

# Predictability experiments of earthquakes in Italy

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*2. Lamont-Doherty Earth Observatory*

*3. USC/SCEC*

*4. INGV*

# Credits

Retrospective results from Werner *et al.*, in review

Real-time experiment results from Marzocchi & Lombardi 2009 GRL

Risk assessment perspective from van Stiphout *et al.* 2010 GRL (in press)

# Discussed:

Earthquake predictability experiments,  
CSEP Italy retrospective analysis,  
Real-time earthquake forecasting,  
Probabilistic loss estimation

# Earthquake predictability experiment

We consider binned space-rate-magnitude forecasts and compare forecasts with each other and with similarly binned observations.

In prospective experiments, forecast values are fixed before making the relevant observations.

In retrospective experiments, forecasts and observations might not be independent.

# Forecast format

The geographic region of interest is divided into spatial cells (e.g.,  $0.1^\circ \times 0.1^\circ$ ).

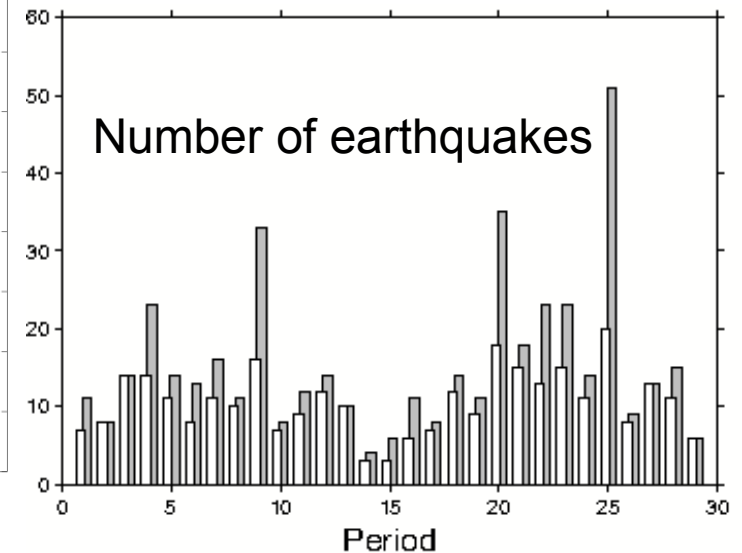
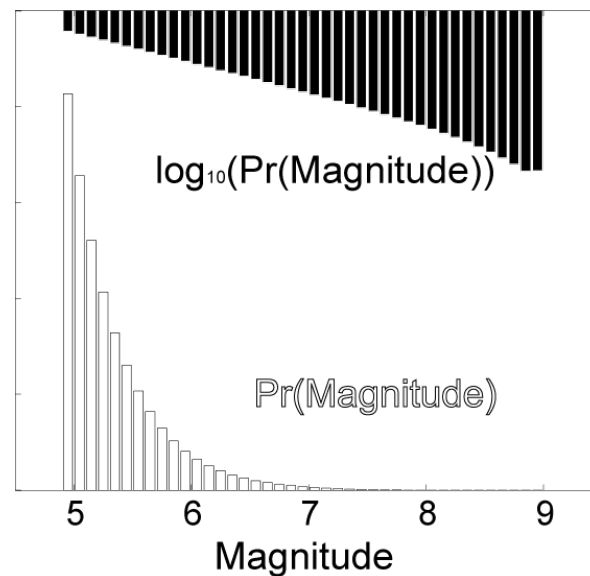
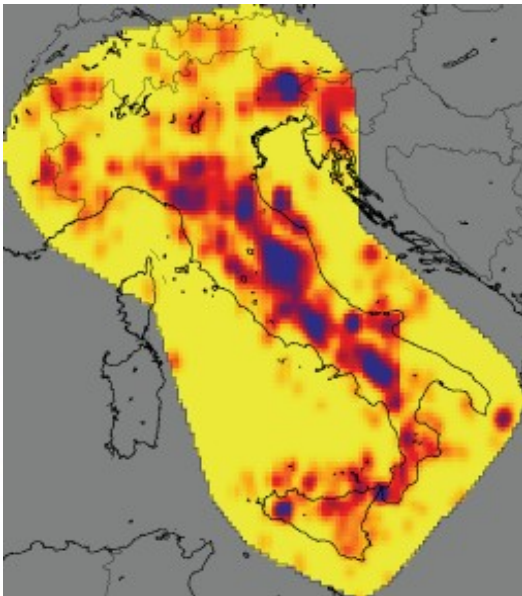
The spatial cells are divided into magnitude bins (e.g., 0.1 units).

For a fixed time period (e.g., 5 years), a forecast specifies the expected number of earthquakes in each latitude-longitude-magnitude bin.

For example, I expect  $6.9e-7$  earthquakes with magnitude 6.95 to 7.05 in the cell with latitude range  $44.9^\circ\text{N}$  to  $45^\circ\text{N}$  and longitude range  $5.5^\circ\text{E}$  to  $5.6^\circ\text{E}$  between 1 August 2009 and 1 August 2014.

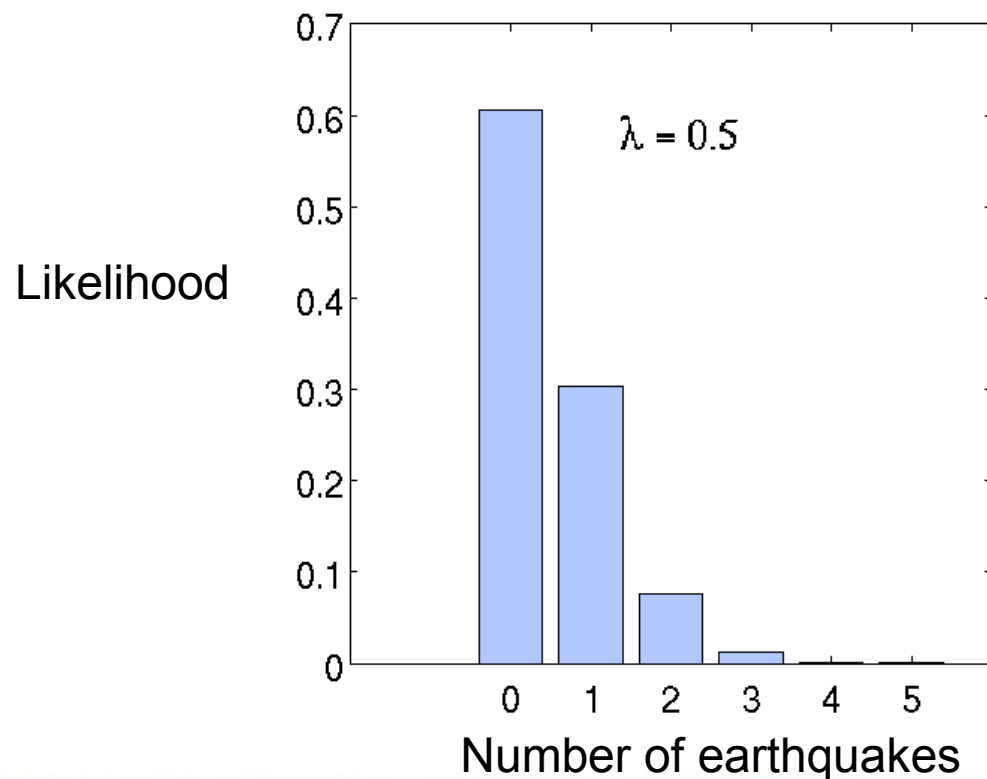
# Recipe for preparing a forecast

- Estimate spatial distribution of seismicity
- Estimate (or assume) magnitude distribution
- Estimate seismicity rate
- Mix vigorously



# To evaluate

Each forecast is treated as a vector of independent Poisson expectations; its elements are the numbers in each forecast bin.



# Tests

1. N(umber) test compares the number of eqks forecast with the number of eqks observed.
2. L(ikelihood) test compares the forecast space-rate-magnitude distribution with the corresponding observation.
3. S(pace) test compares the forecast spatial distribution with the observed epicenters.
4. M(agnitude) test compares the forecast magnitude distribution with the observed magnitudes.

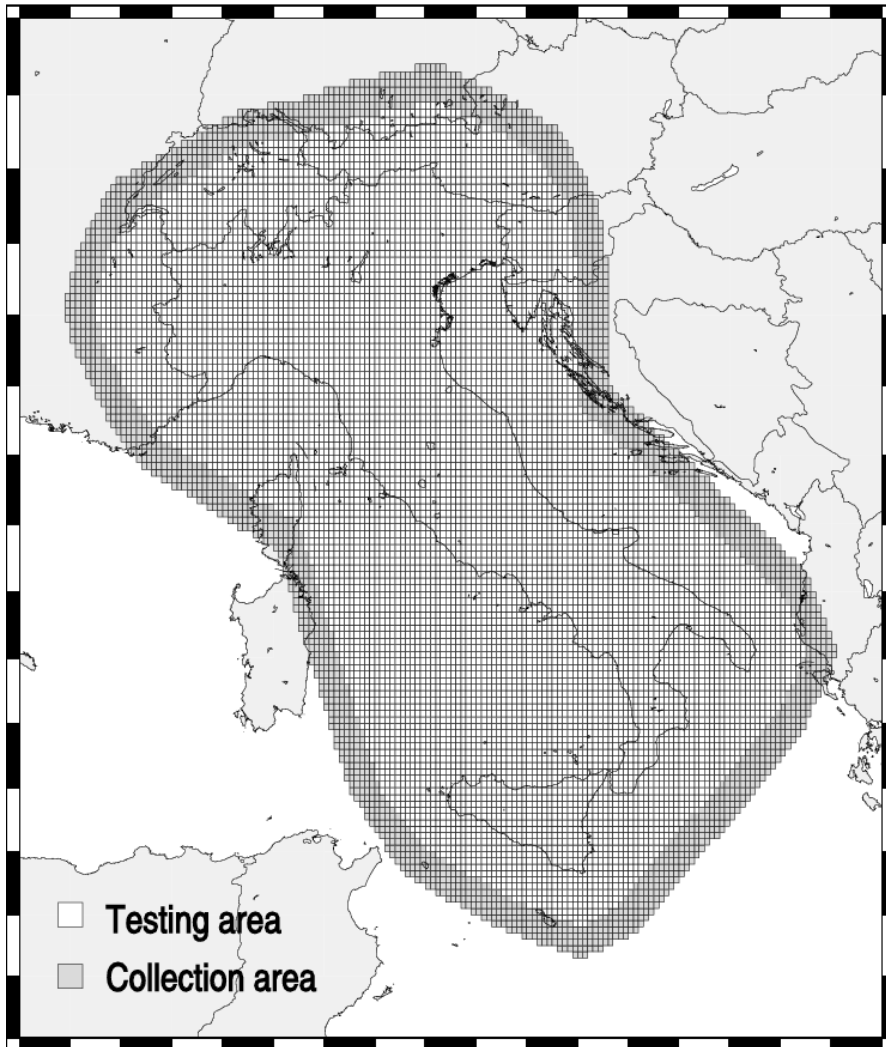


# Result interpretation

We present results in terms of an acceptable range and an observed value. The acceptable range is based on simulations of catalogs that are “consistent with the forecast.”

