

Methodologies for Earthquake Hazard Assessment

SFRARR Central Asia disaster risk assessment

18th January 2022



Get to know the Lecturer

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GLOBAL EARTHQUAKE MODEL
working together to assess risk



OGS



Resources

These lectures wouldn't have been available without the contribution of many people and the numerous resources from textbooks and online material.

A special acknowledgment (and a personal thanks) goes to the following people for their supporting material:

Dr. Dario Slejko – OGS, Trieste, Italy

Dr. Laurentiu Danciu – Swiss Seismological Service, ETH, Zurich, Switzerland

Dr. Marco Pagani – GEM Foundation

Dr. Donat Faeh – Swiss Seismological Service, ETH, Zurich, Switzerland

Dr. Elisa Zuccolo – EUCENTRE Pavia

Dr. John Douglas - University of Strathclyde, UK

Dr. Dave Boore - USGS

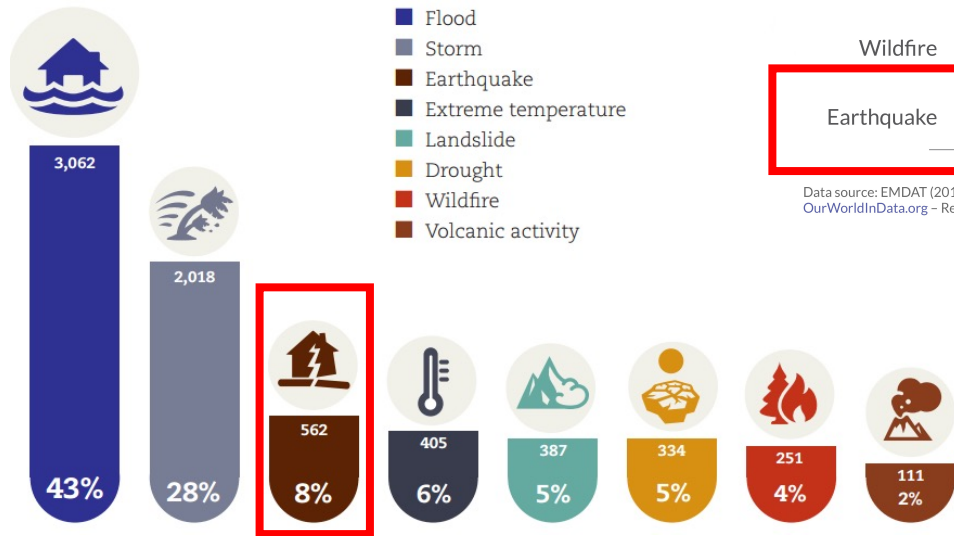
(I hope I did not forget anyone....)



Earthquakes: a widespread danger

Earthquakes are one of the most frequent and costly natural hazards worldwide.

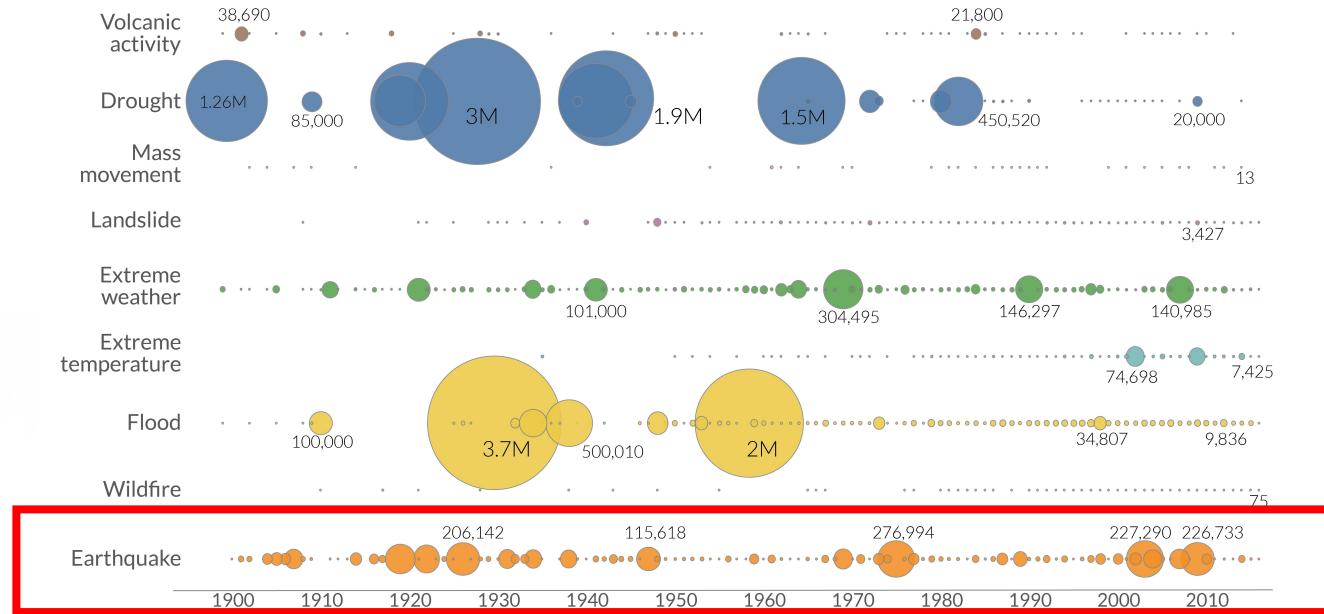
Percentage of occurrences of natural disasters by disaster type (1995-2015)



Global deaths from natural disasters (1900-2016)

