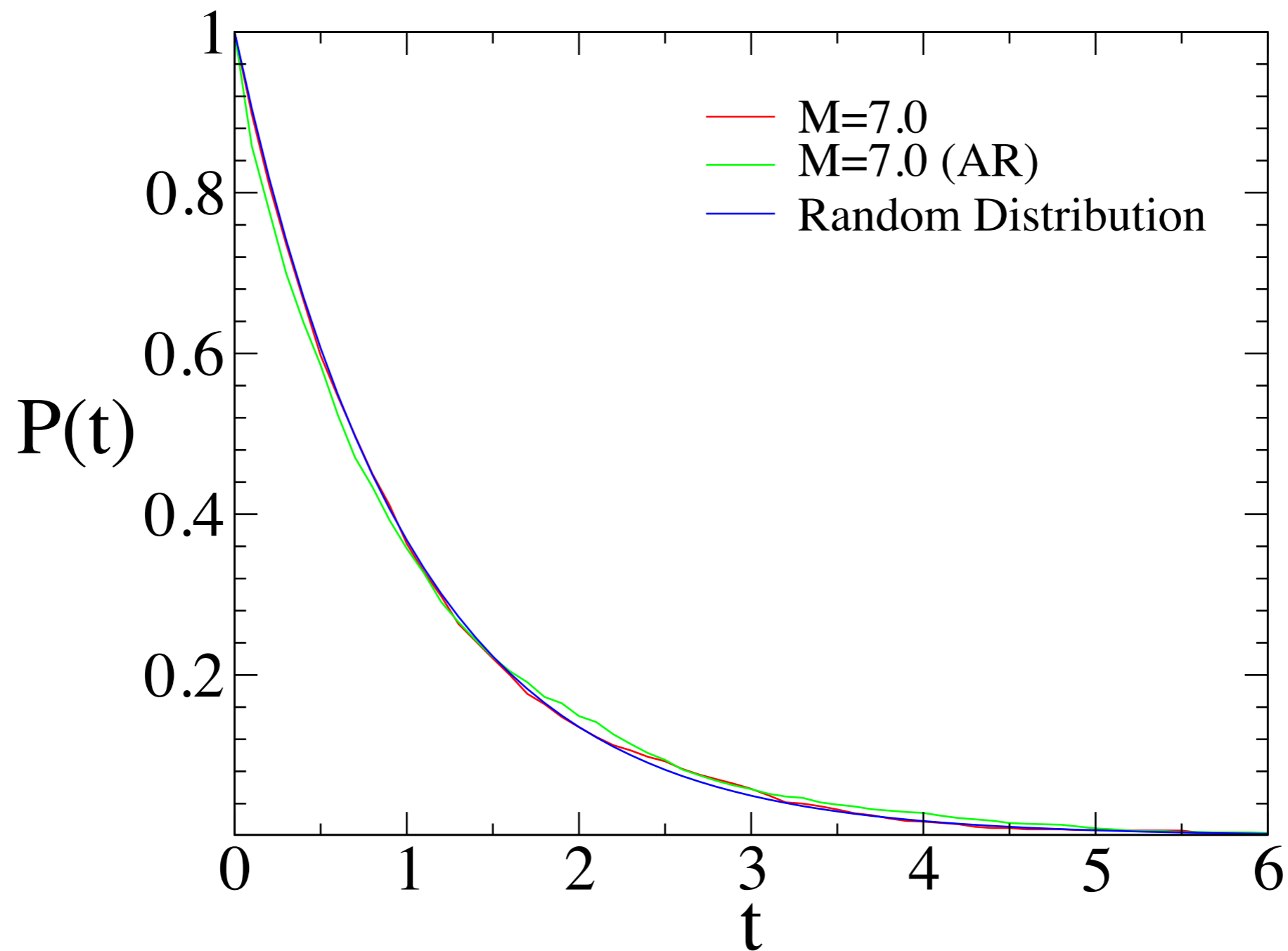
# Recurrence time statistics



- Measure time between two successive events
- Heavily used in earthquake analysis
- Random Distribution: both distribution of recurrence times, and cumulative distribution are exponential

$$p(t) = \tau^{-1} e^{-t/\tau} \quad P(t) = \int_t^{\infty} ds P(s) = e^{-t/\tau}$$

# Recurrence time statistics



Very good agreement with random distribution!

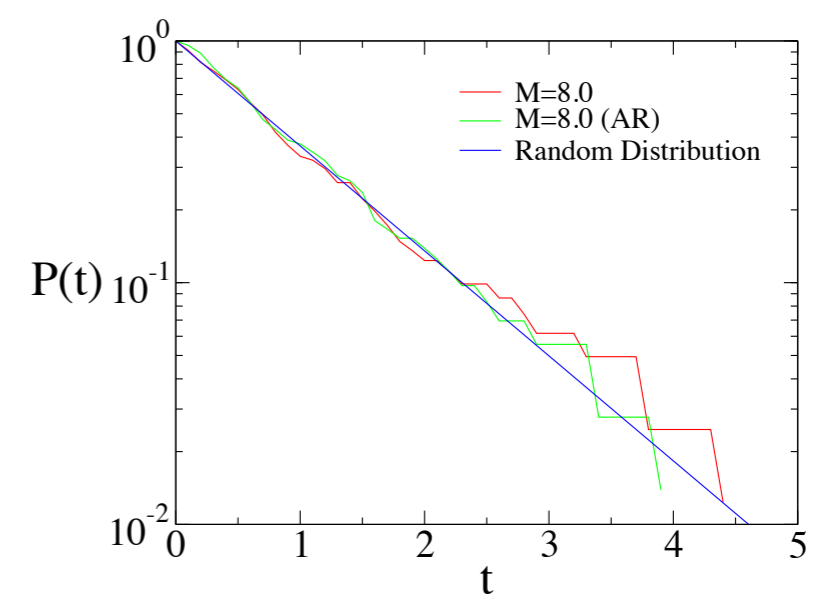
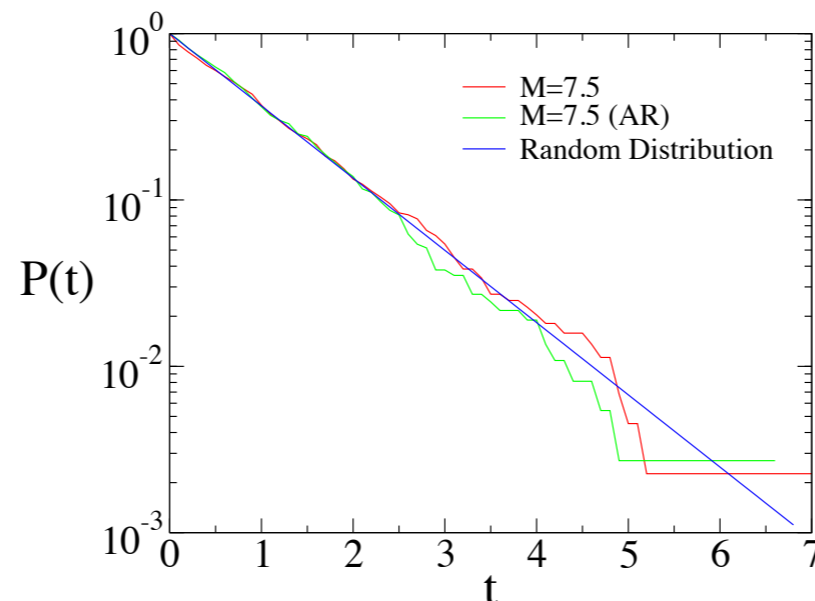
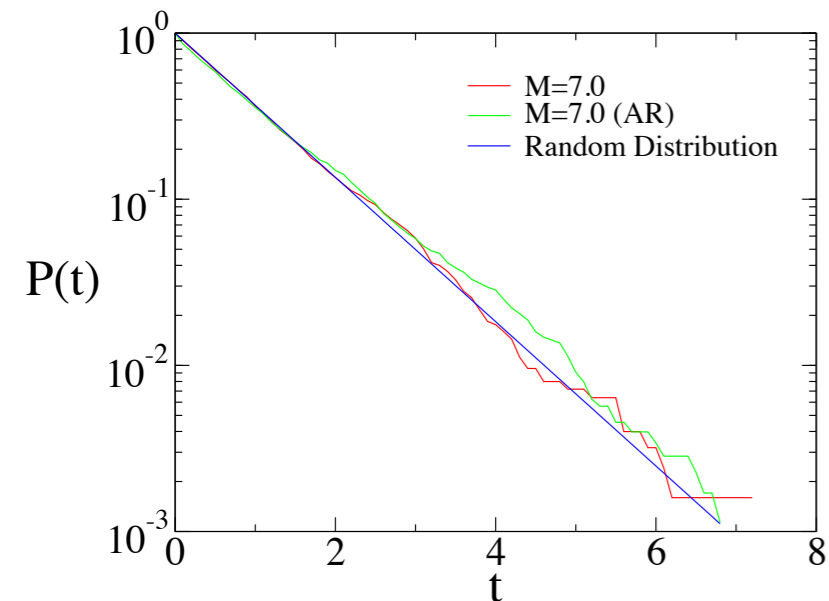


# Extreme Statistics

$\langle t \rangle = 0.76$  months

$\langle t \rangle = 3.03$  months

$\langle t \rangle = 16.4$  months



- Quantify statistical significance?

## Variance

- Again, the normalized variance equals 1!

$$V = \langle t^2 \rangle - \langle t \rangle^2 = \langle t \rangle = 1$$

M	v	v
7	1.55	1.03
7.5	1.07	0.89
8	1	0.84

Overzealous AR?