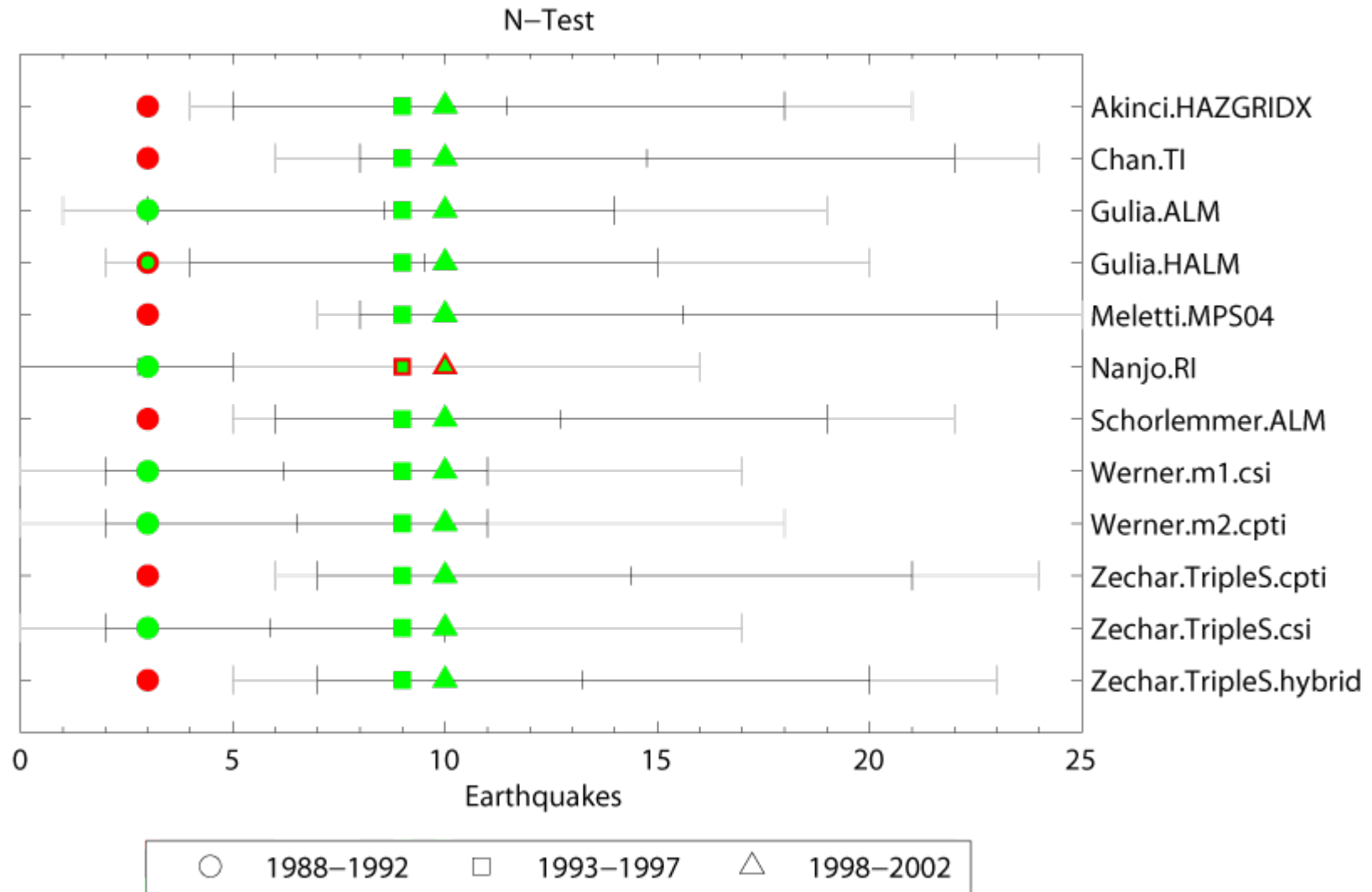
If the observed value is outside the acceptable range, the observation is considered unlikely, given the forecast. Often we use hypothesis testing terms, e.g., “the forecast is *rejected*.”

# CSEP Italy experiments

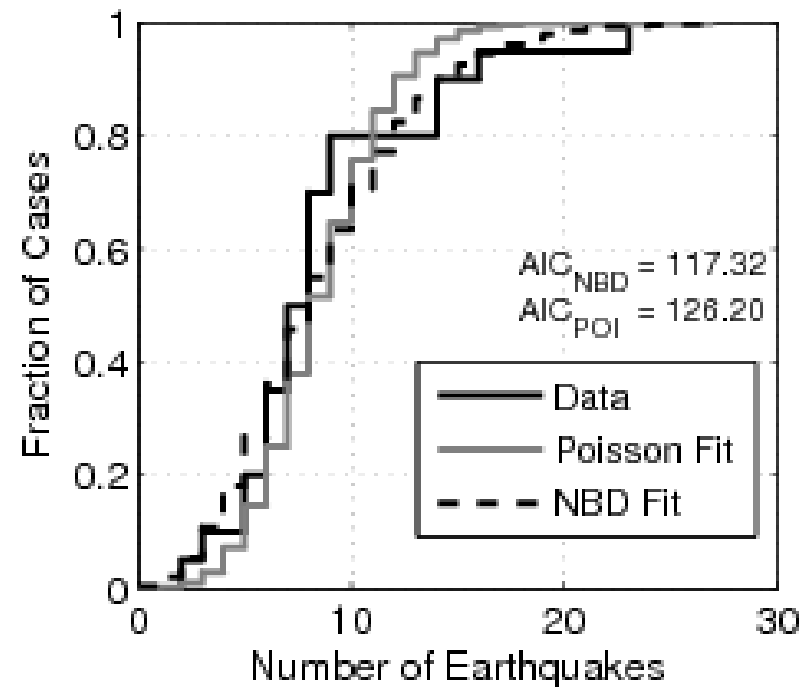
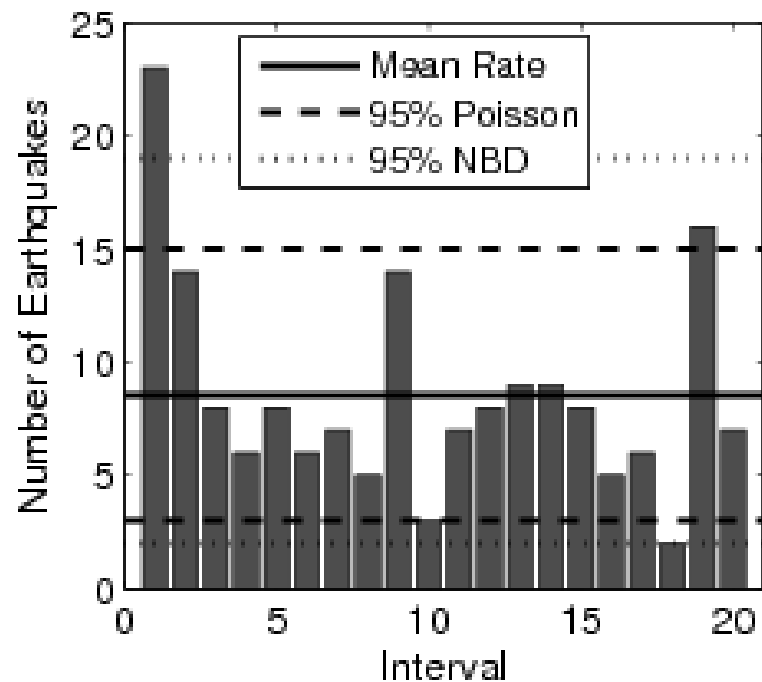


- Forecasts of three-month, five-year, and ten-year duration
- Forecasts based on smoothed seismicity, geological structures, spatial variation of Gutenberg-Richter  $b$ -value
- Eighteen five-year forecasts being considered