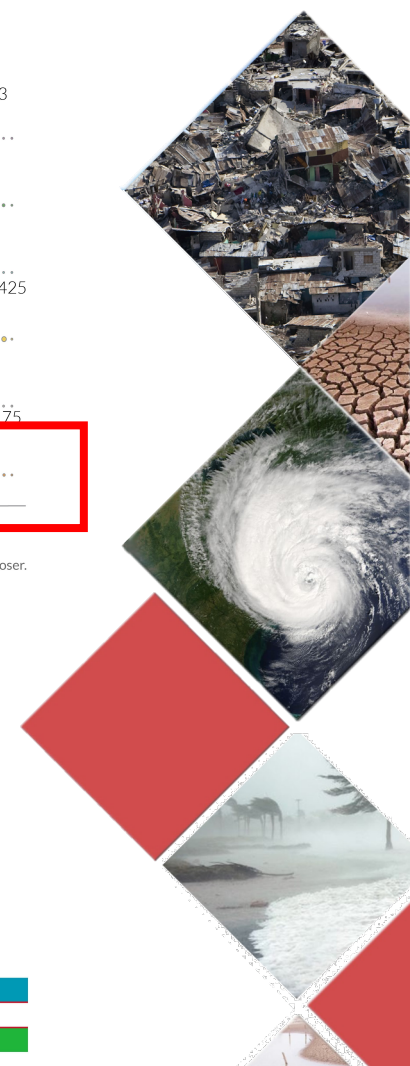
The size of the bubble represents the total death count per year, by type of disaster.

Our World in Data



Data source: EMDAT (2017): OFDA/CRED International Disaster Database, Université catholique de Louvain - Brussels - Belgium. OurWorldInData.org - Research and data to make progress against the world's largest problems.

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The Earthquake Impact

The earthquake main threat is related to the impossibility of structures (buildings, bridges, etc.) to withstand **extreme ground shaking**, and to a lesser extent to the occurrence of secondary phenomena (ground failure, tsunamis, etc.)



M6.5 Taiwan earthquake in 2016



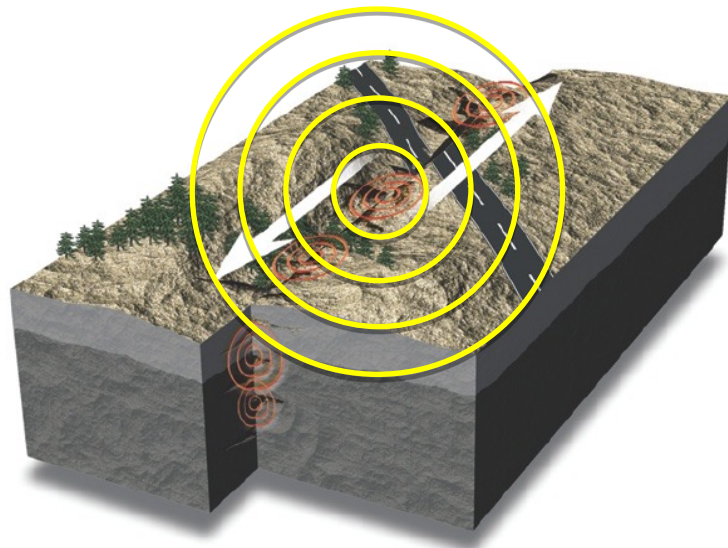
"Earthquakes don't kill people, collapsed buildings do so"



Defining the Expected Shaking Level

Reduction of losses should then be properly done by preemptive design and reinforcement of new and existing building and infrastructures.

This requires, however, a proper estimation of the **ground shaking level likely expected at a site, within a given interval of time**



<http://www.howitworksdaily.com/>

Question is: how and how precisely this level can be defined, given the (little) knowledge we have of the earthquake process?



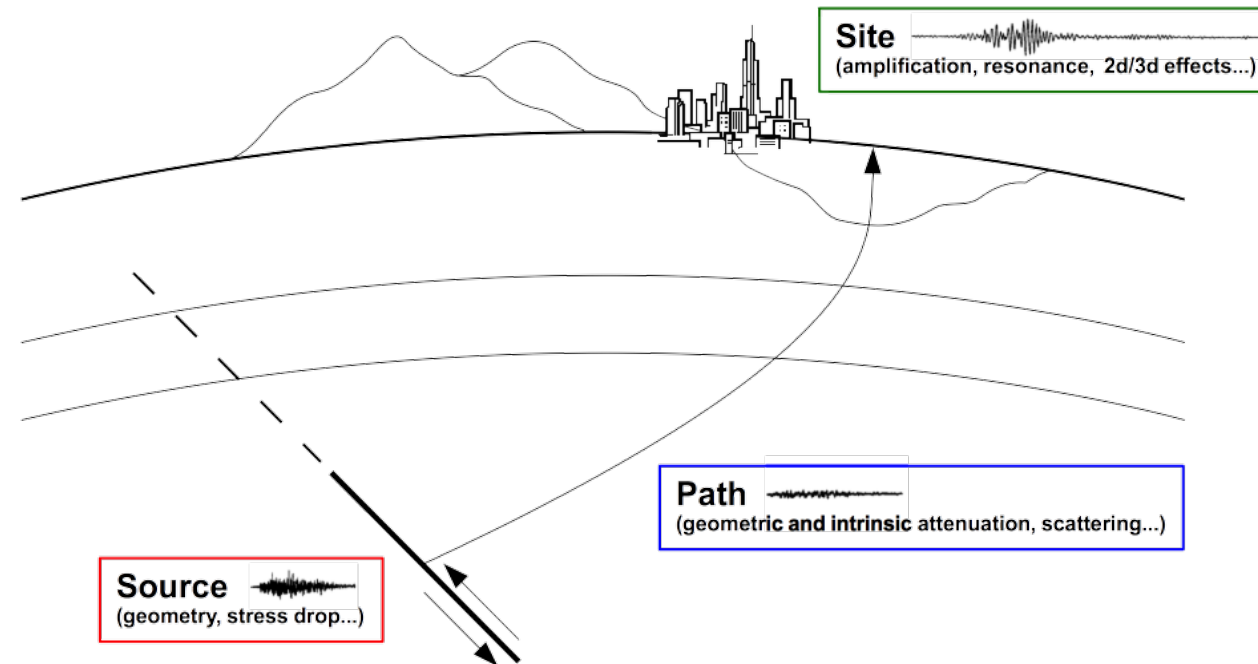
This is the task of
Seismic Hazard Analysis
(SHA)....