# Normalized variance

- Scalar quantity

$$V = \frac{\langle t^2 \rangle - \langle t \rangle^2}{\langle t \rangle^2}$$

- Simplest measure of fluctuations

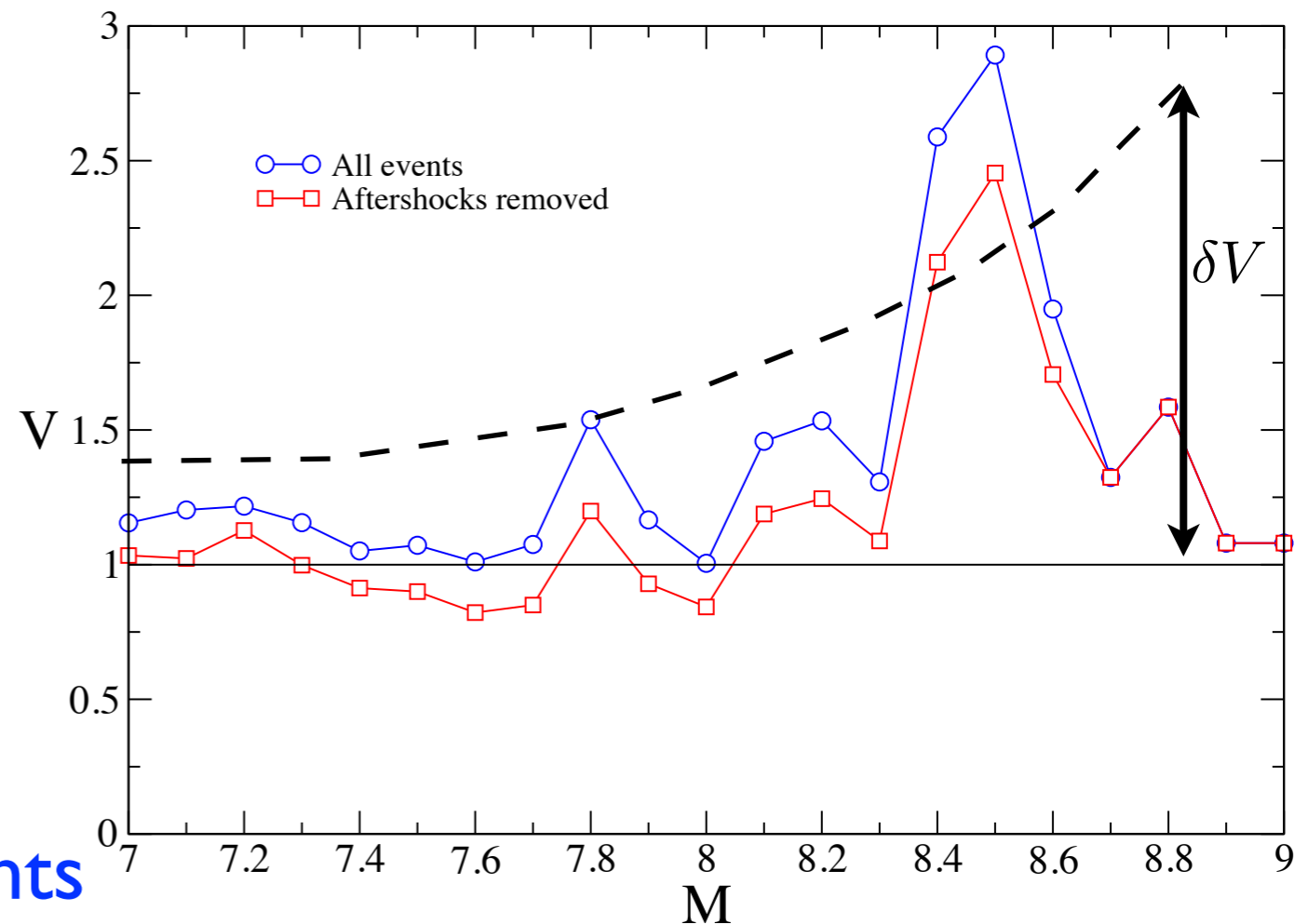
Random events	$V \approx 1$
Correlated events	$V \gg 1$

- Dependence on number of events

$$\langle V^2 \rangle - \langle V \rangle^2 = \frac{2(N-1)(4N-3)}{N^3}$$

- Must take into account variability “envelope”

$$\delta V \sim N^{-1/2}$$



**Large variance for  $M \sim 8.5$   
is it statistically significant?**

# Statistics of the Variance

- Consider  $N$  independent identically distributed variables, drawn from the probability distribution  $P(t)$
- Measure the variance from the dataset  $\{t_1, t_2, \dots, t_N\}$

$$V = \frac{t_1^2 + t_2^2 + \dots + t_N^2}{N} - \left( \frac{t_1 + t_2 + \dots + t_N}{N} \right)^2$$

- Moments of the variance given by **cumulants** of the distribution

$$\langle V \rangle = \frac{N-1}{N} \kappa_2 \quad \langle V^2 \rangle - \langle V \rangle^2 = \frac{(N-1) [(N-1)\kappa_4 + 2N\kappa_2^2]}{N^3}$$

$$\kappa_2 = M_2 - M_1^2 \quad \kappa_4 = M_4 - 4M_3M_1 - 3M_2^2 + 12M_2M_1^2 - 6M_1^4$$