# Example result



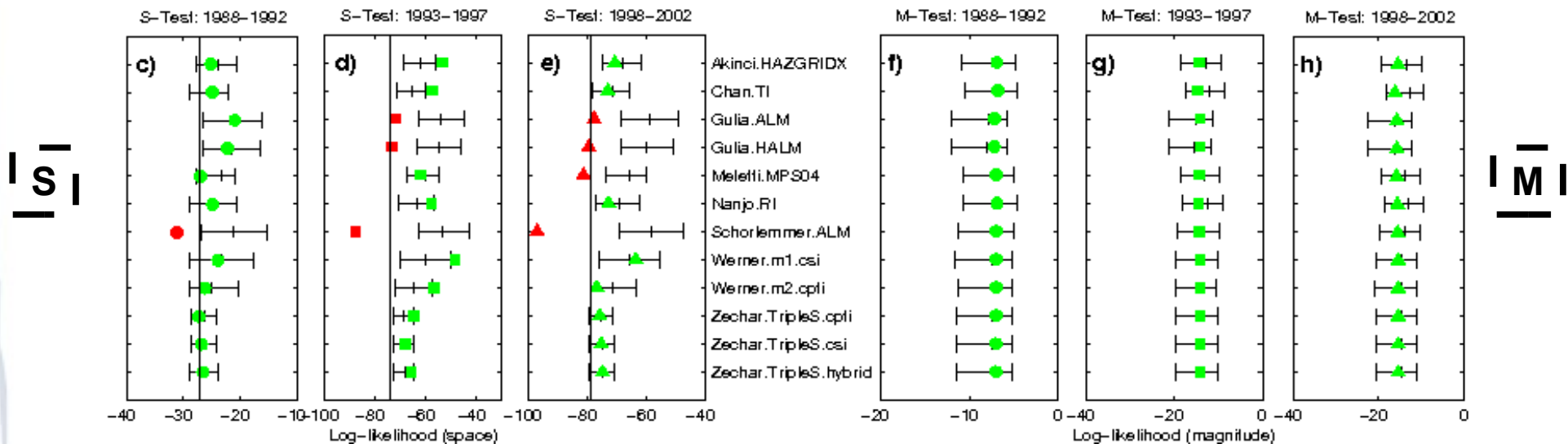
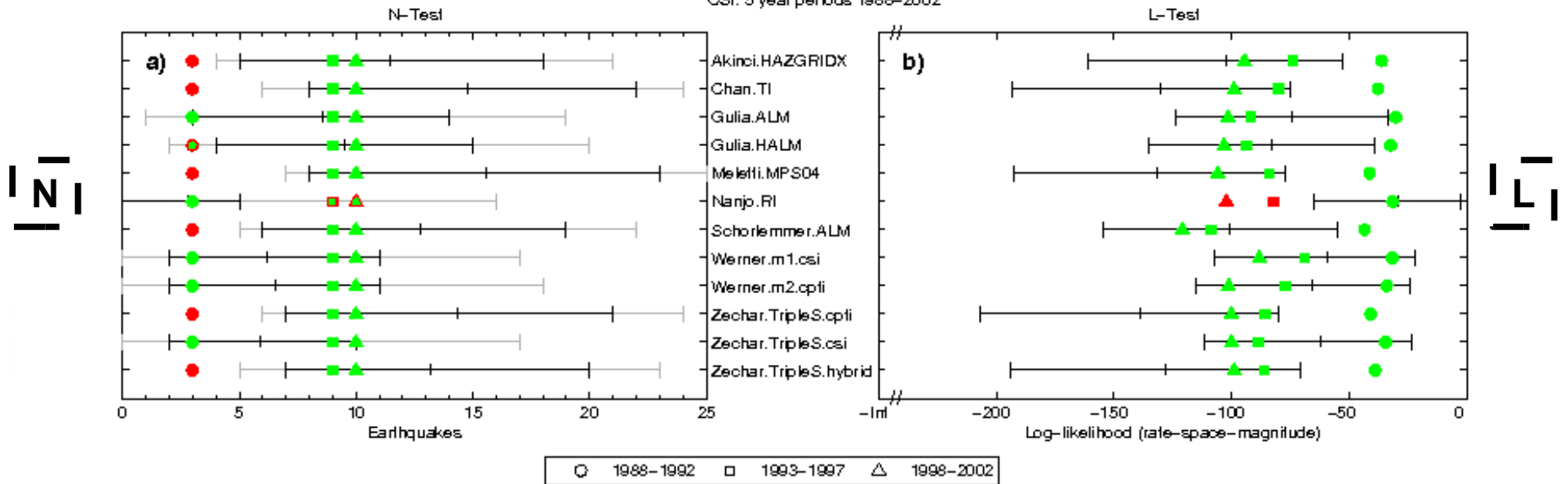
# Problem with Poisson assumption



Many researchers have shown that a negative binomial distribution fits the earthquake number distribution better than Poisson.