SHA Requirements

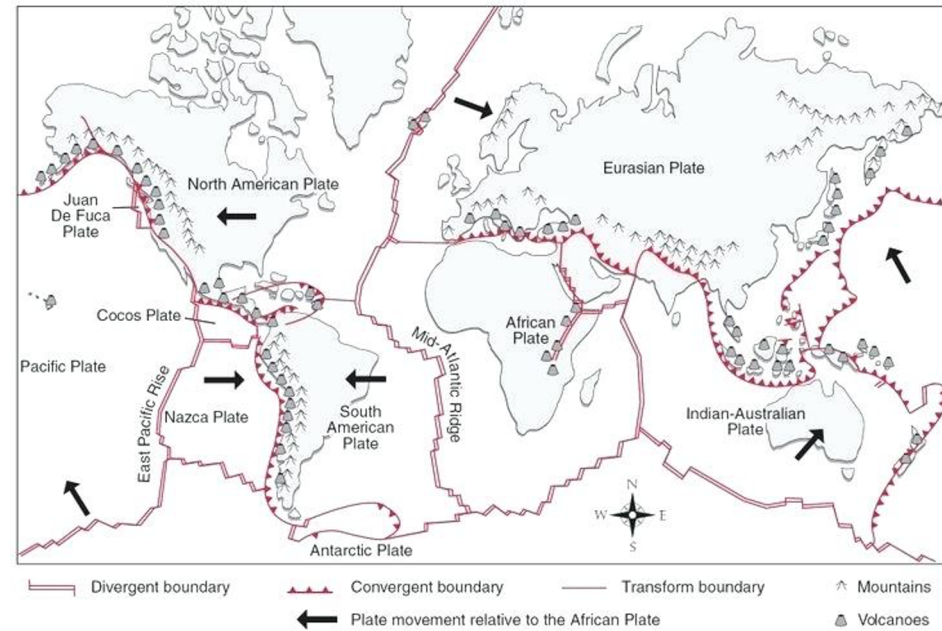
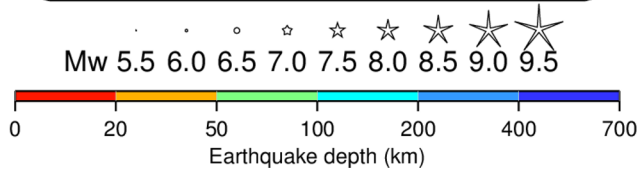
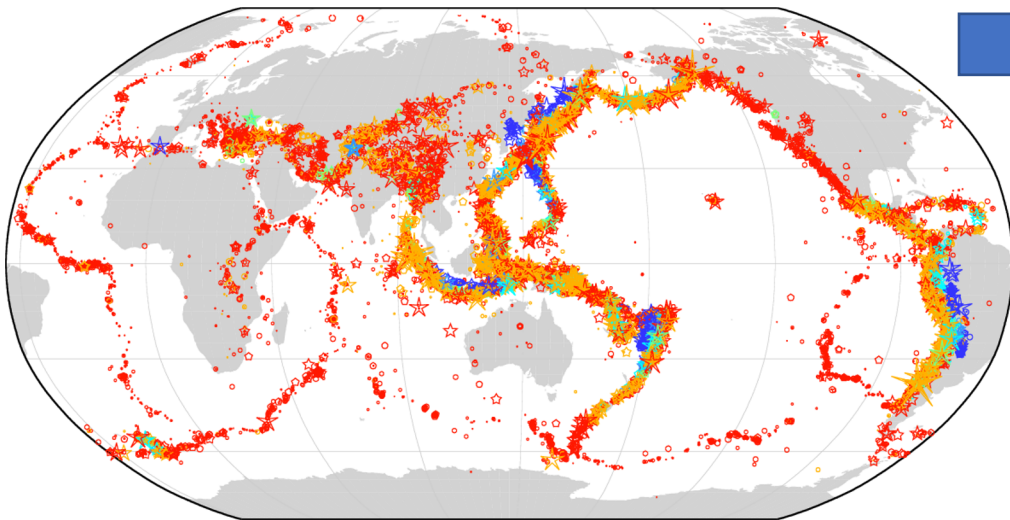
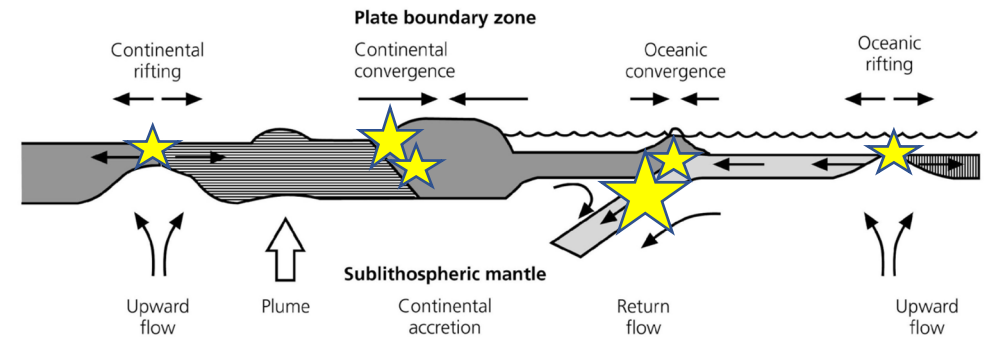
To assess the earthquake hazard associated to a region is essential to know:

- **Where** the earthquakes occur and the geometry of the seismic sources
- **When** (How often) earthquakes of given size occur at each seismic source
- **How** earthquakes propagate within the crust due to mechanical properties of geological materials (including surface geology)



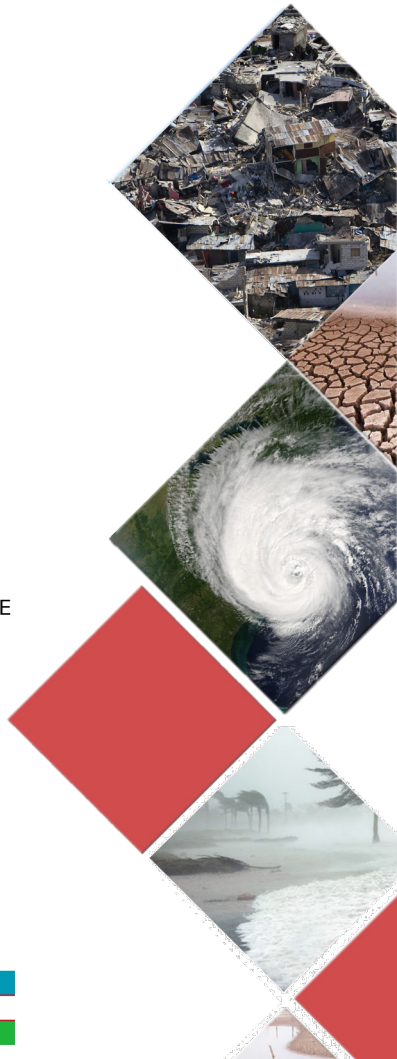
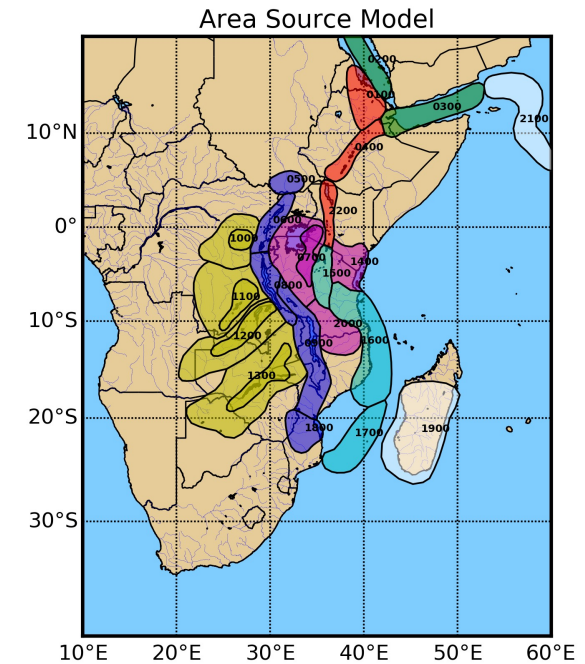
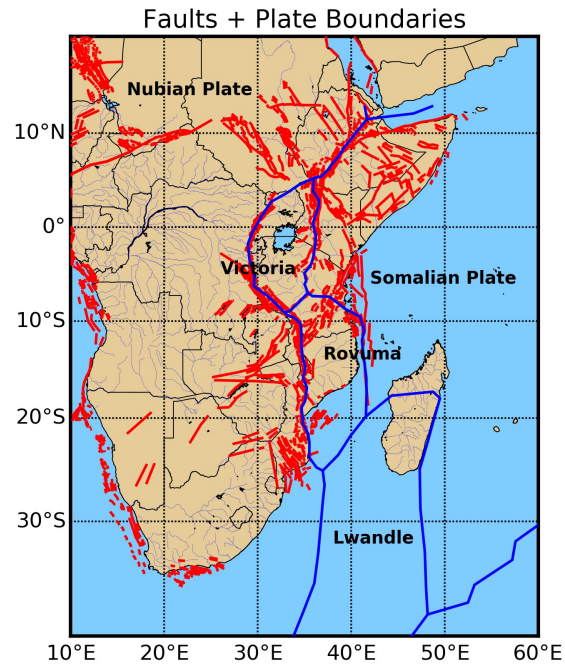
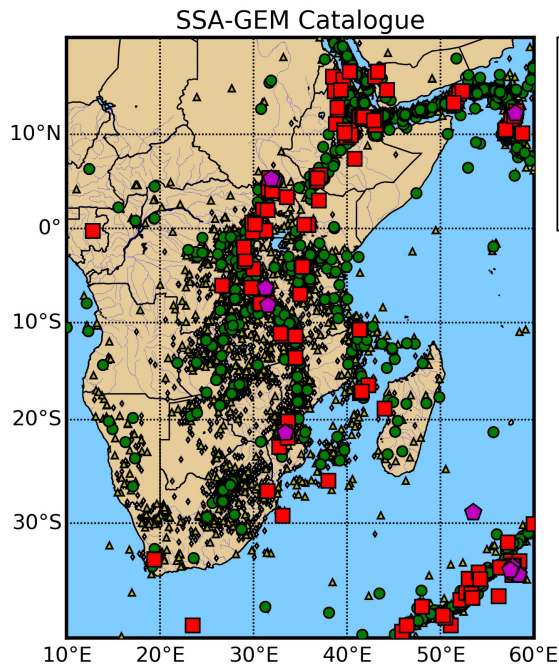
Where do Earthquakes Occur?

Earthquake activity is not distributed uniformly around the world. It is mainly confined to relatively narrow bands of intense seismicity on **“active” tectonic margins**.