**Variance of the variance  
accounts for small number of events**

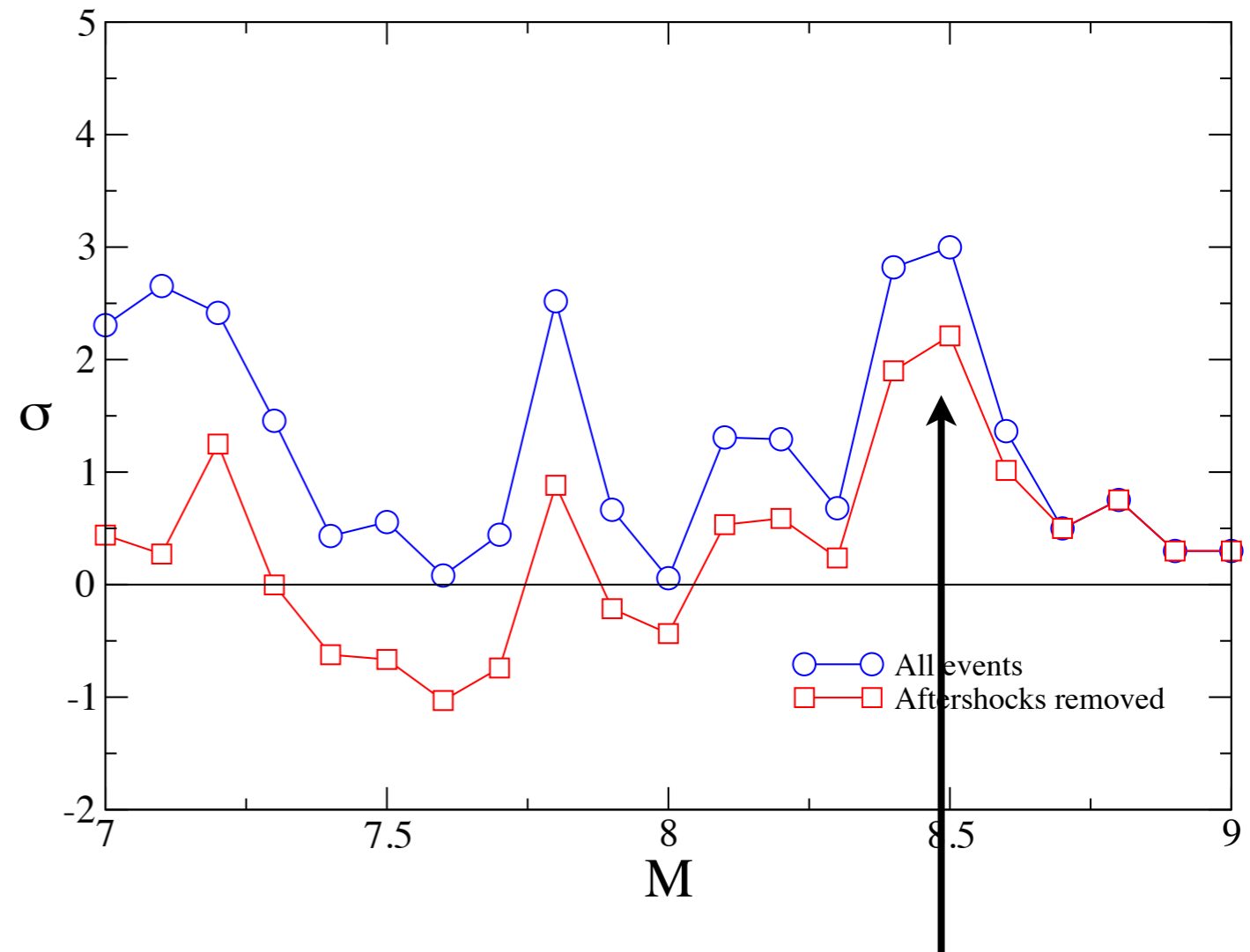
# Number of standard deviations

- Scalar quantity

$$\sigma = \frac{V - \bar{V}}{\delta V}$$

- Roughly normal distribution
- Bell curve gives probabilities

1	2	3	4
0.31	4.55E-02	2.7E-03	6.33E-05



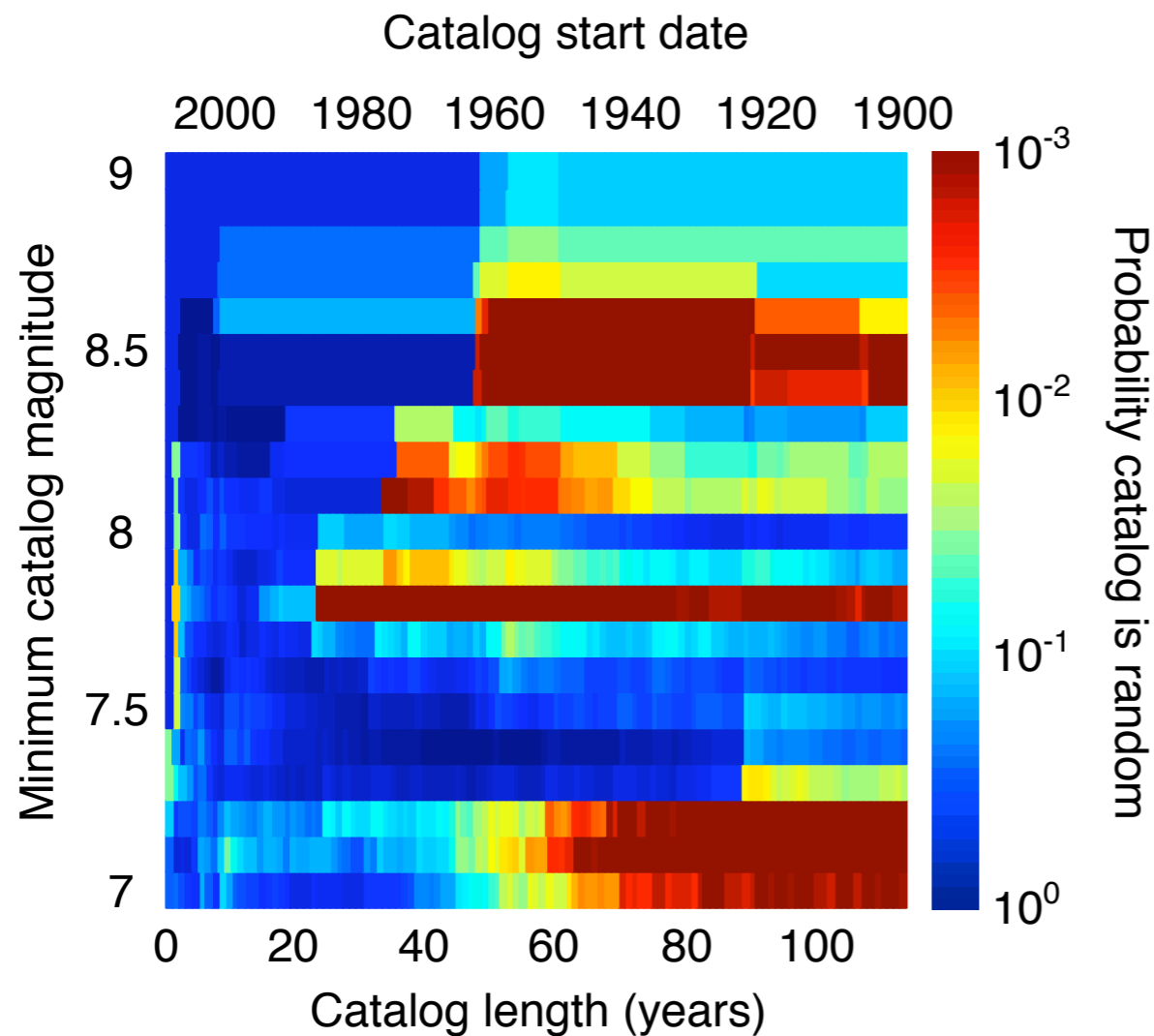
- To account for deviations from Gaussian distribution, use synthetic catalogs adhering to random statistics

large variance for  $M \sim 8.5$  is statistically significant!

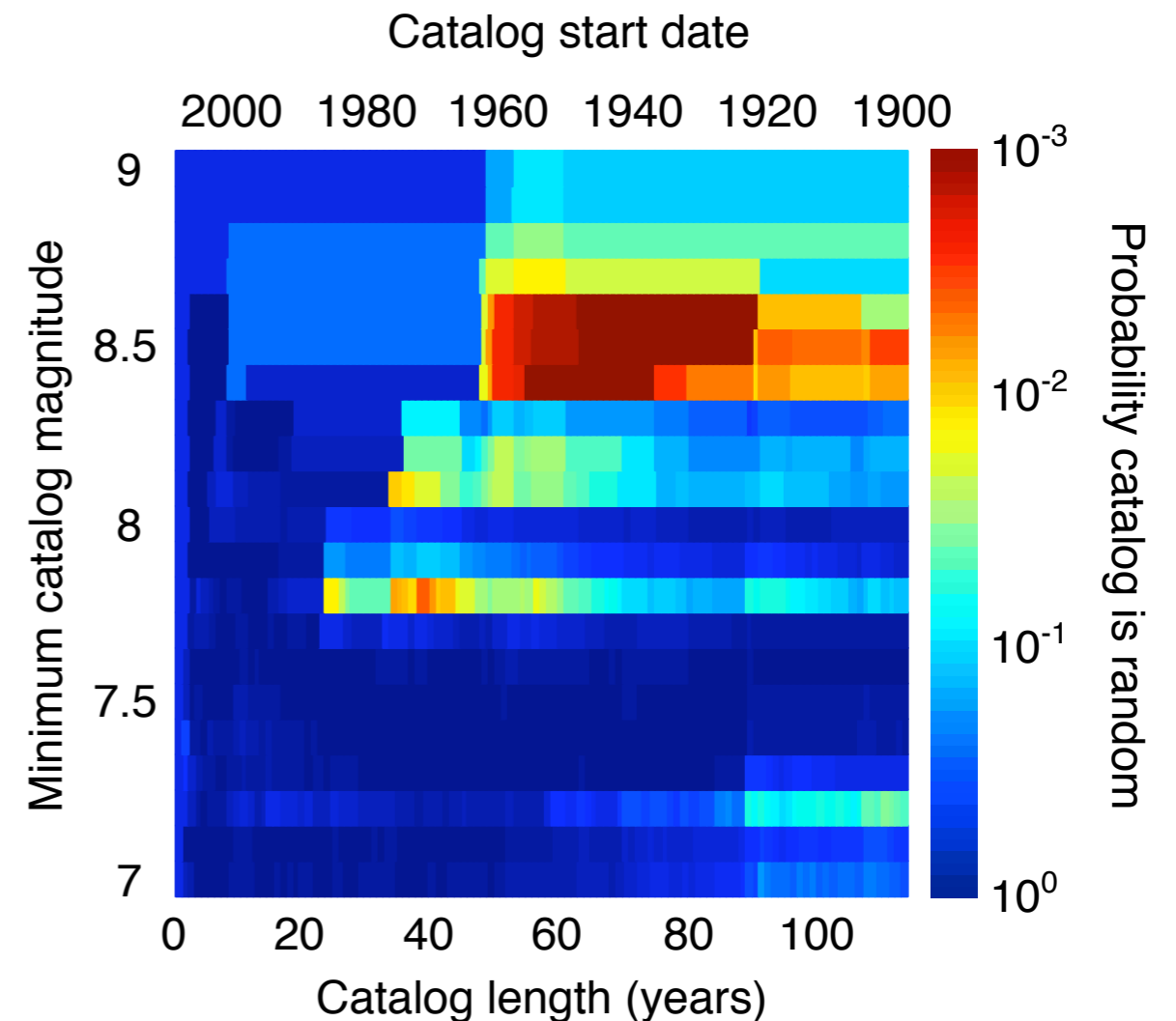
Statistically significant deviation from Poisson statistics