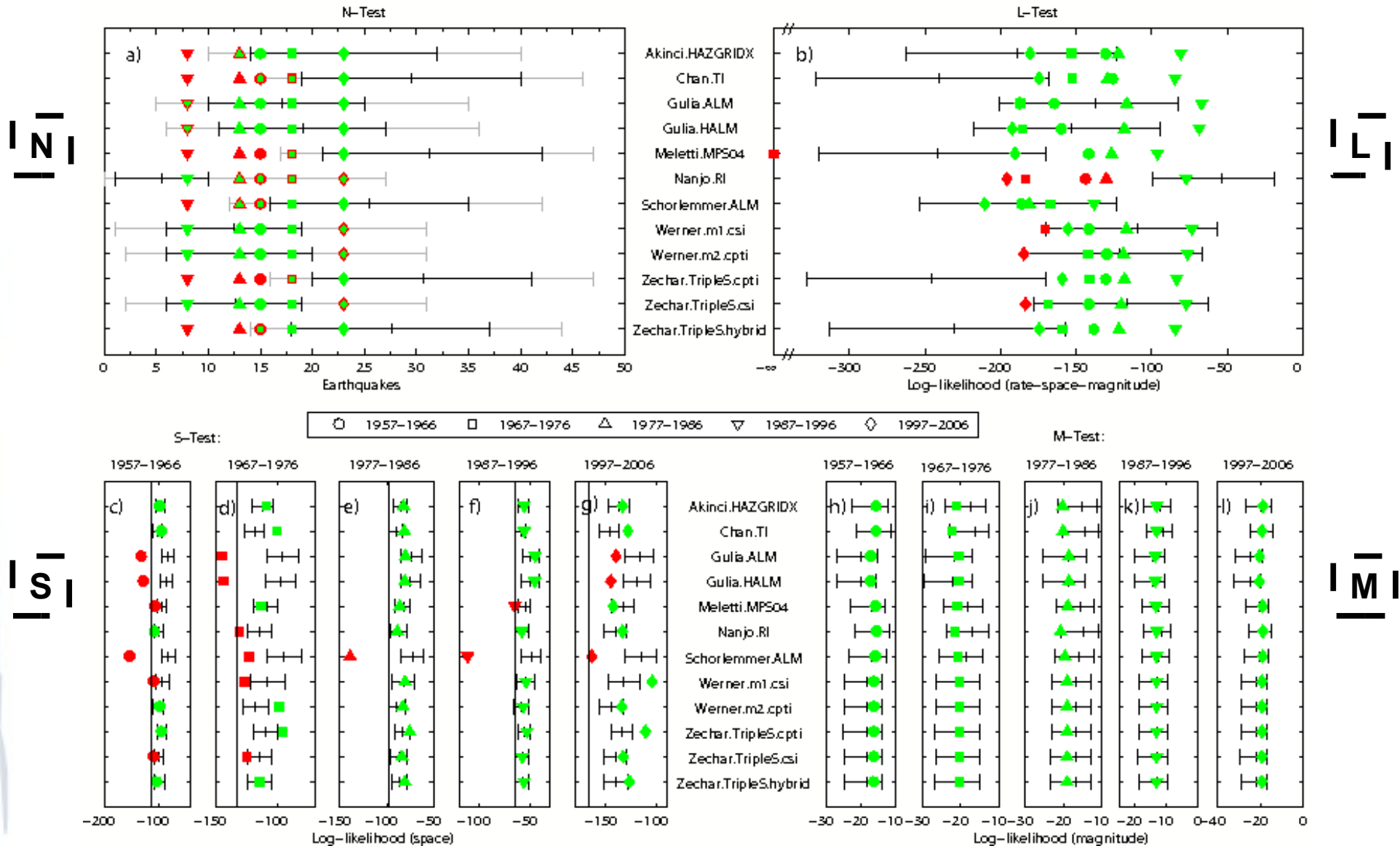
# Five-year experiments results

CSI: 5 year periods 1988-2002



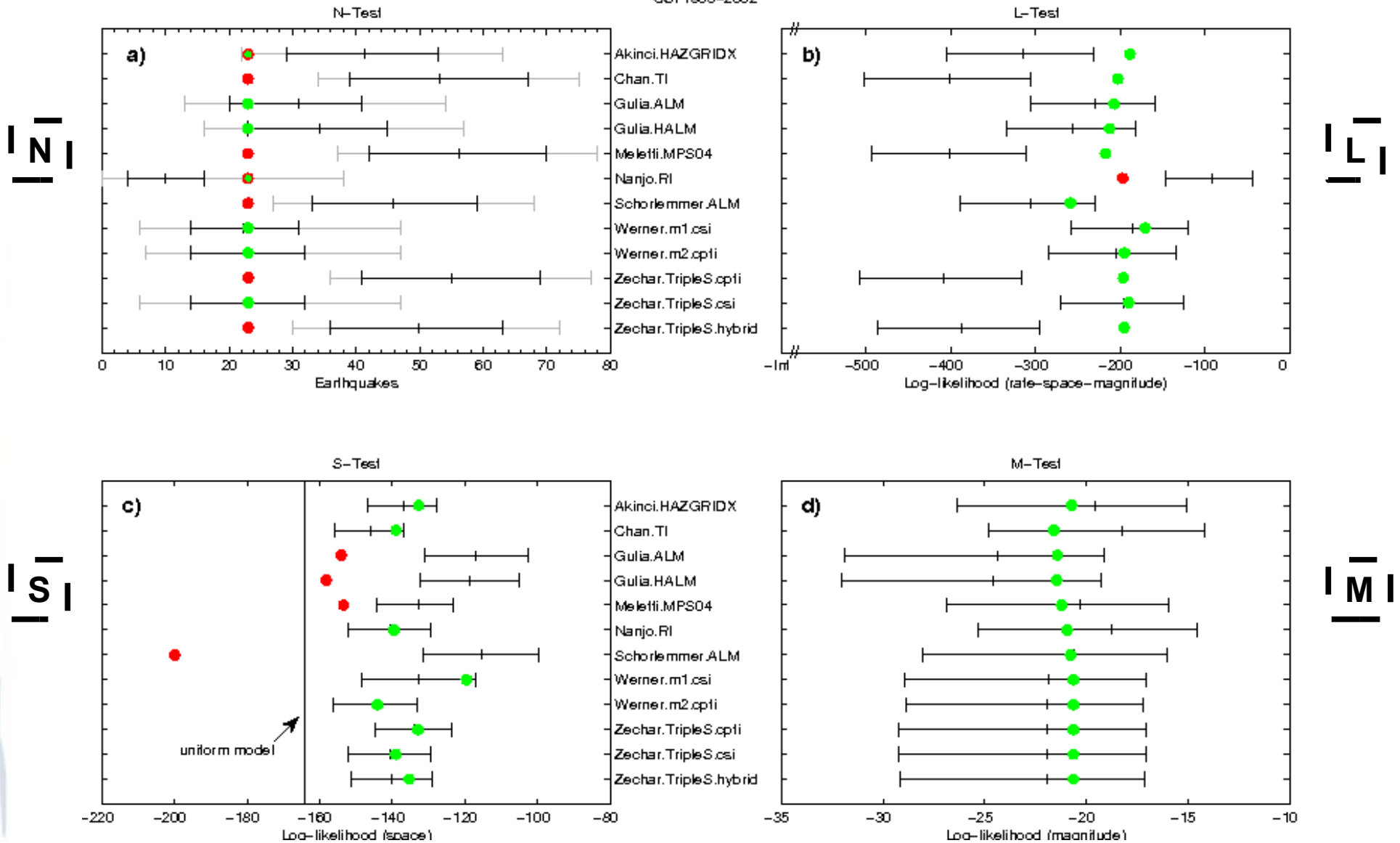
# Ten-year experiments results

CPTI: 10 year periods 1957–2006



# 18-year experiment results

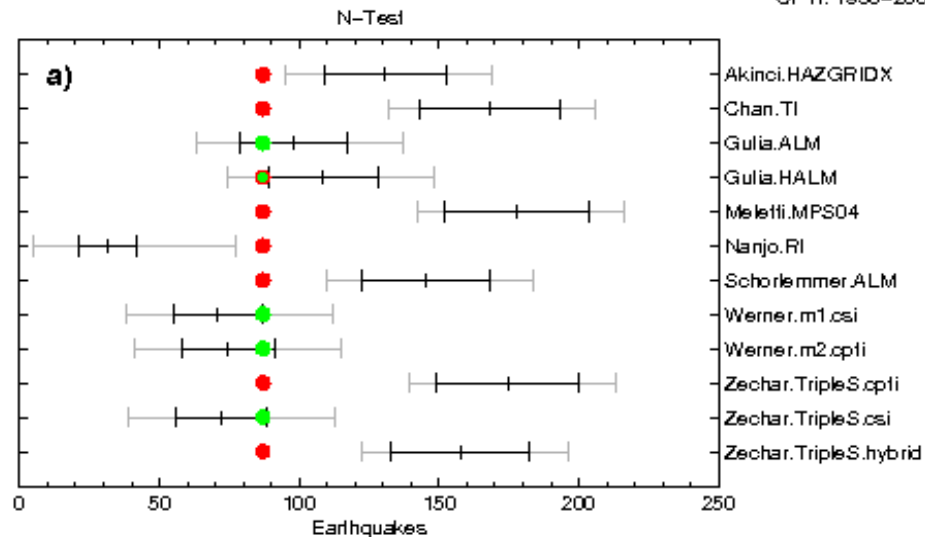
CSI 1985-2002



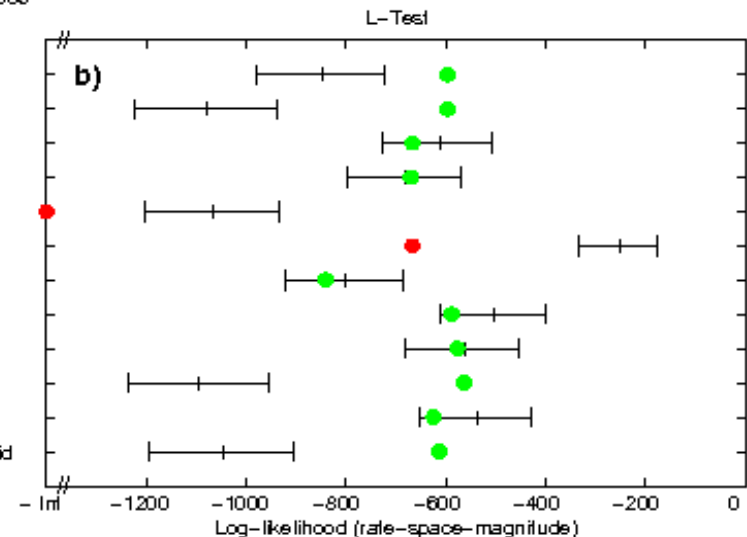
# 57-year experiment results

CPTI: 1950-2006

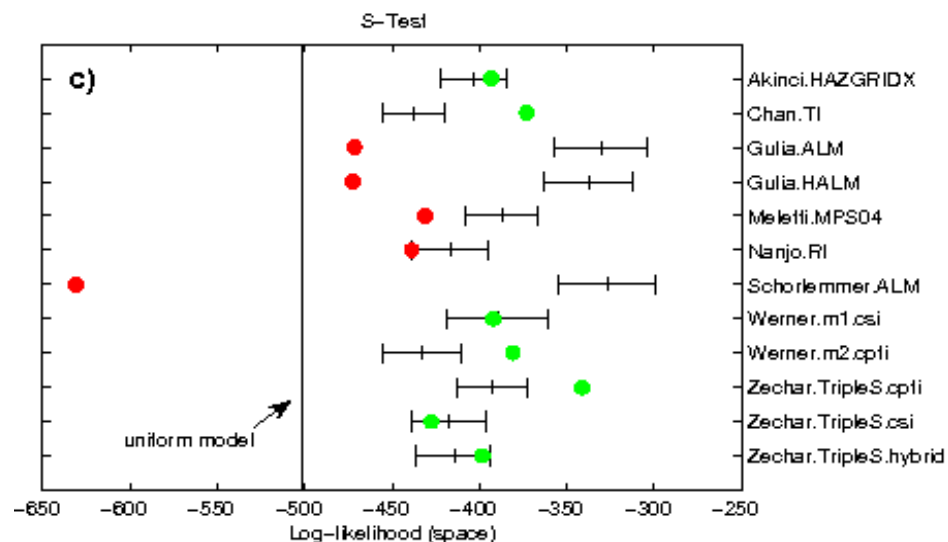
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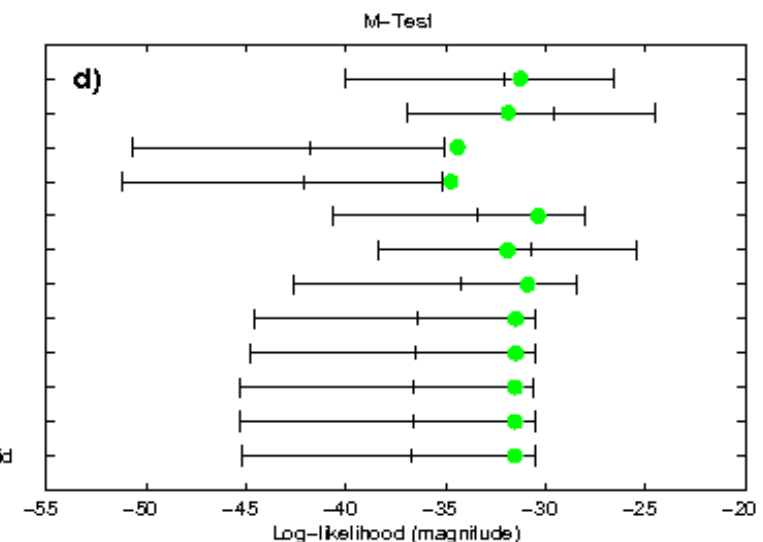
|L|