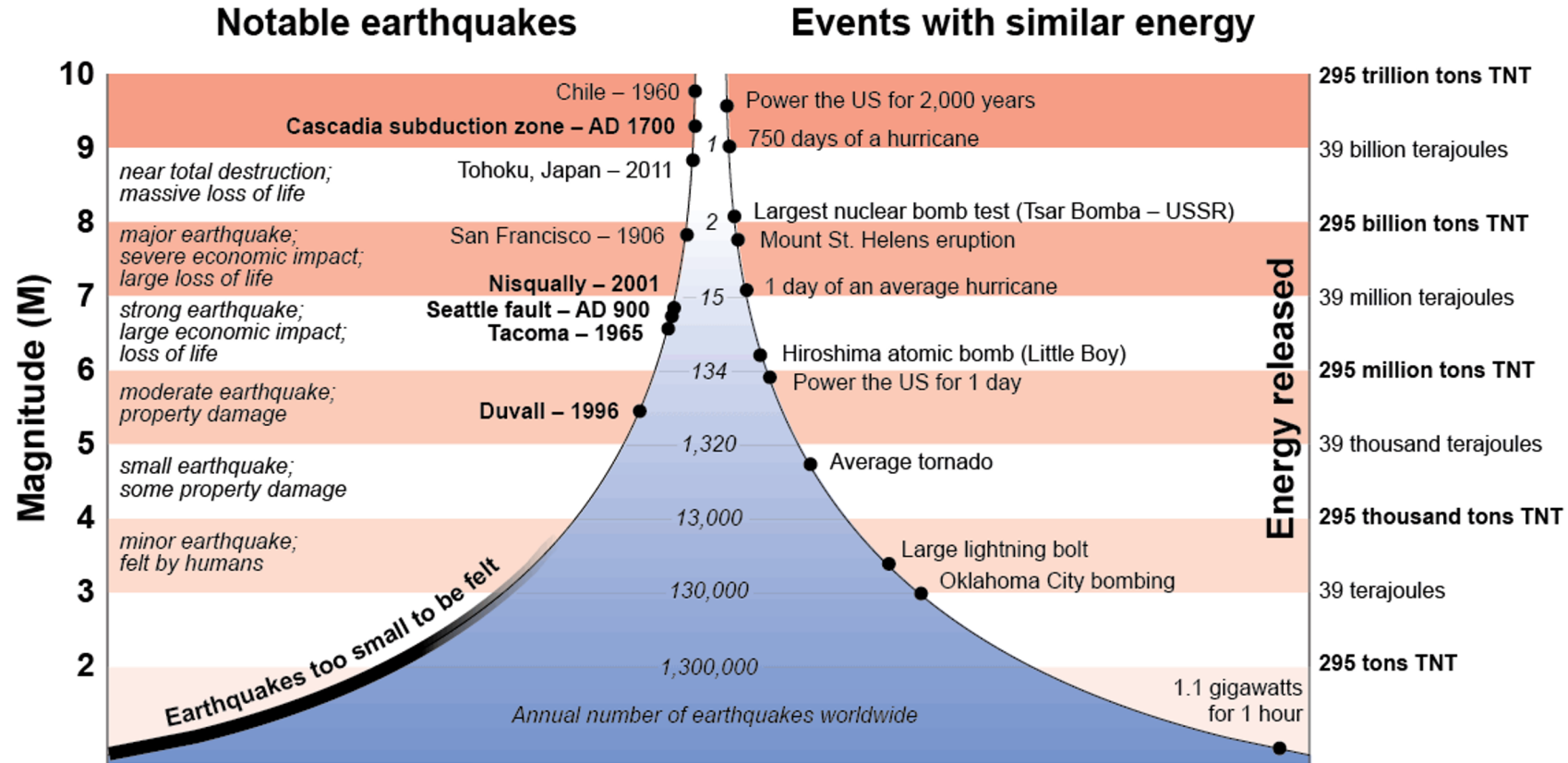
Where do Earthquakes Occur?

On a smaller spatial scale, earthquake seismicity is organized often in patterns, so that areas of different “productivity” can be discriminated on the base of the historical earthquake log (**the seismic catalogue**).

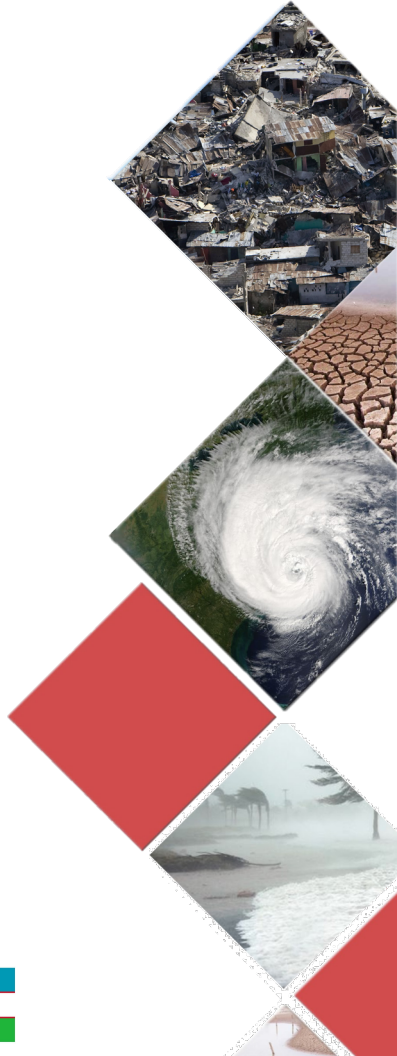


Energy and Occurrence

Earthquake energy and frequency



Earthquake data and frequency from USGS at <http://earthquake.usgs.gov/earthquakes/eqarchives/year/eqstats.php>
 Energy released and events from <http://alabamaquake.com/energy.html> and [http://en.wikipedia.org/wiki/Orders_of_magnitude_\(energy\)](http://en.wikipedia.org/wiki/Orders_of_magnitude_(energy))