# Random process probabilities

All events



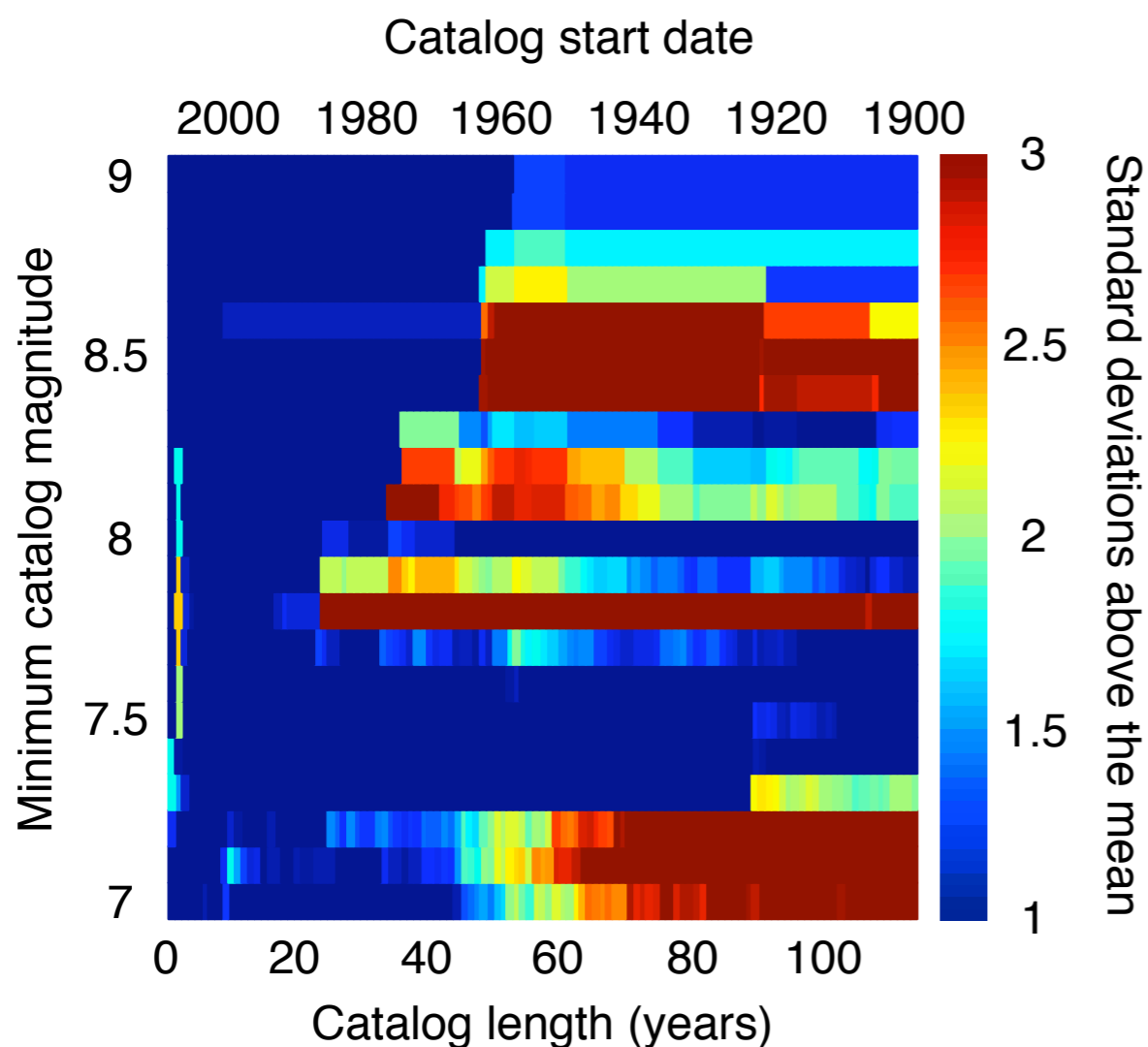
Aftershocks removed



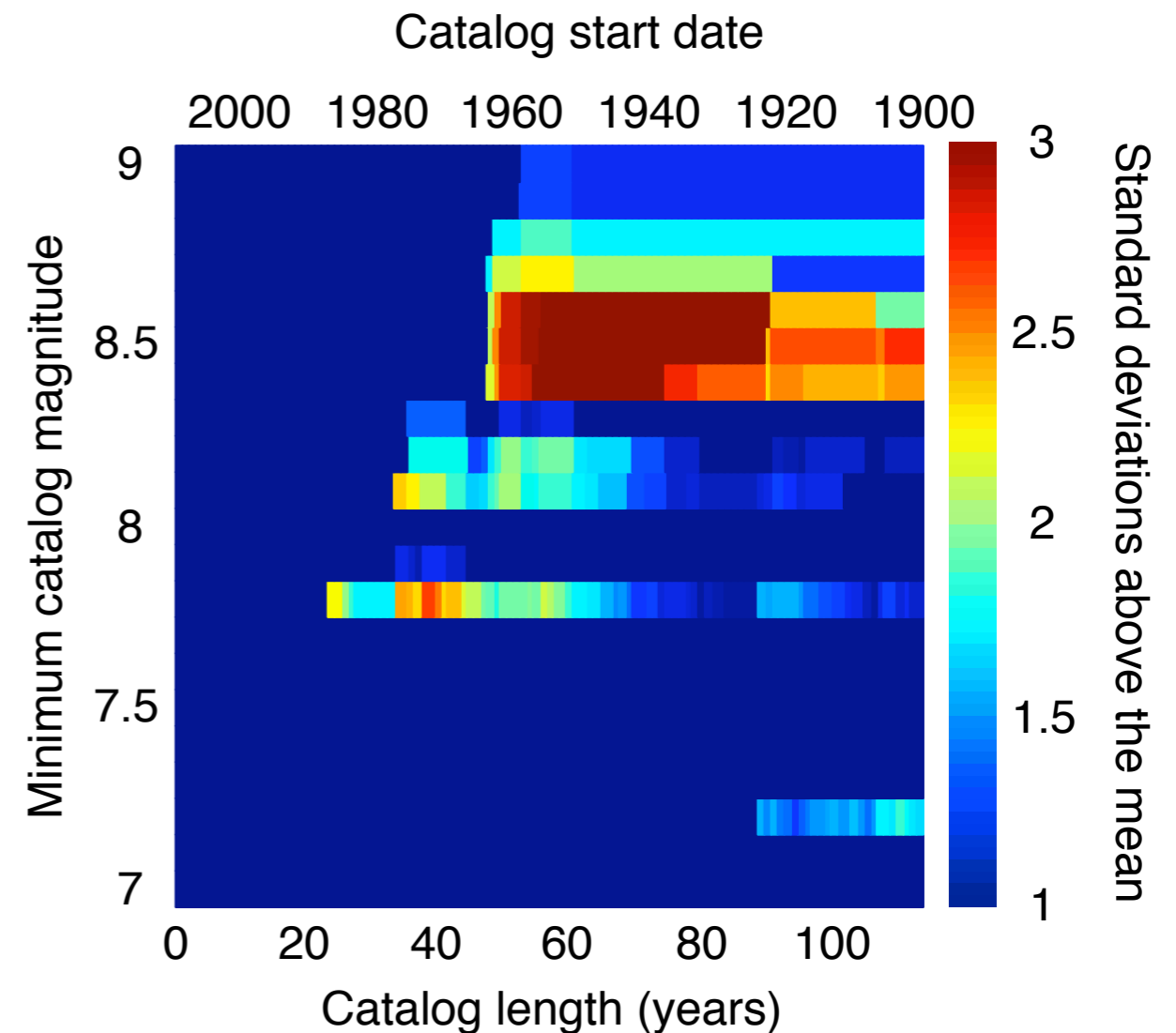
**M=8.4-8.6, 1950-2012, with/without aftershocks  
evidence for deviation from random behavior**

# Number of standard deviations

## All events

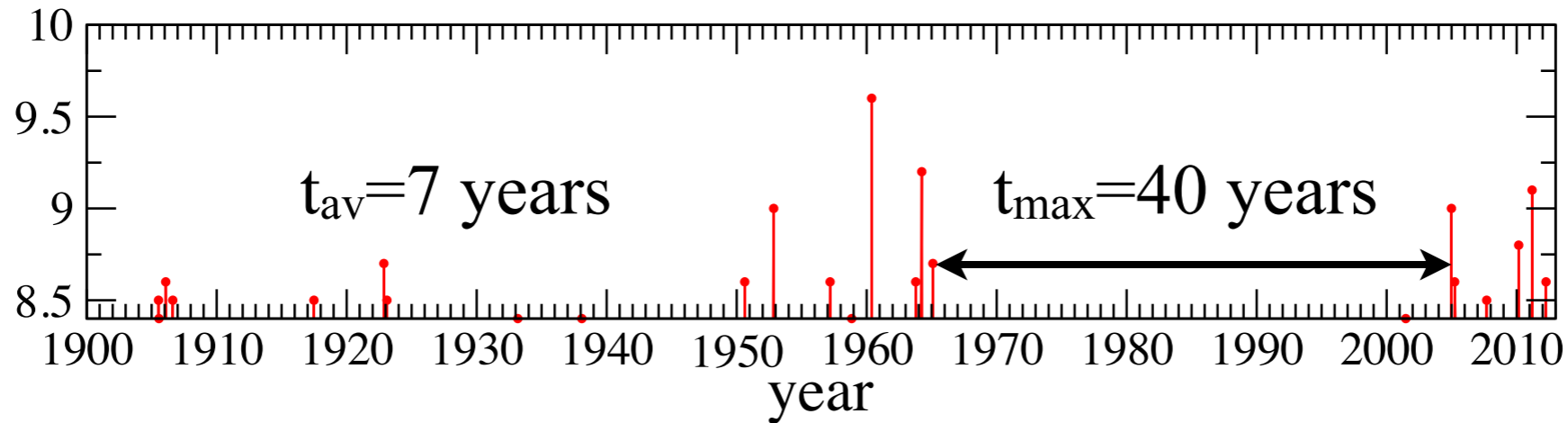


## Aftershocks removed



**M=8.4-8.6, 1950-2012, with/without aftershocks  
evidence for deviation from random behavior**

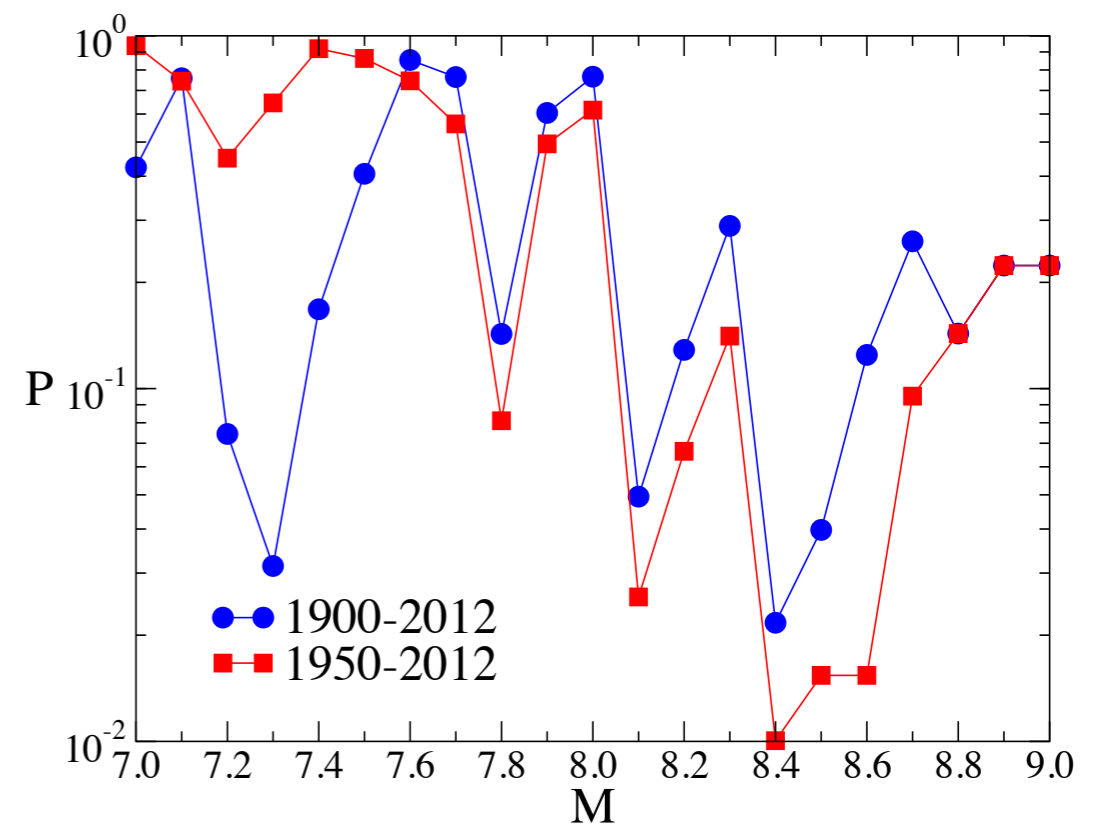
# Maximal recurrence time



- Is the largest gap between events anomalously large?
- Probability of maximal gap for uncorrelated events