|S|



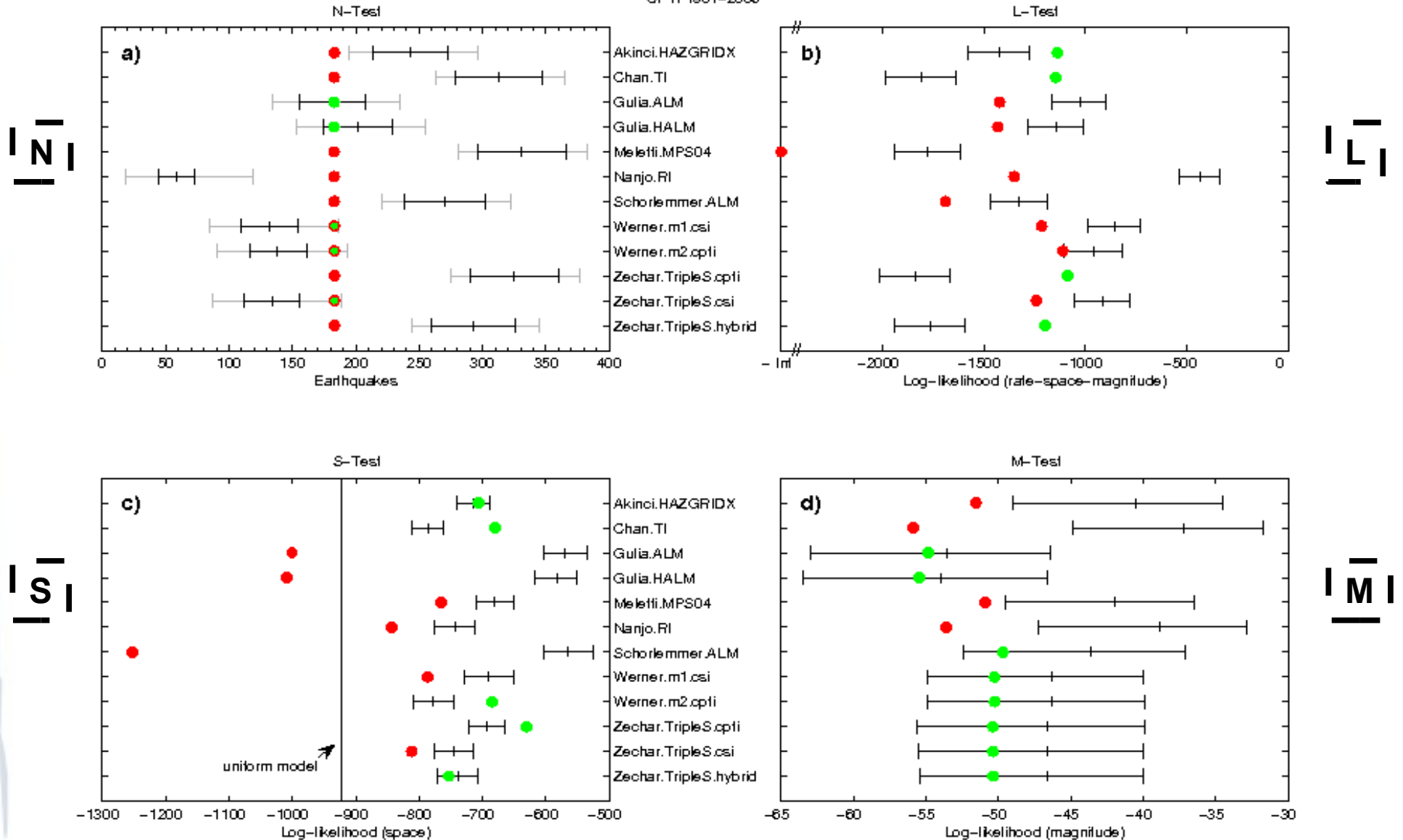
|M|





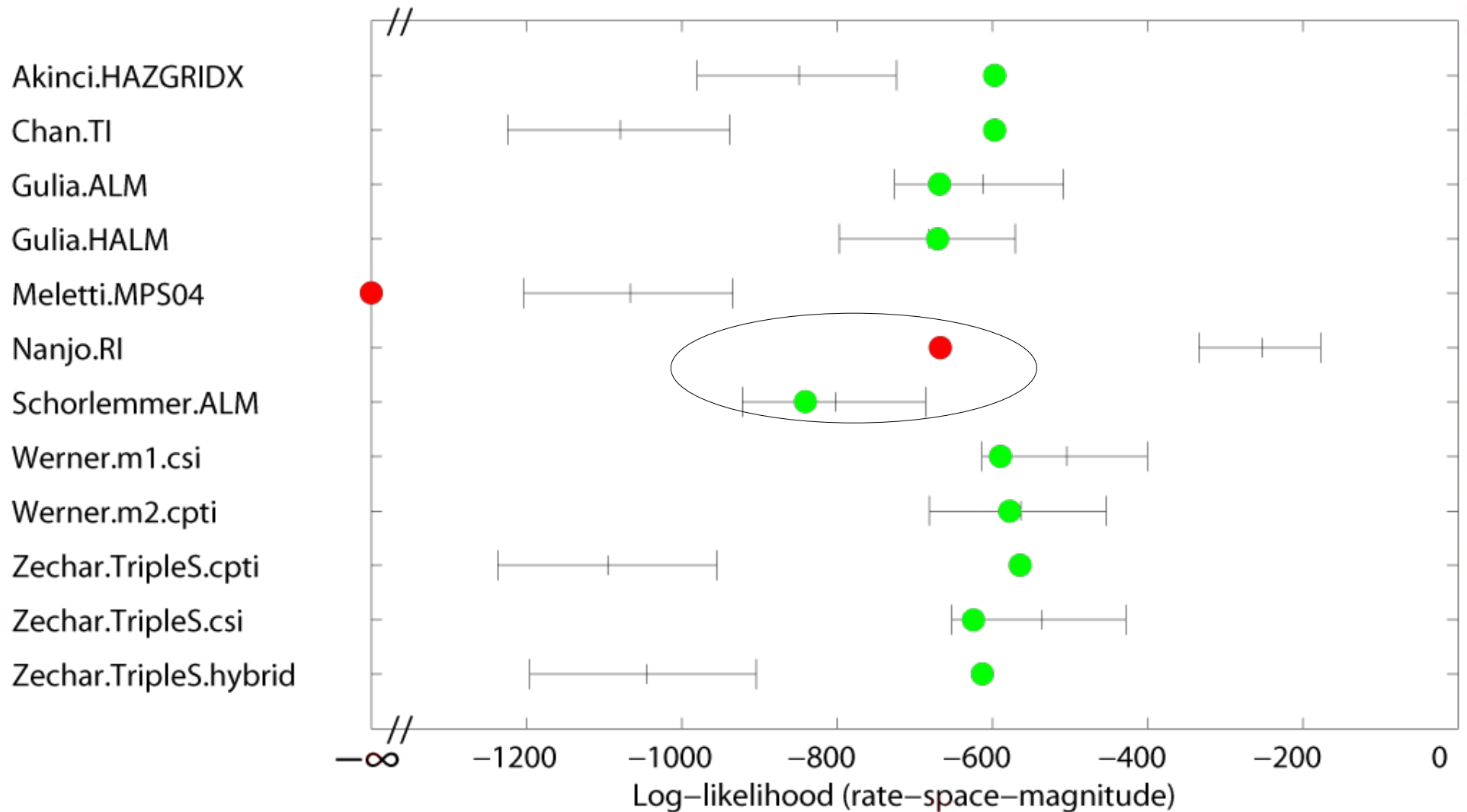
# 106-year experiment results

CPTI 1901-2006



# L-Test subtlety

CPTI: 1950–2006  
L-Test



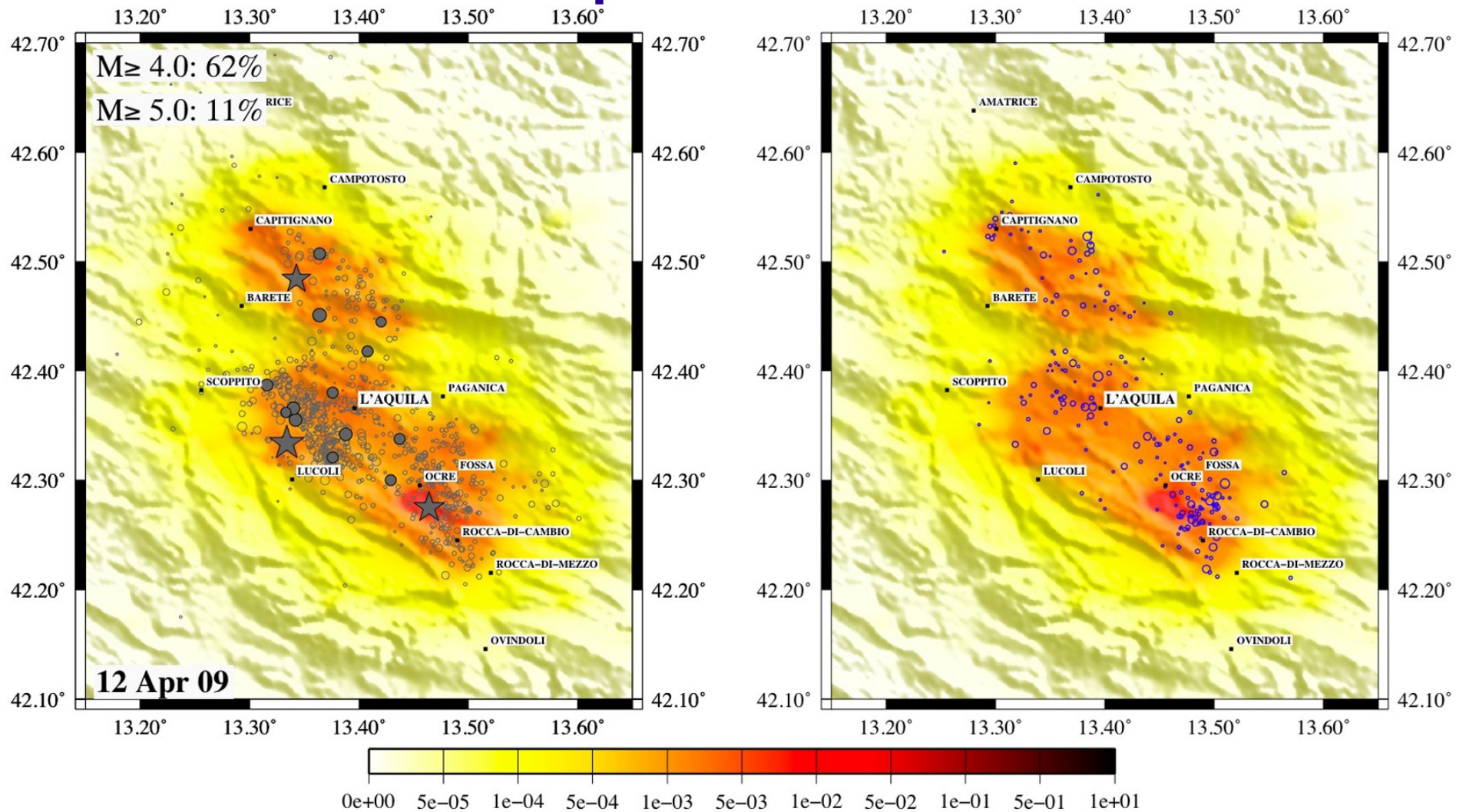
Much more to come

# Real-time next-day earthquake forecasts

In the wake of the L'Aquila earthquake (6 April 2009), forecasts were constructed using an ETAS model and were issued each day at 0800.

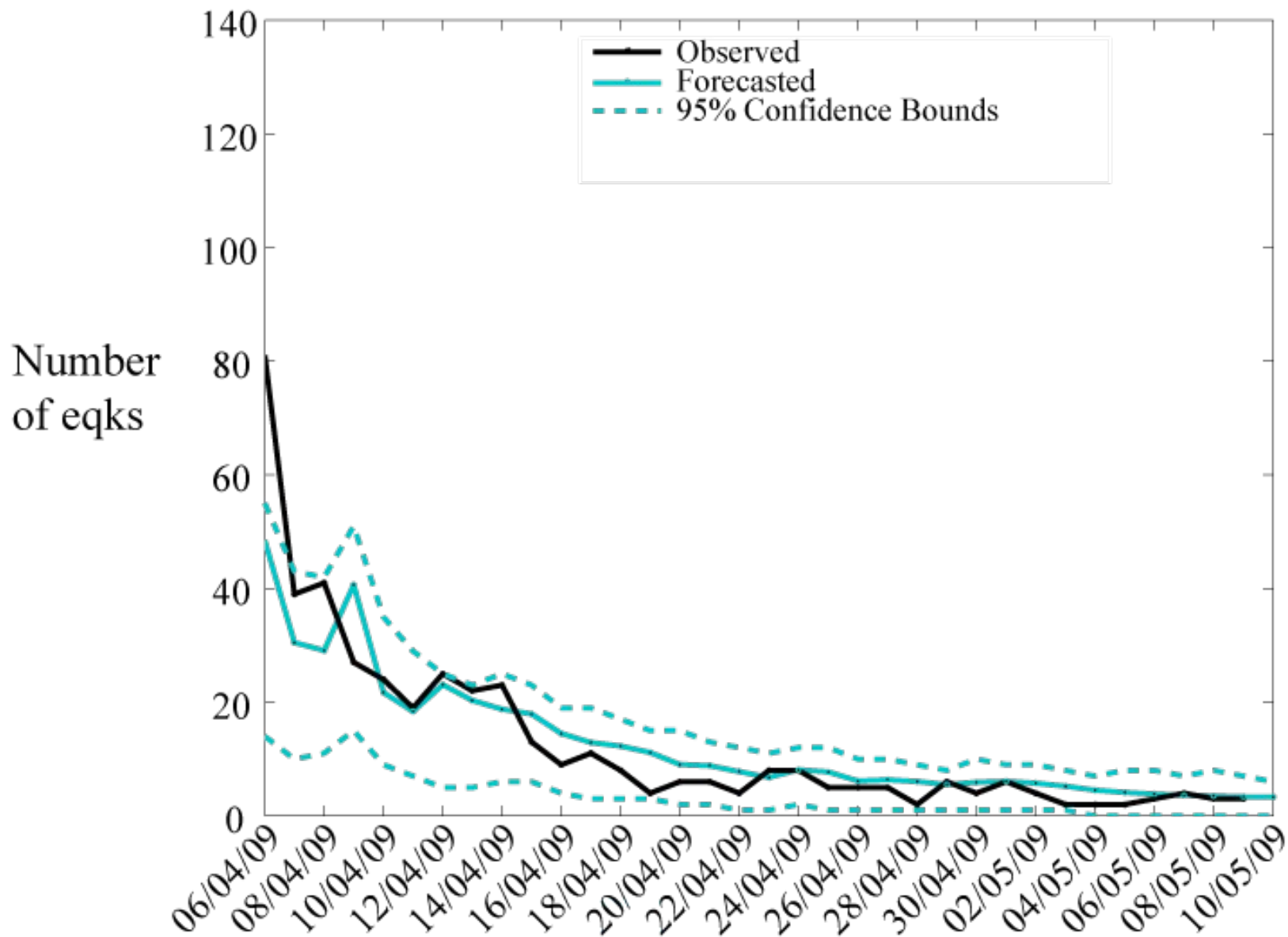
Forecasts were stated as the expected number of eqks with  $M \geq 4$  for the following 24-hr period.