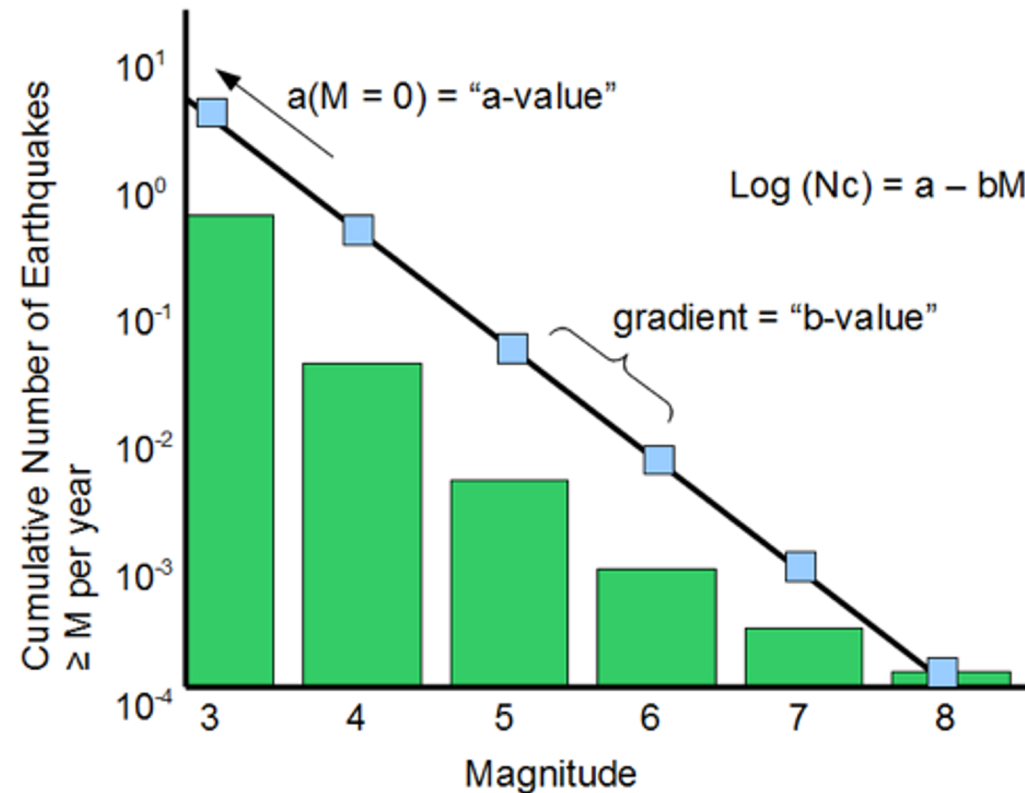
Gutenberg-Richter Occurrence Relation

Gutenberg and Richter observed in 1944 that the **cumulative number of earthquakes** (per unit time) usually scales linearly with magnitude (M_L), according to the law:

$$\log_{10}(N_c) = a - bM_L$$

a = intercept, represents the seismic productivity of the region (at $M=0$)

b = slope, represents the relative proportion between small and large event

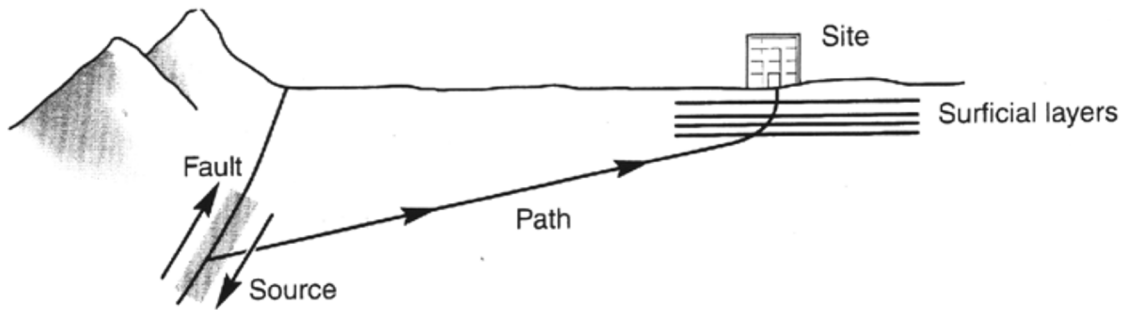


Predicting Ground Motion

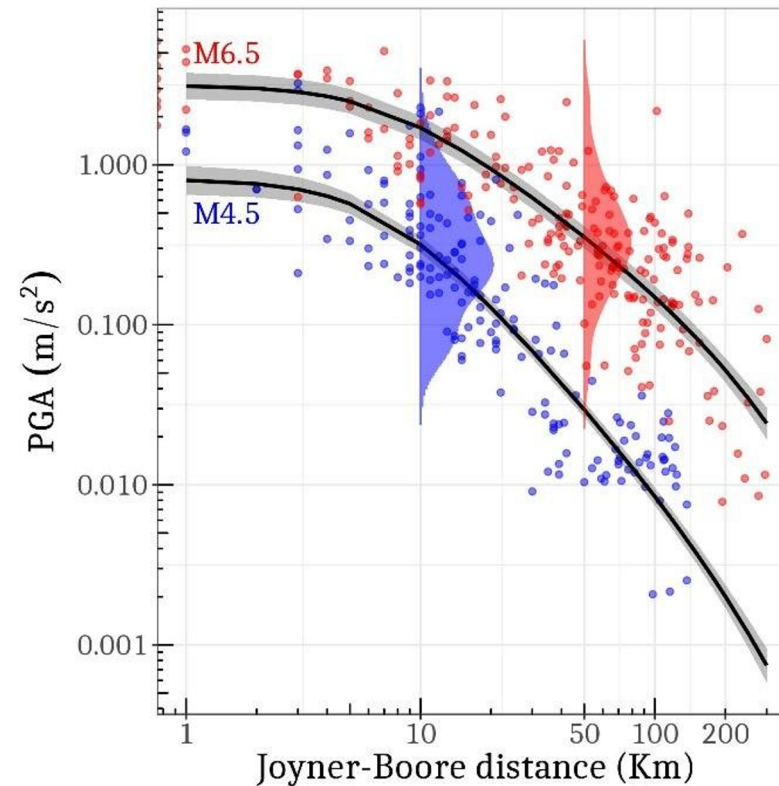
Ground Motion Prediction Equations (GMPEs) are the simplest **empirical** (and in few cases analytical) answer to the following question:

“If we know where a major earthquake is likely to occur, how large will the ground motion be at a particular site?”

$$\text{GM Amplitude} = \text{Source term} * \text{Path term} * \text{Site term}$$



$$\log(Y) = f(M, \Delta, \dots) + E$$



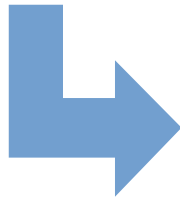
GMPE Functional Form

The functional form of empirical ground motion model is created following physical principles i.e. trying to reproduce the basic physics of the process.

Here is an “simple” example:

$$\log(Y) = c_0 + c_1M + c_2M^2 + c_3 \log\left(\sqrt{(R^2 + h^2)}\right) + \sigma$$

$$\sigma = \sqrt{\tau^2 + \phi^2}$$

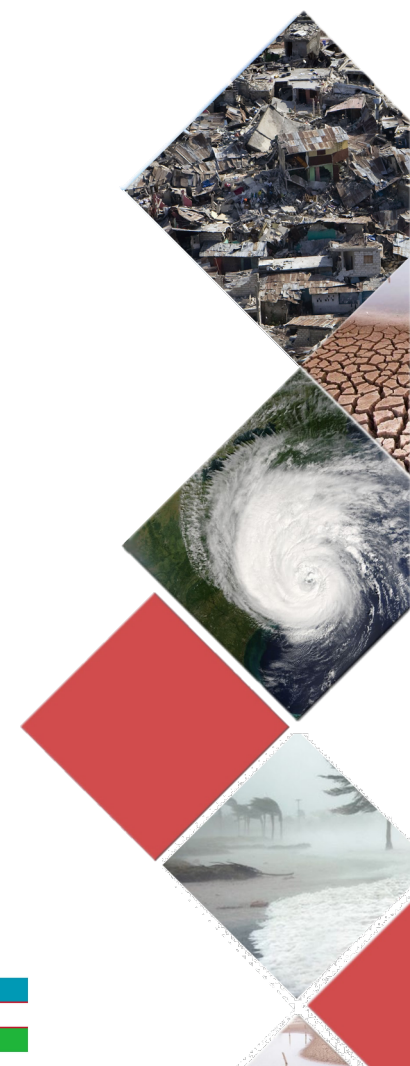


Different set of coefficients are defined for each ground motion measure type (PGA, SA...).

Table 2
Coefficients of Equation (1)

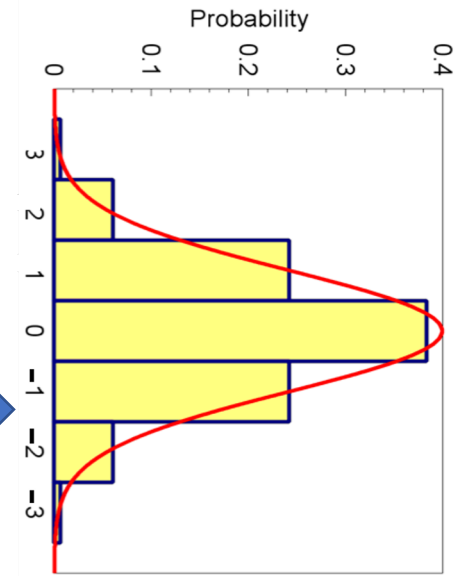
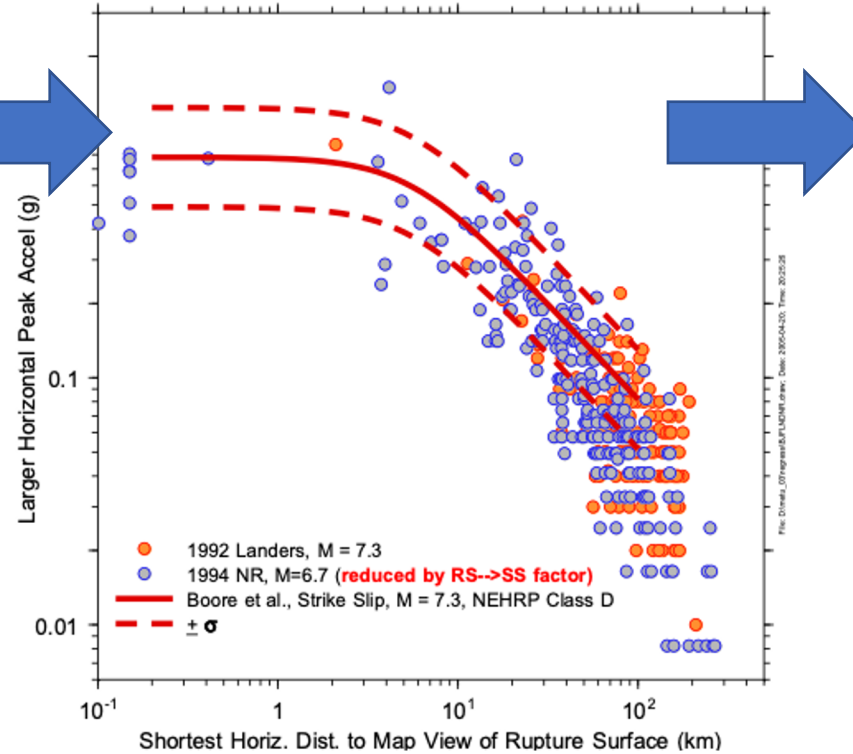
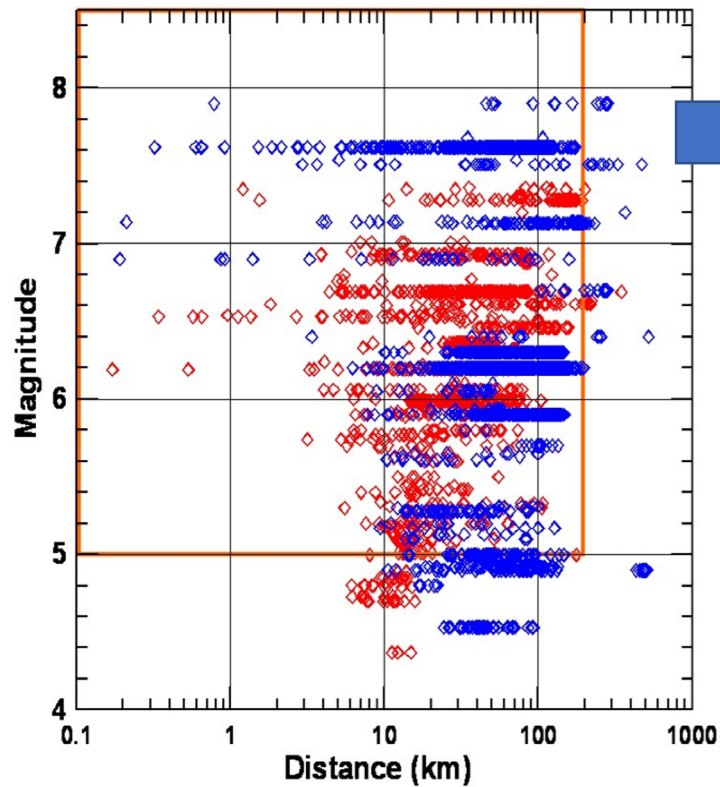
PSA at Frequency	c_0	c_1	c_2	c_3	σ -intra	σ -inter	σ -total
0.2	-4.374	1.134	0.0038	-1.426	0.26	0.17	0.31
0.33	-3.869	1.110	0.0039	-1.447	0.25	0.21	0.33
0.5	-4.503	1.532	-0.0430	-1.404	0.25	0.22	0.33
1	-2.009	1.890	-0.1248	-1.828	0.27	0.21	0.34
2	-4.128	1.792	-0.0791	-1.526	0.30	0.19	0.35
3.33	-2.076	1.889	-0.1257	-1.886	0.31	0.18	0.36
5	-3.918	2.112	-0.1266	-1.591	0.31	0.20	0.37
10	-2.839	1.905	-0.1134	-1.658	0.30	0.25	0.39
20	-2.337	1.902	-0.1252	-1.838	0.29	0.29	0.41
33	-2.313	1.840	-0.1119	-1.708	0.29	0.26	0.39
PGA	-2.427	1.877	-0.1214	-1.806	0.29	0.24	0.37
PGV	-4.198	1.818	-0.1009	-1.721	0.28	0.18	0.33