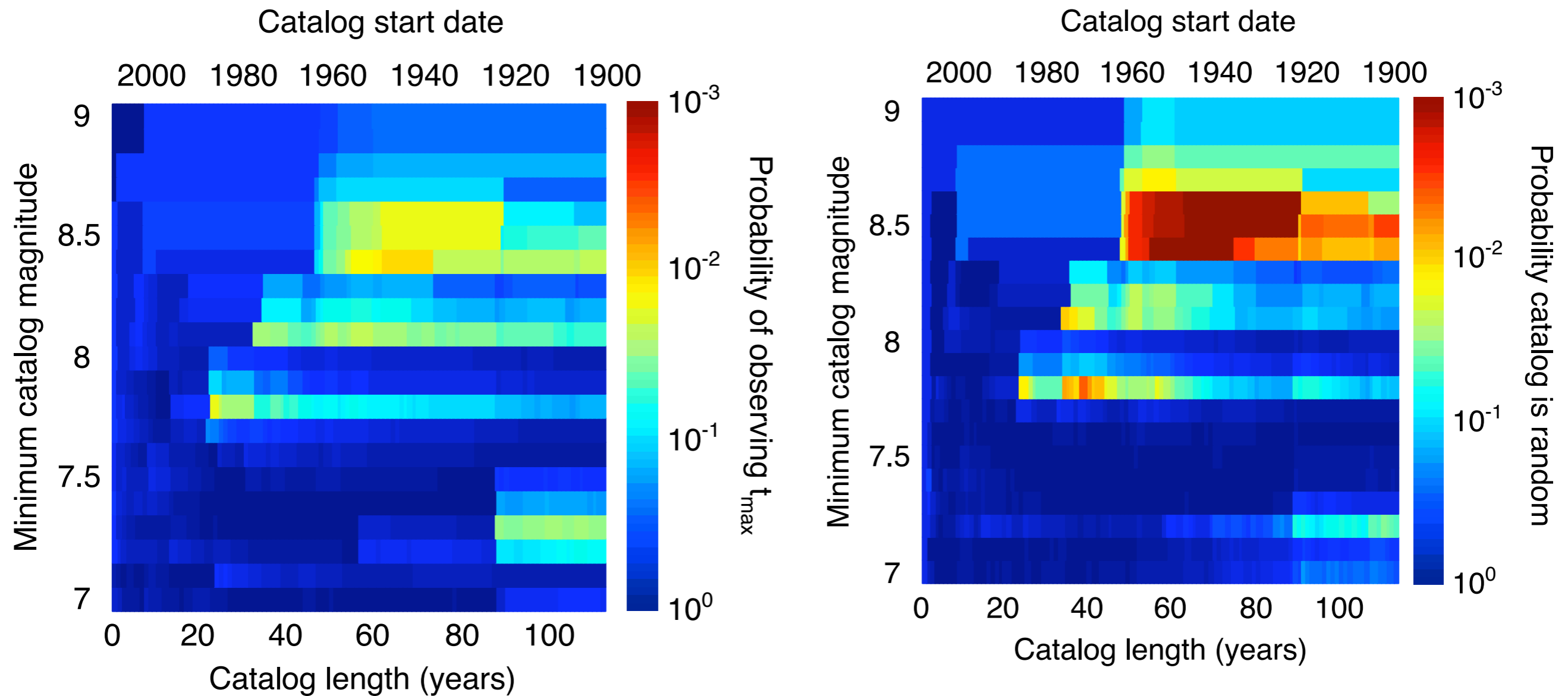
$$P_{max} = 1 - \left(1 - e^{-t_{max}/t_{av}}\right)^N$$

- Ingredients: number of events, average time, maximal time



large gap for  $M \sim 8.5$   
is anomalously large!

# Largest gap vs. variance



Probabilities for maximal gap & variance consistent

Largest recurrence times responsible for anomalous variance!



# Summary II

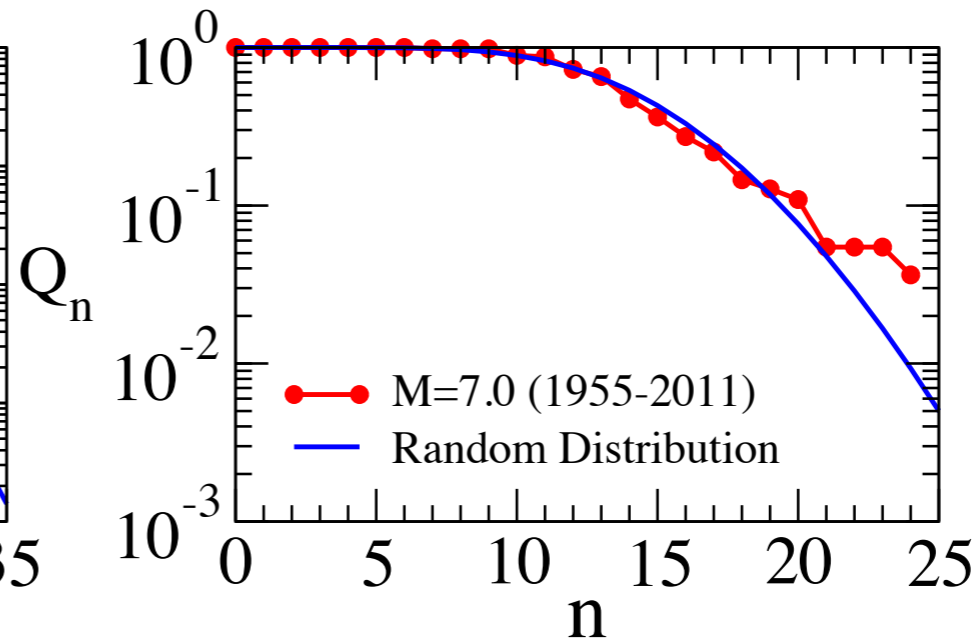
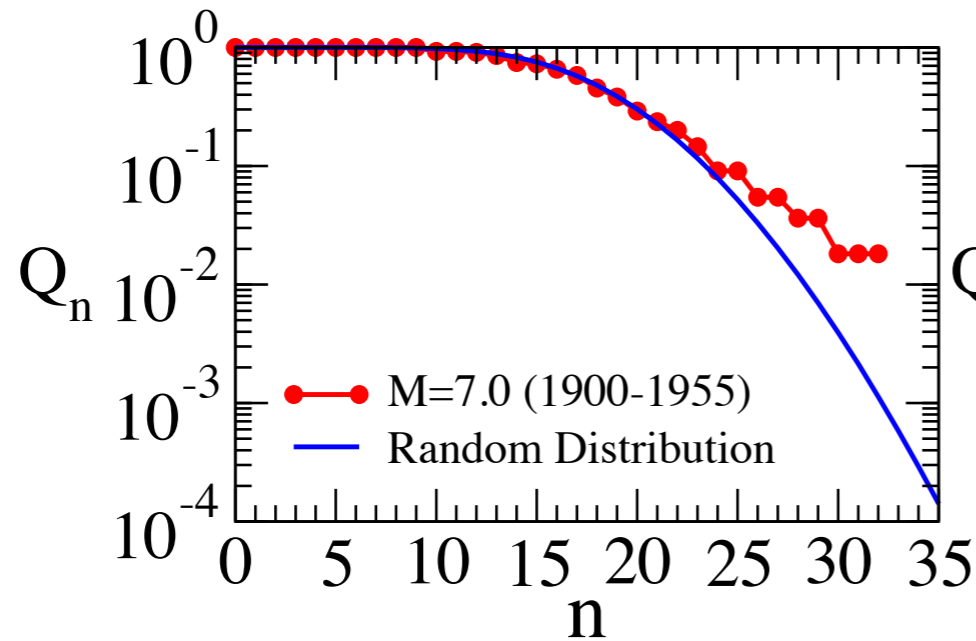
- Recurrence time: transparent & convenient measure
- Statistics of the variance: basic measure of fluctuations
- Largely consistent with a random process
- Anomalies found for most massive events ( $M > 8.5$ )
- Anomalously large quiescent periods responsible for anomalously large variance
- Reinforce recent results Bufe & Perkins 05, 11
- Can be used on smaller magnitude data
- Can be used on local data

# Robustness

1900-1955

vs

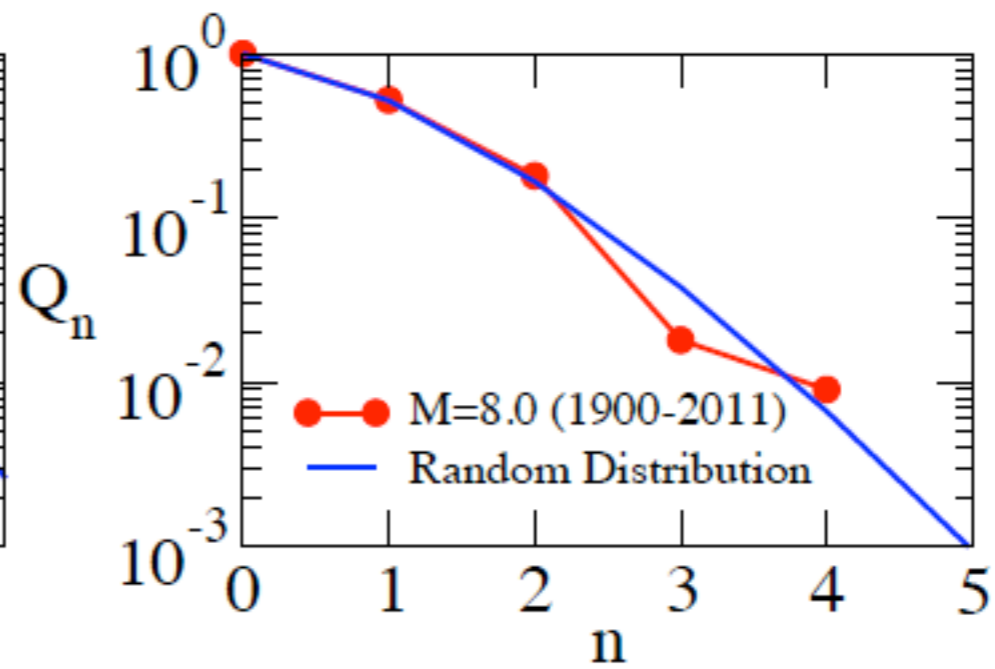
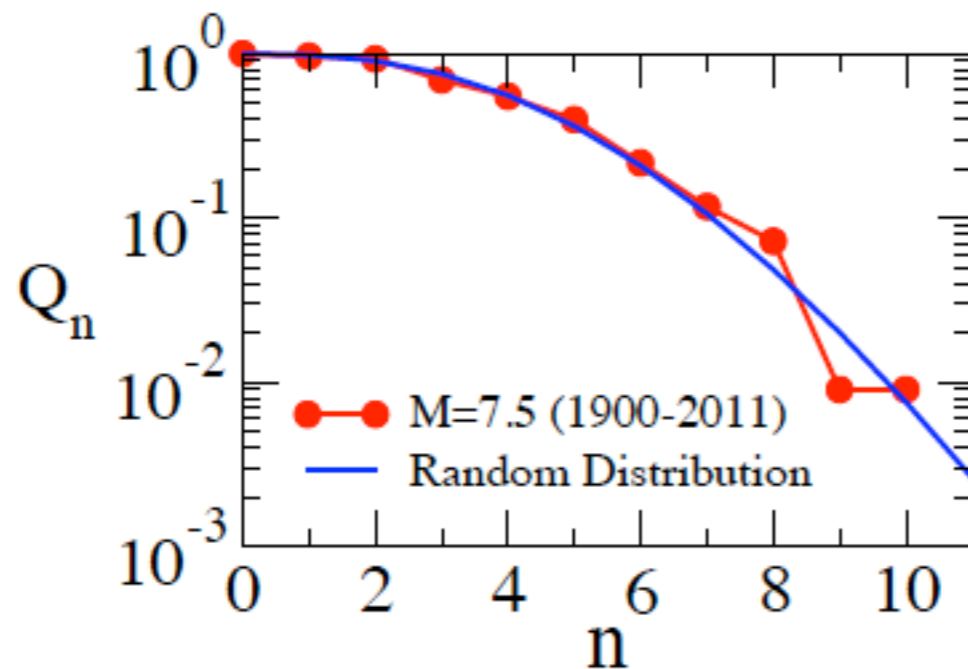
1955-2011