# Example forecast

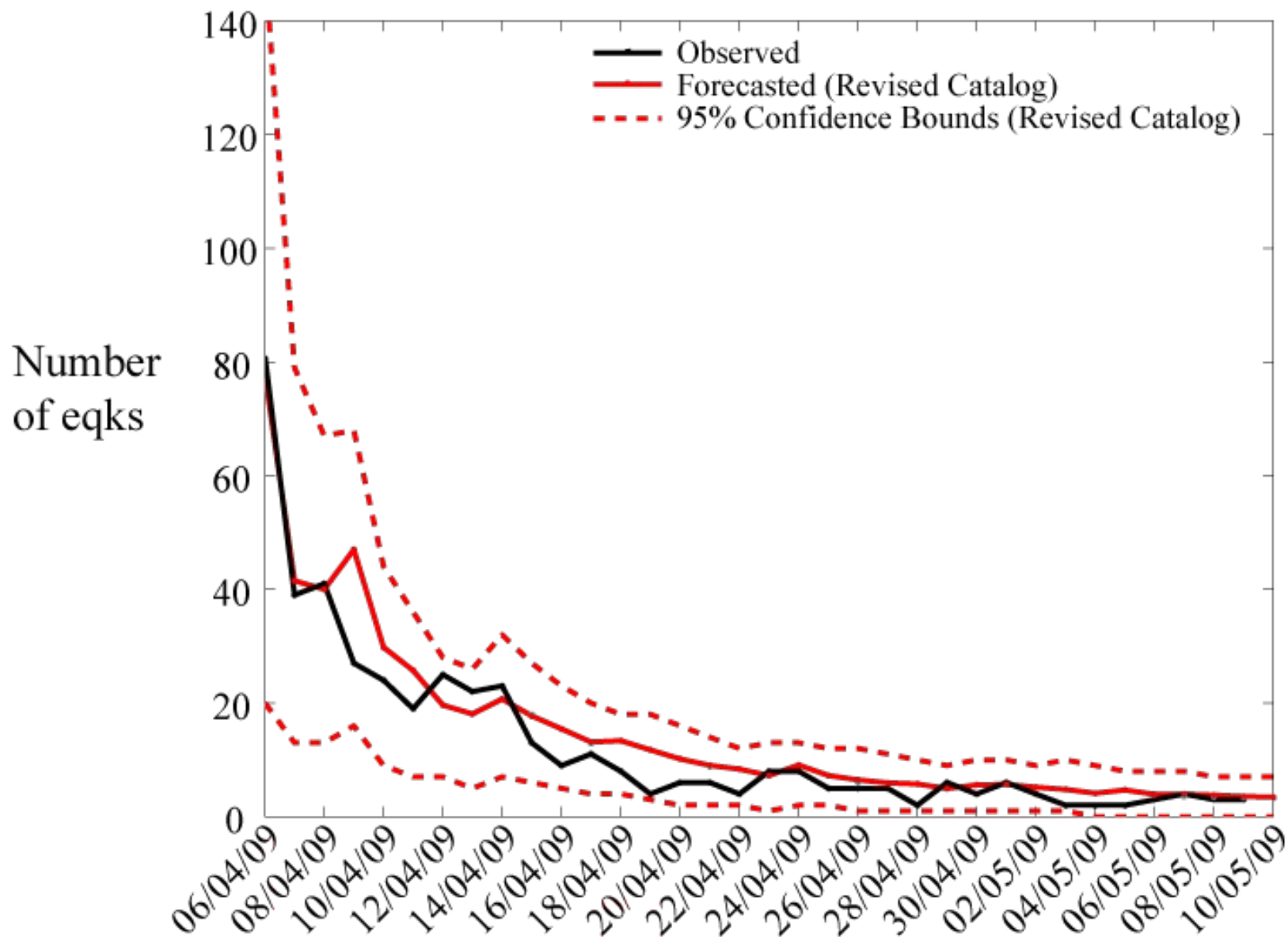


How good were these forecasts?