$M=7.5$

and

$M=8.0$



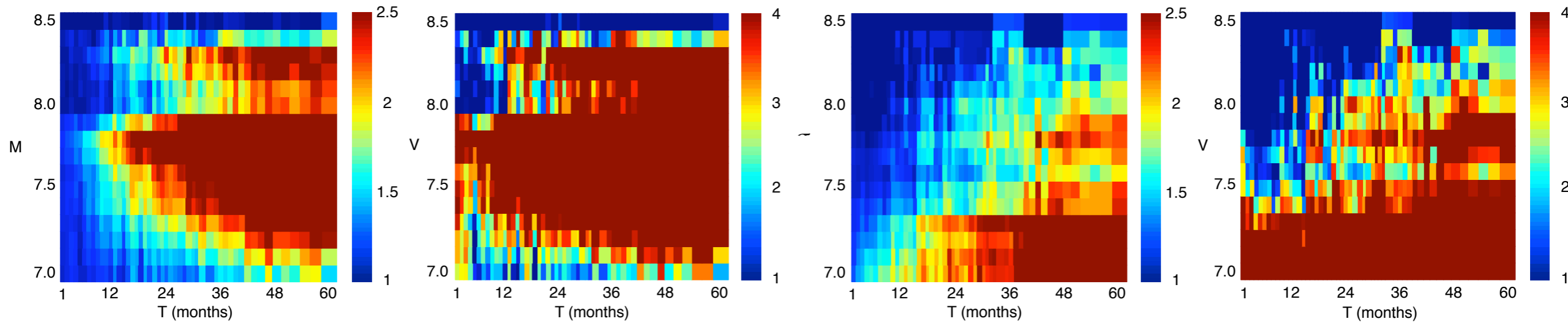
Overpopulation robust for  $M=7.0$ , weak for  $M=7.5, 8.0$

# Different Catalogs

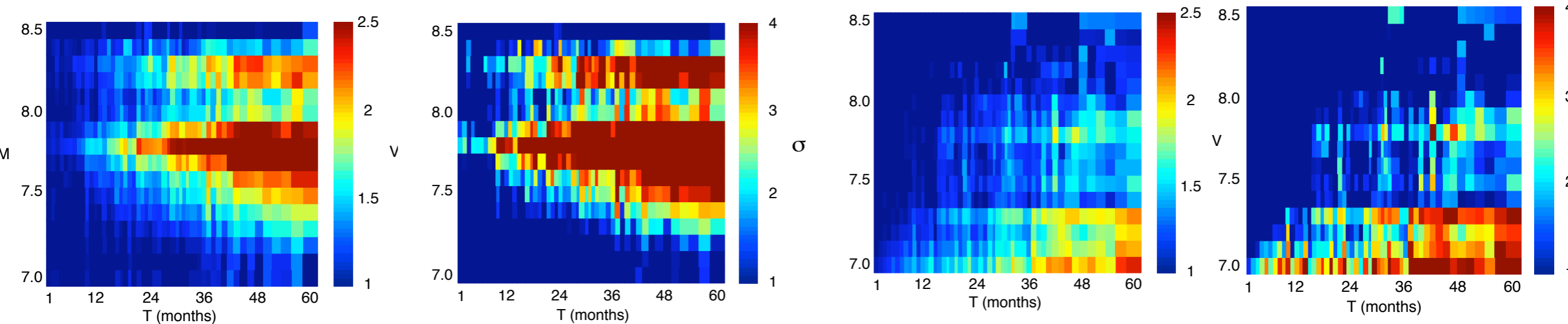
NOAA (1100 events)

Pacheco-Sykes (900 events)

## Mainshocks & Aftershocks



## Mainshocks only



Strong deviation

Moderate deviation

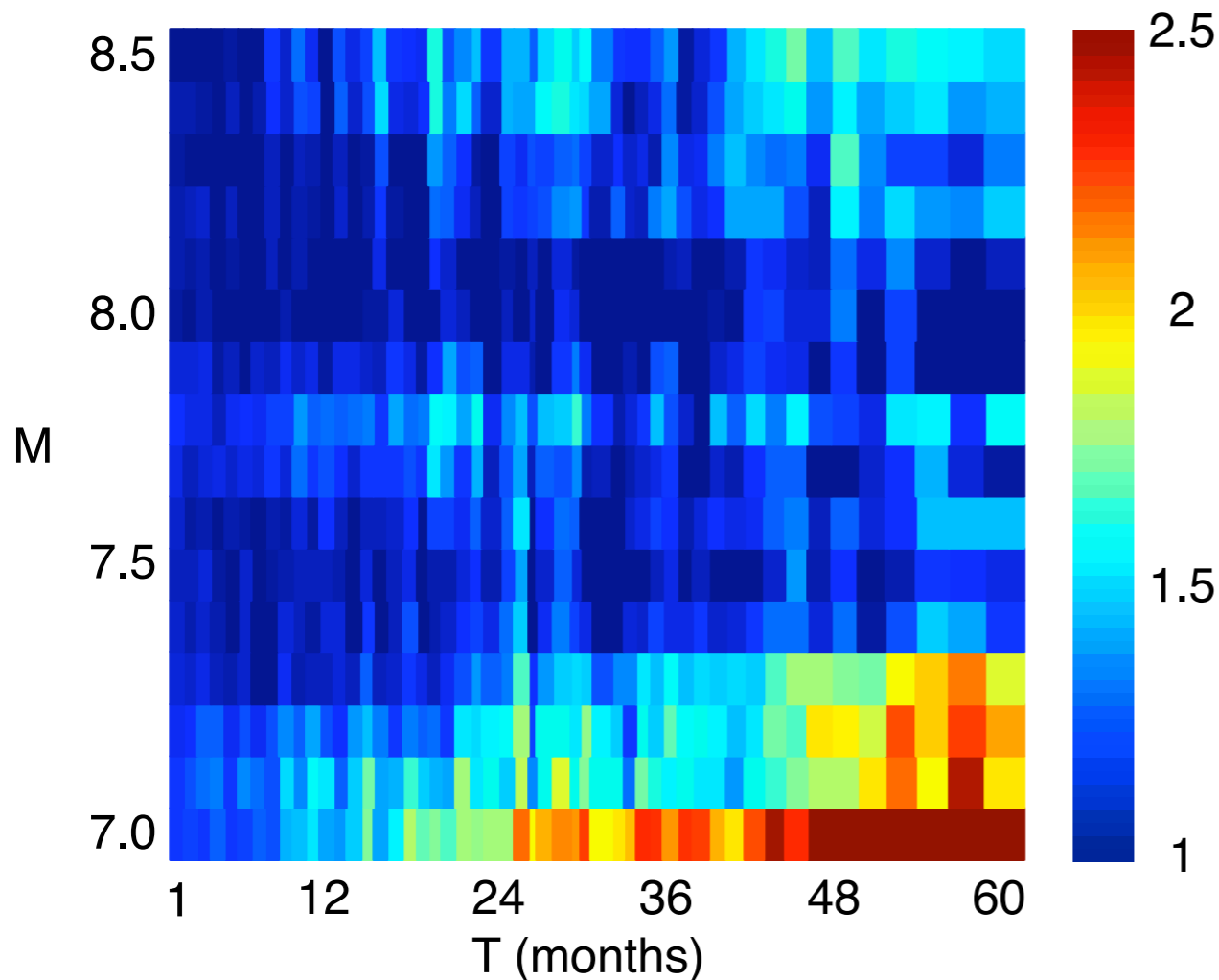
# Questions

- Is the evidence for clustering statistically significant?
- How do we answer this question?
  - ➔ Compare with Random Catalogs
- Is data sufficient? complete? consistent?
  - ➔ Generate Synthetic Catalogs
- Role of aftershocks?
  - ➔ Remove Aftershock (“decluster”)

# Normalized Variance

$$V = \frac{\langle n^2 \rangle - \langle n \rangle^2}{\langle n \rangle}$$

Random Distribution  $V \approx 1$   
Overpopulated Tail  $V \gg 1$



Red= Overpopulated Tail

Blue= Random Distribution?

Overpopulation for  $M < 7.3, T > 24$

Is this overpopulation Statistically Significant?

# Synthetic Catalogs

- Generate huge number ( $10^6$ ) of synthetic catalogs
- Catalogs match number of events (399 7.0, 375 7.1, 294 7.2,...)
- Measure the expected variance (very close to 1) and the variance of the variance

$$V \approx 1 \pm \delta V$$

- Represent the observed variance using # of standard deviations

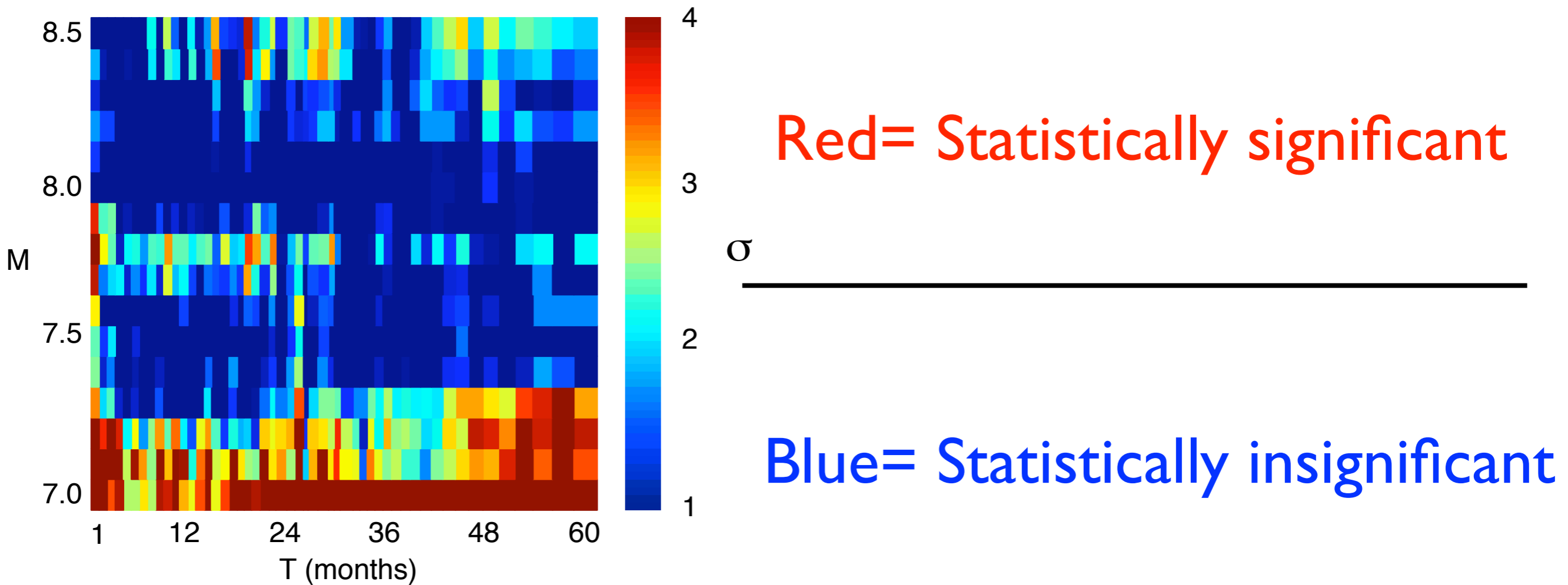
$$\sigma = \frac{V - \bar{V}}{\delta V}$$

- Use Gaussian distribution (Bell curve) to assess statistical significance

1	2	3	4
0.31	4.55E-02	2.7E-03	6.33E-05

# Synthetic Catalogs

$$\sigma = \frac{V - \bar{V}}{\delta V}$$



Overpopulation significant only for  $M < 7.3$ , regardless of  $T$

Why is  $T < 24$  statistically significant?

# Variation with Time window

- Larger time intervals give less independent measurements

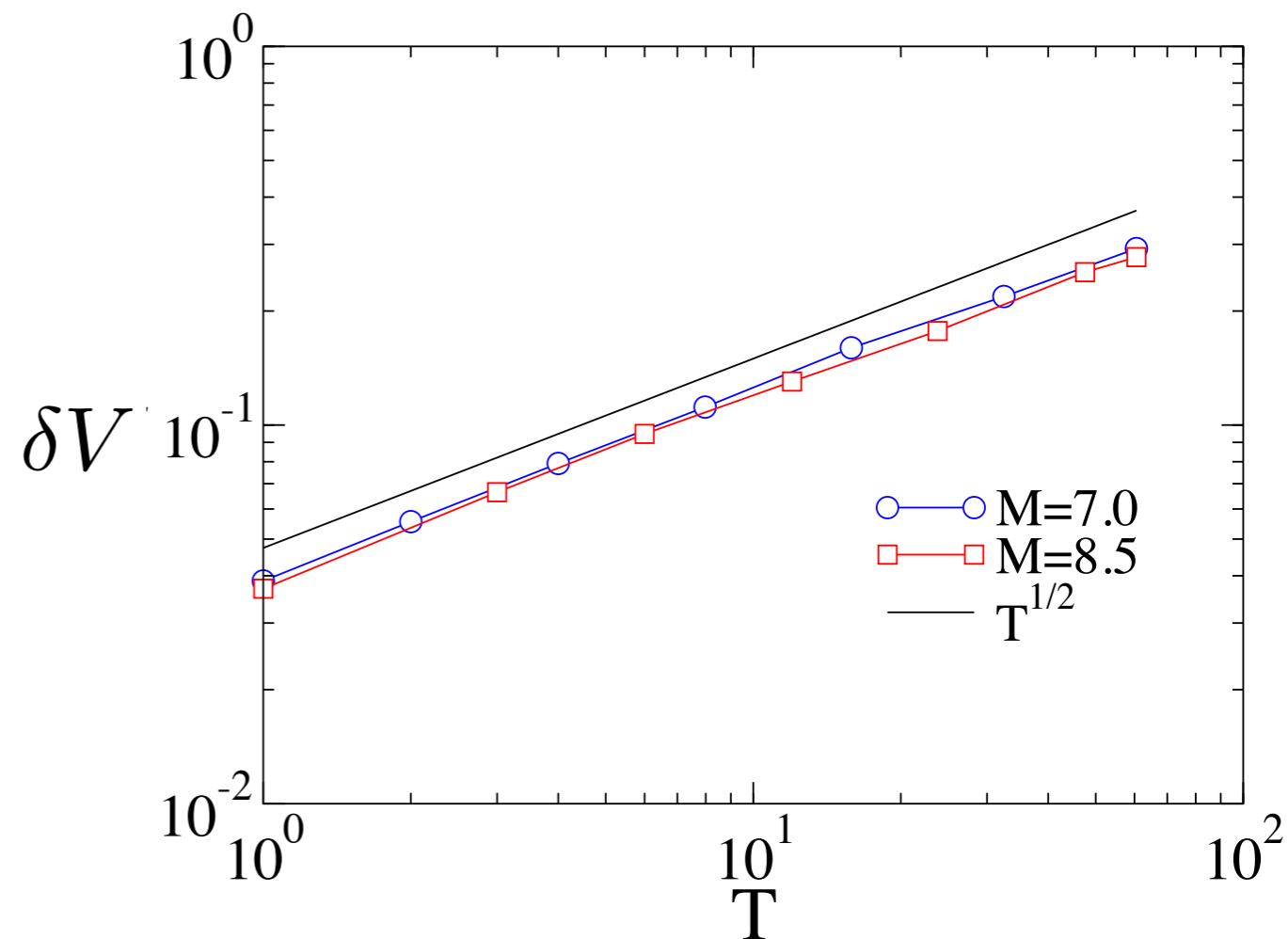
$$N = \frac{\text{Number of years} \times 12}{T}$$

- Fewer independent measurements give larger variation

$$\delta V \sim \frac{1}{\sqrt{N}} \sim \sqrt{T}$$

- Variation in variance is universal!