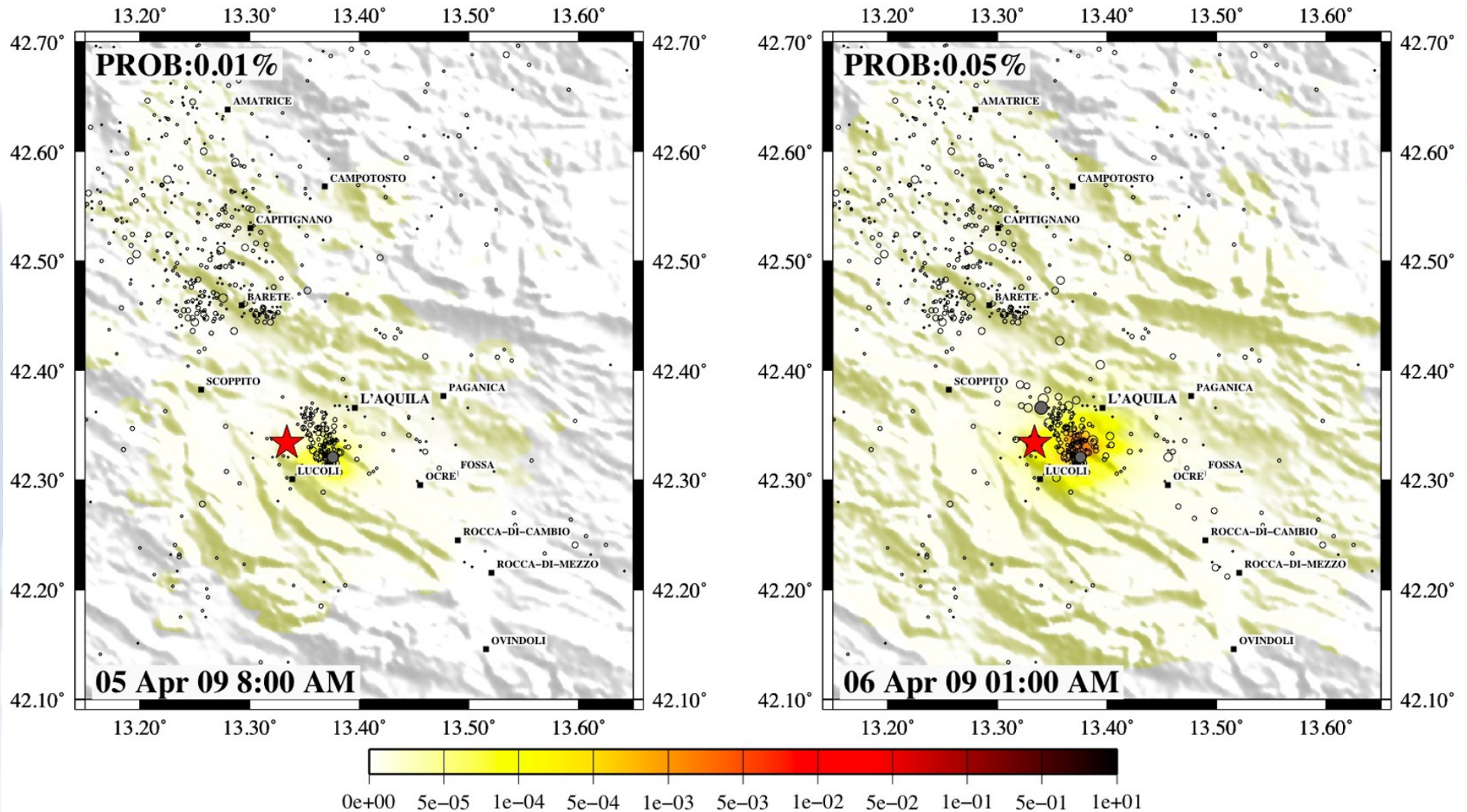
# Rate analysis



# Rate analysis



# Could the model have effectively forecast the L'Aquila eqk?





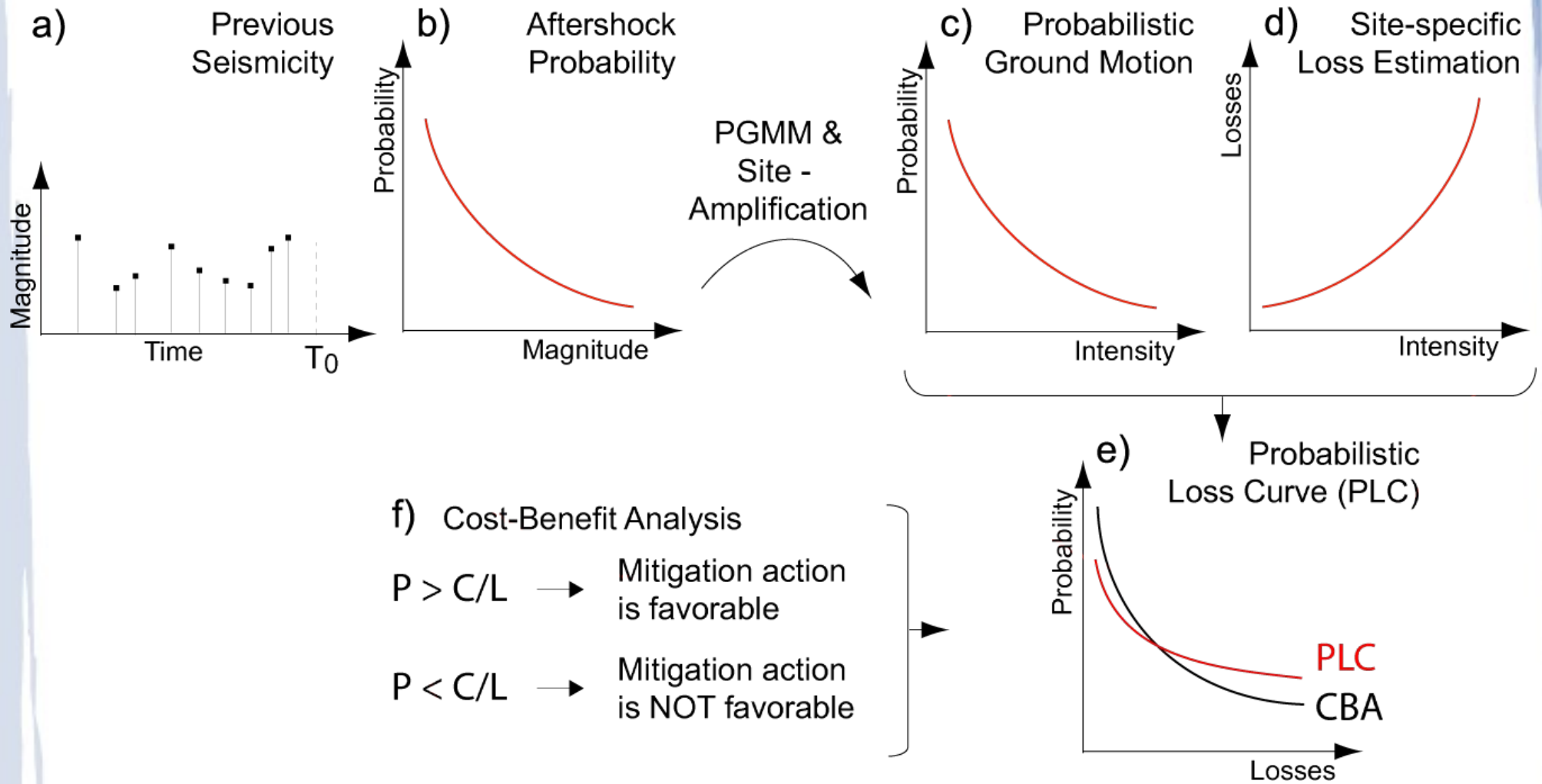
# More generally, could/should something have been done?

Consider simple cost-benefit analysis approach:

- Cost,  $C$ , of mitigation action
- Financial losses,  $L$ , due to risk
- Probability,  $P$ , of risk

Mitigation action is favorable if  $P > C/L$ .

# Probabilistic loss workflow



# Method

## Cost-Benefit Approach for Aftershock Risk Estimation

$$\frac{C}{L} = \frac{\textit{persons evacuated} * \textit{socio-economic cost per person per day} * \textit{days}}{\textit{fatalities} * \textit{amount willingly paid for avoided fatality}}$$

- **Socio-economic costs** here defined by total cost of **evacuation of buildings** (costs such as closing businesses; losing working hours; broadcasting the alarm; and providing facilities, board, and lodging for people)
- **Amount willingly paid for avoided fatality:** average societal value of a life. This number should be defined by the decision makers and is often controversial – **but unavoidable!**

# Application to L'Aquila eqk

- Reasenbergs & Jones aftershock probabilities
- Seismicity: 1 January – 6 April 2009 (before L'Aquila  $M_w$  6.2),  
 $M_w \geq 2.5$
- Population data: 2008/2009
- Building stock according to Quakeloss
- Mitigation action: Evacuation of buildings of EMS-98 vulnerability classes A and B

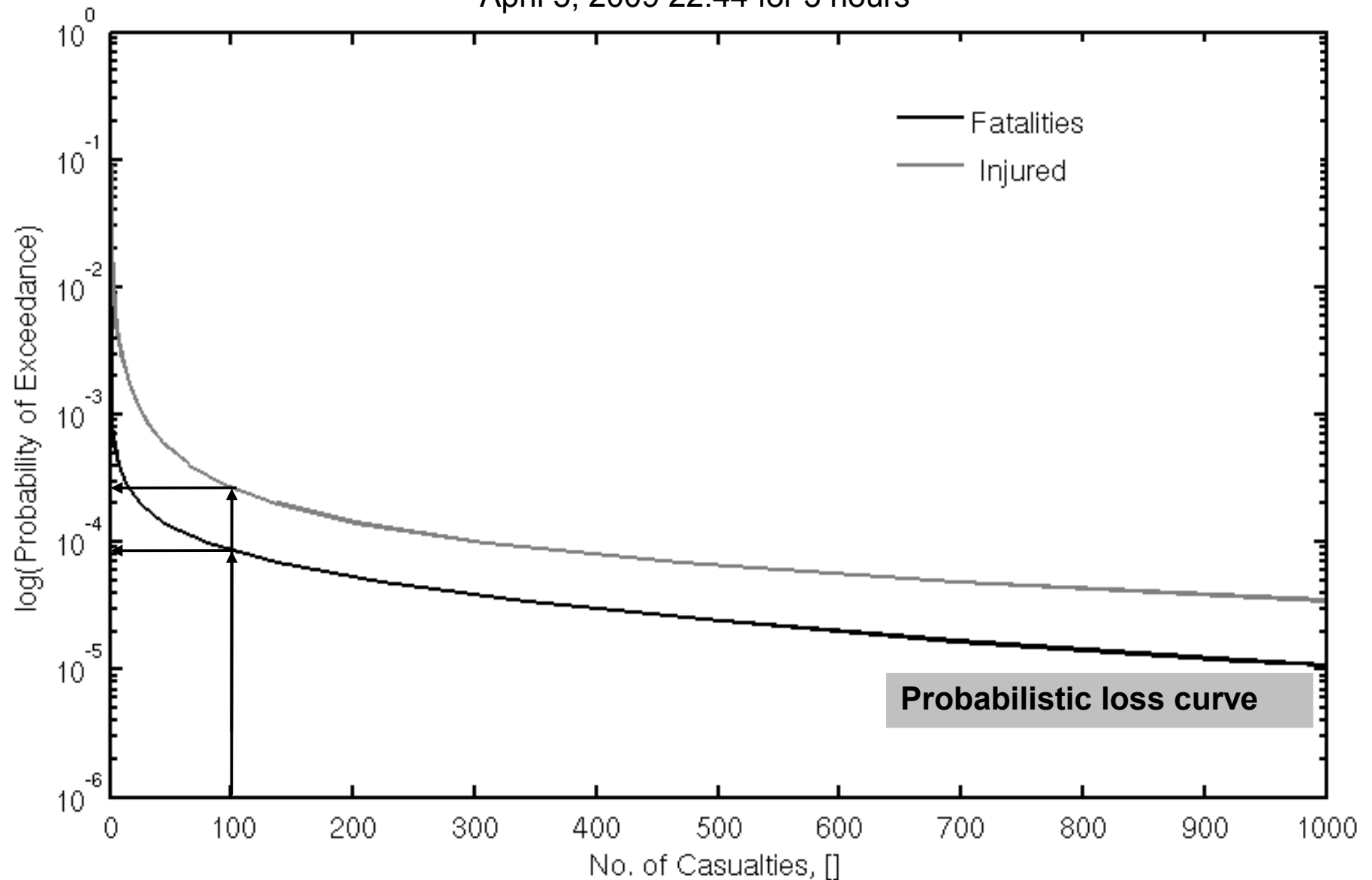
Loss estimate for  $M_w$  6.2 L'Aquila earthquake:

Plausible range: 297 – 596 Fatalities

Most probable: 430 Fatalities

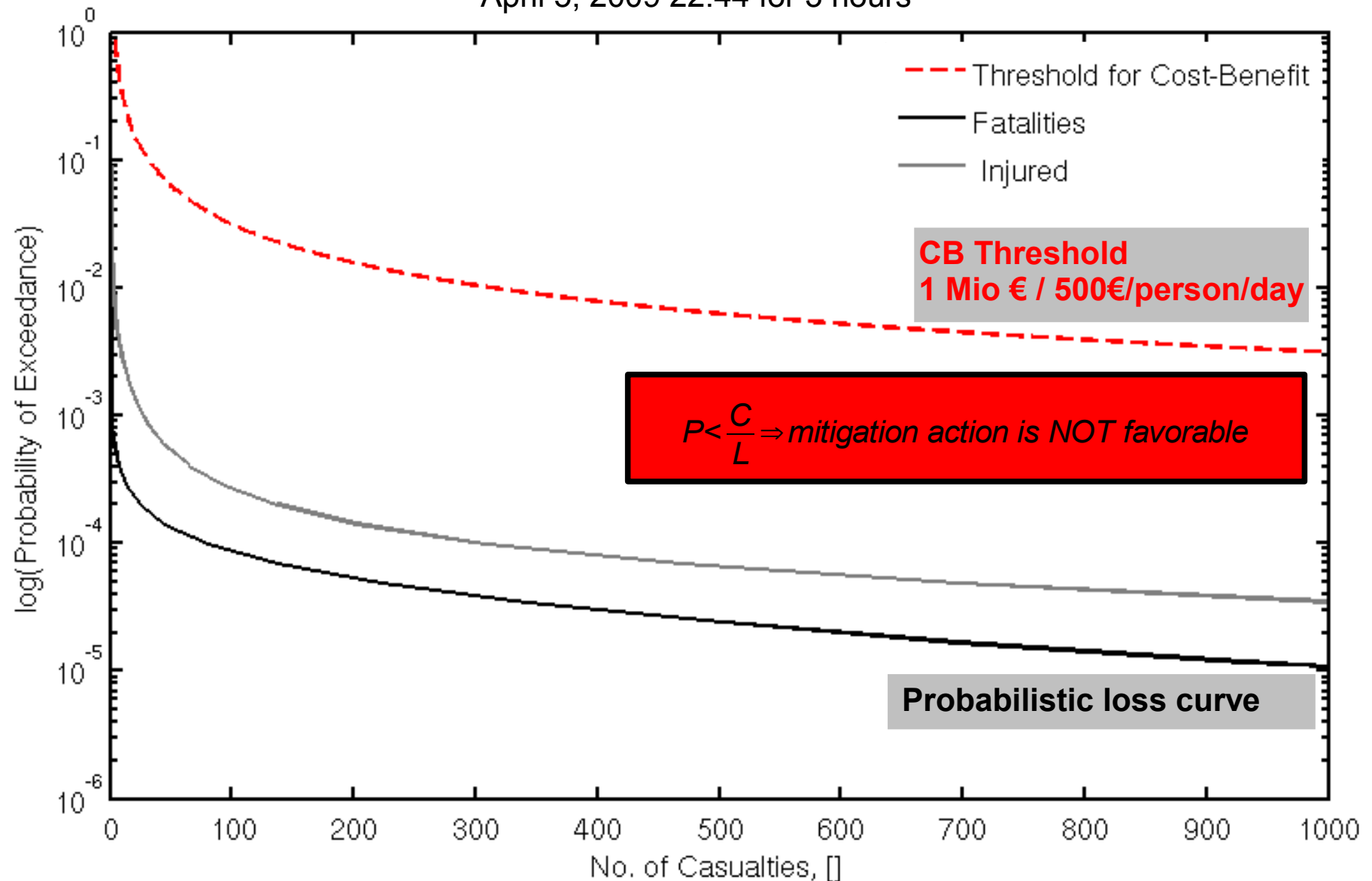
# Losses for L'Aquila city

April 5, 2009 22.44 for 3 hours



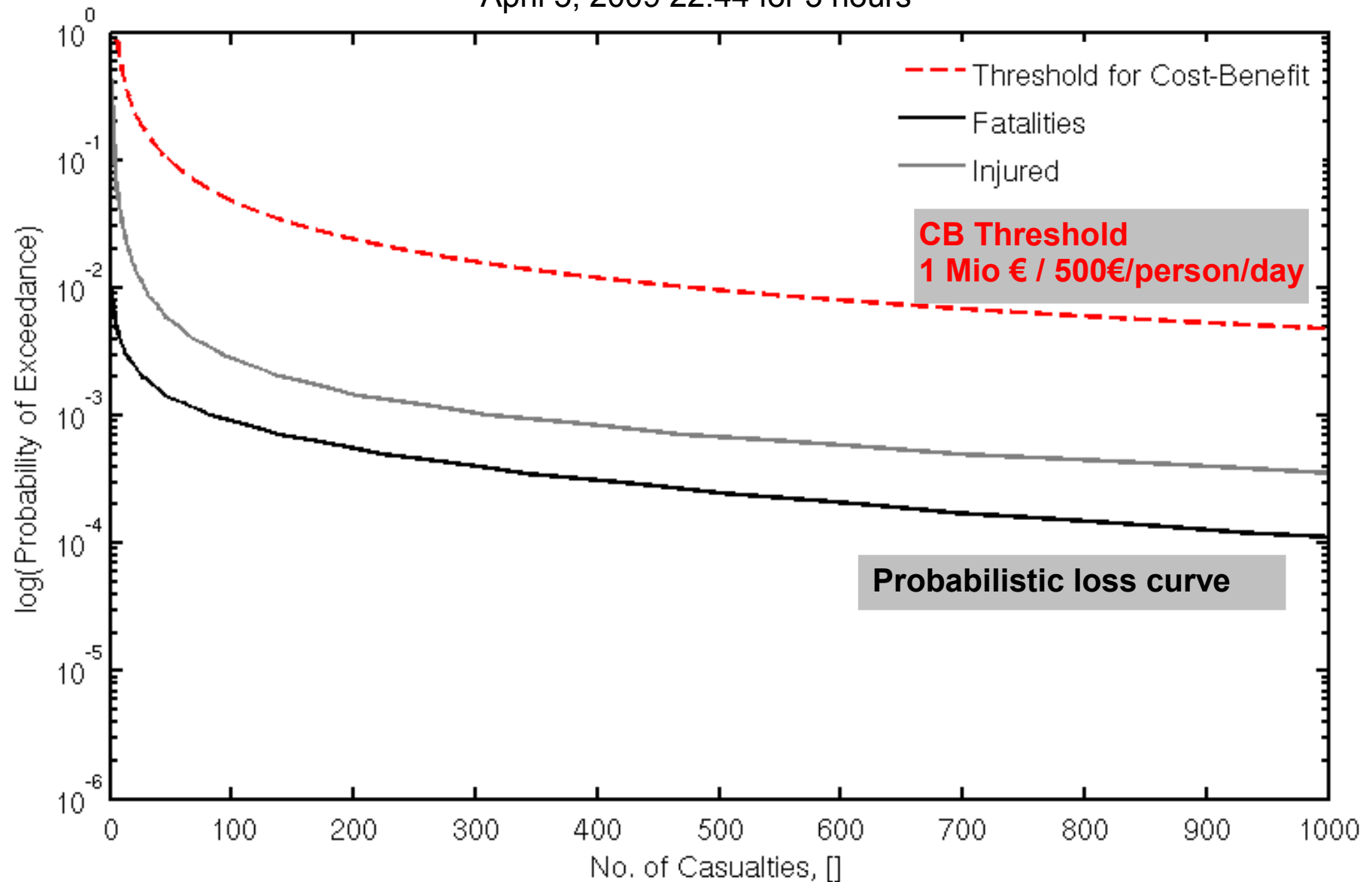
# Cost-benefit for L'Aquila city

April 5, 2009 22.44 for 3 hours



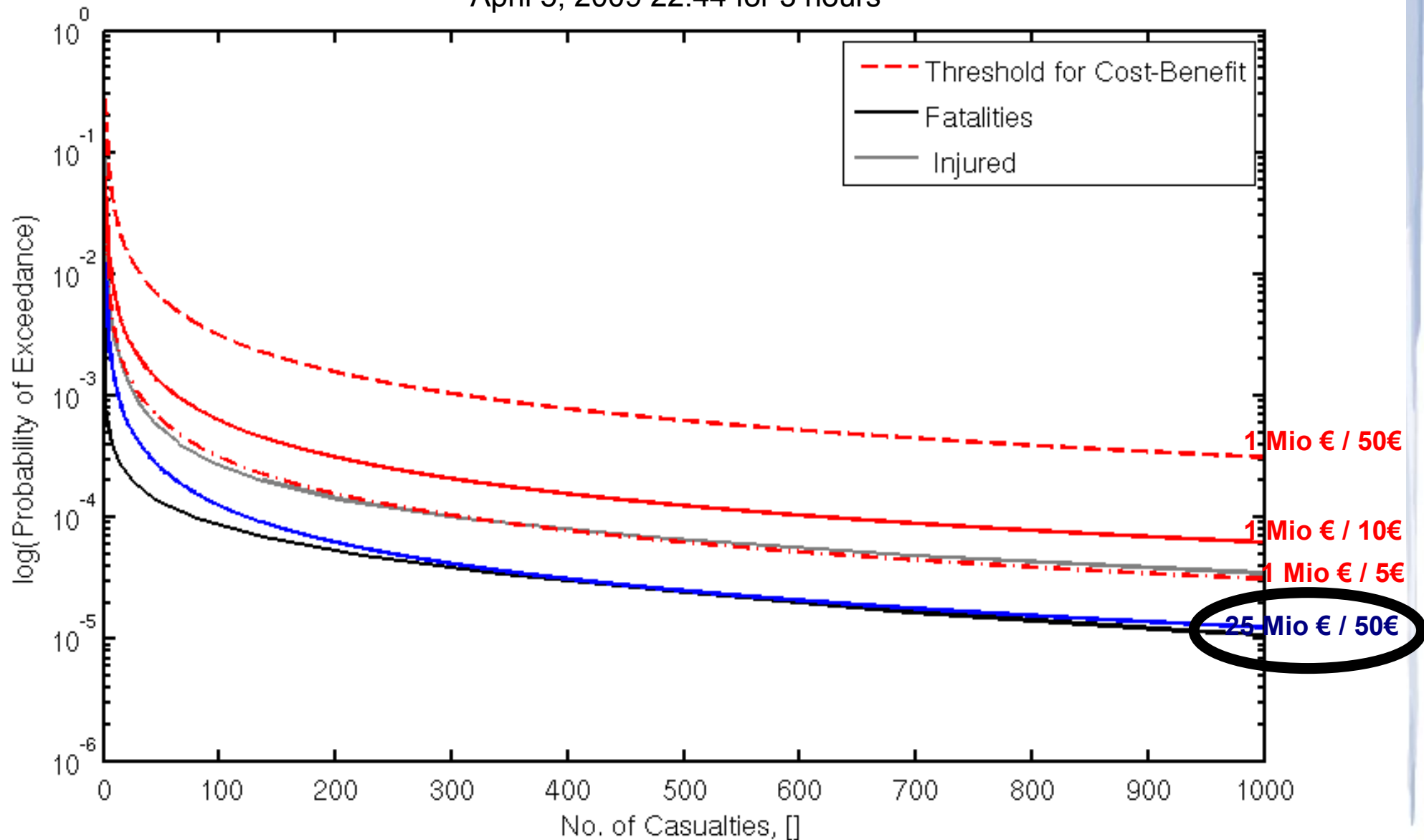
# Cost-benefit for L'Aquila region

April 5, 2009 22.44 for 3 hours



# Cost-benefit for L'Aquila city

April 5, 2009 22.44 for 3 hours





# Credits

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Thank you.

# RI/ALM interpretation

- 1) Based on the observed joint likelihood, RI is superior to ALM.
- 2) Based on the L-test, however, observation is inconsistent w/ RI and consistent w/ ALM.

This is a matter of perspective: 1) asks the opinion of the observation, 2) asks the opinion of the forecasts. There is an analogy to dating here.

# Method