Small T analysis credible  
Large T analysis questionable

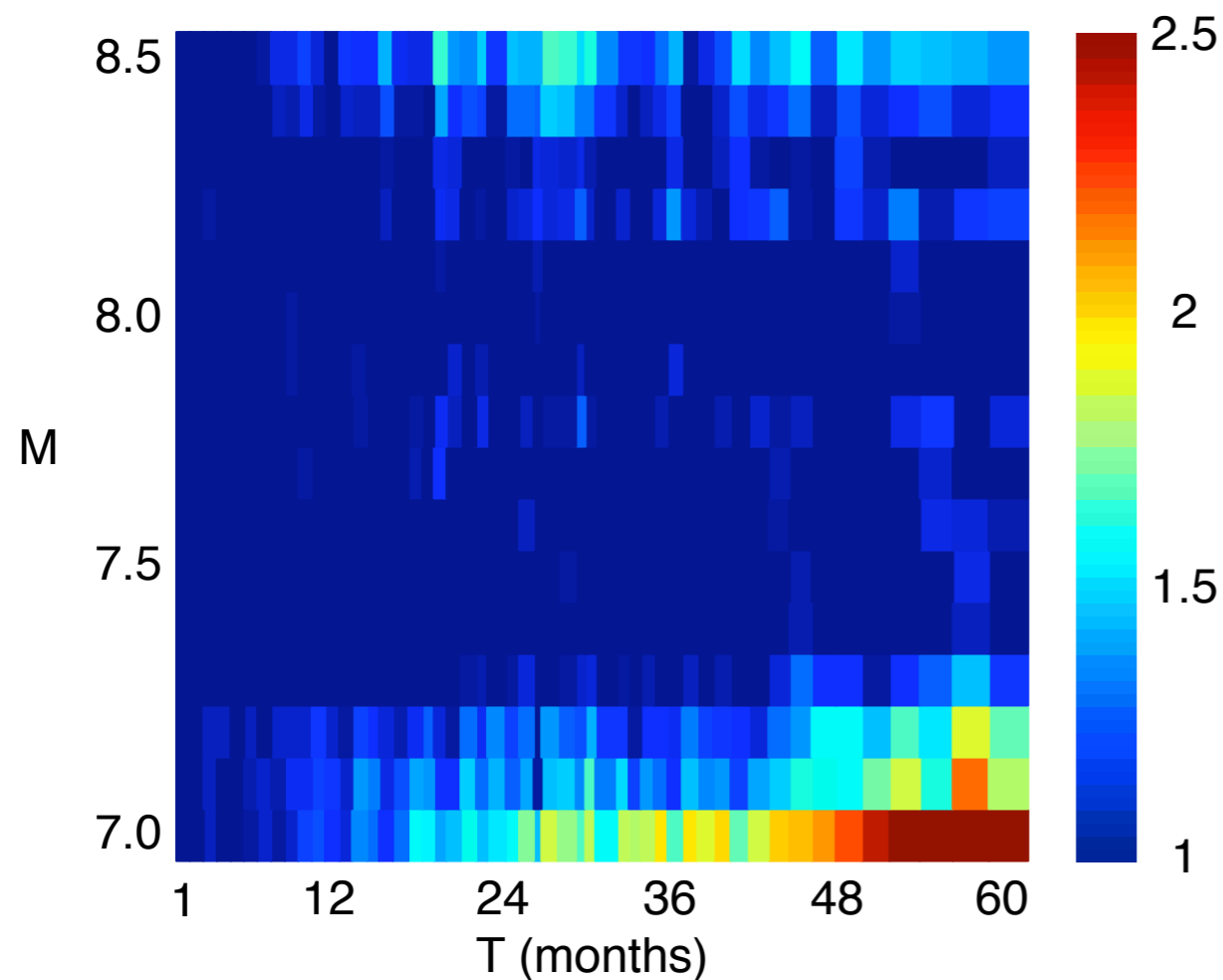




# Normalized variance: Aftershocks Removed

$$V = \frac{\langle n^2 \rangle - \langle n \rangle^2}{\langle n \rangle}$$

Random Distribution  $V \approx 1$   
Overpopulated Tail  $V \gg 1$



Red= Overpopulated Tail

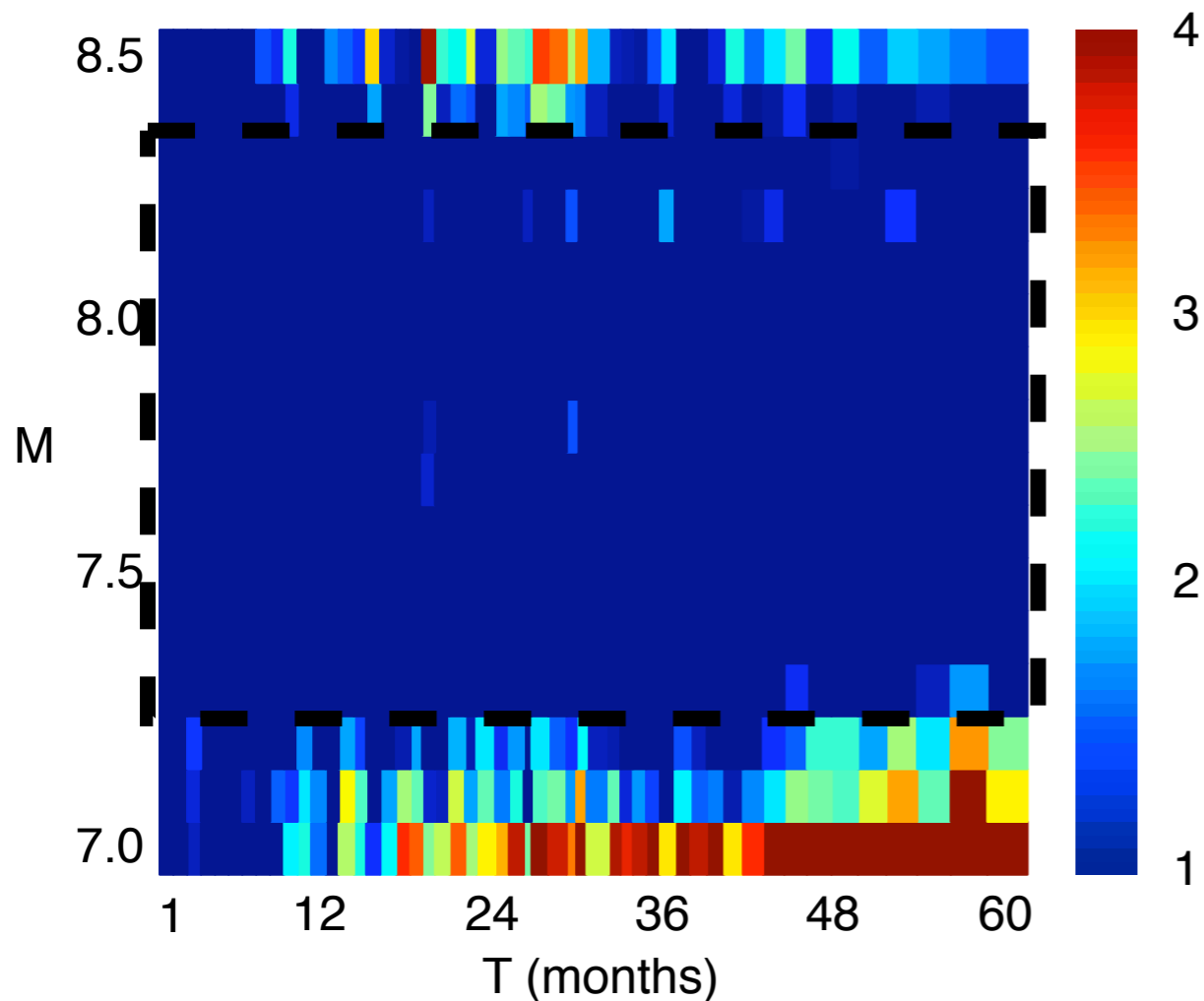
Blue= Random Distribution

Overpopulation for  $M < 7.3, T > 24$

Is this overpopulation Statistically Significant?

# Synthetic Catalogs: Aftershocks Removed

$$\sigma = \frac{V - \bar{V}}{\delta V}$$



Red= Statistically significant

$\sigma$

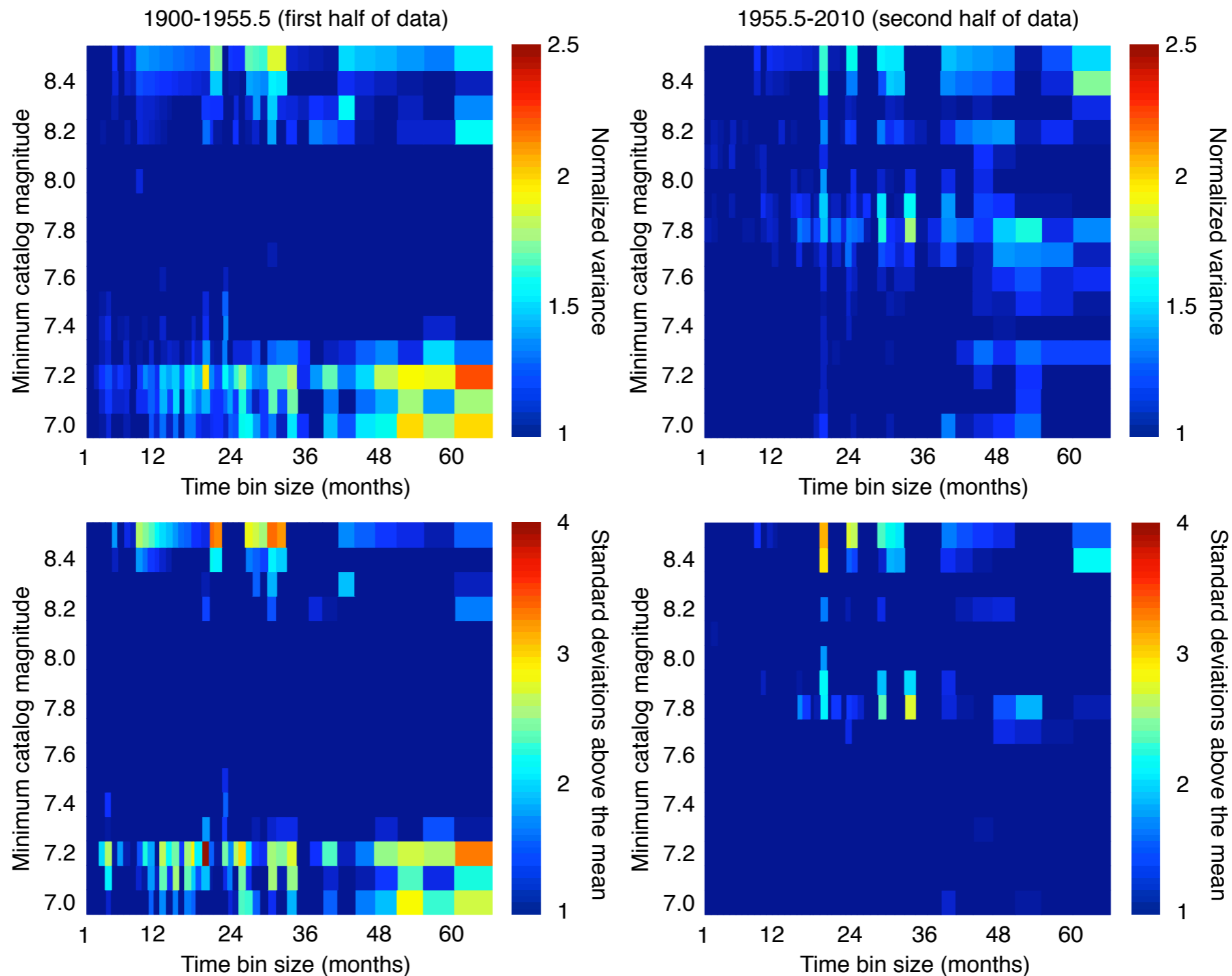
Blue= Statistically insignificant

Overpopulation significant only for  $M < 7.2, T < 24$

Noise at  $M > 8.3$ , very few data points

Let's compare 1900-1955 with 1955-2011

# Mainshocks only



Stronger evidence: separately, each catalog is random

# Issues

- Discrepancy between earlier and current data
- Discrepancy between databases
- Decluster: identify and remove aftershocks
- Very small of very large events