Equation (1) predicts 5% damped horizontal-component pseudospectral acceleration (PSA, in cm/s^2) for B/C site conditions, peak ground acceleration (PGA, in cm/s^2), and peak ground velocity (PGV, in cm/s). The standard deviation of residuals (σ -total) and its intraevent and interevent components are also given.



GMPE Calibration and Uncertainty

Relation calibration is done on large datasets of earthquake waveforms covering sufficient magnitude and distance ranges. Uncertainty is assumed log-normally distributed.



Deterministic vs Probabilistic

Two are the main methodologies currently adopted for seismic hazard analysis:

Deterministic. Also called the **“Worst Case Scenario”**

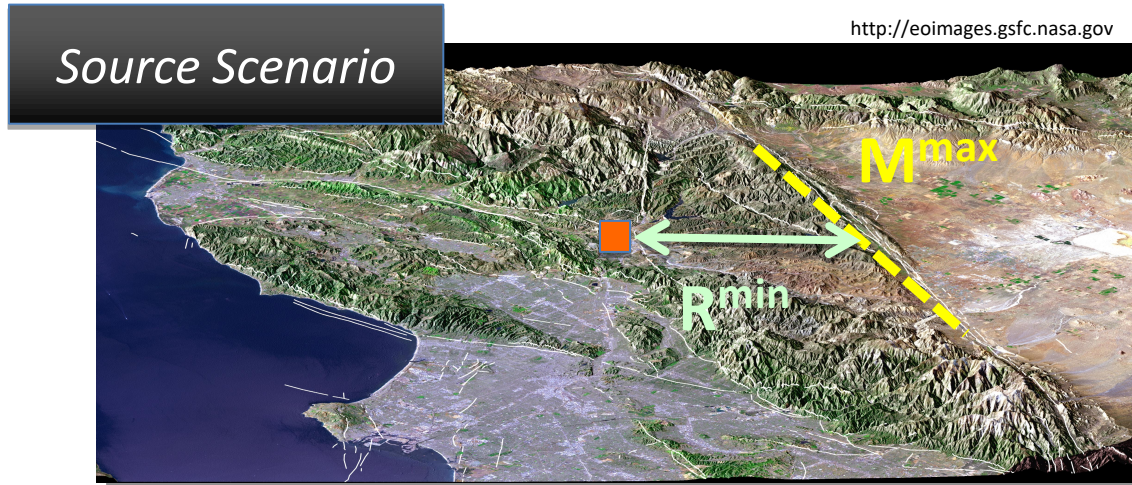
One or a few earthquake potential scenarios are selected, and the corresponding ground motion computed assuming a level of uncertainty on ground motion (i.e., a number of standard deviations above the median value predicted by a Ground Motion Prediction Equation - GMPE).

Probabilistic: **All possible scenarios** of engineering relevance for the investigated site are considered in the analysis, considering their probability of occurrence i.e., all ruptures (magnitude + distance) and levels of uncertainty on ground motion.

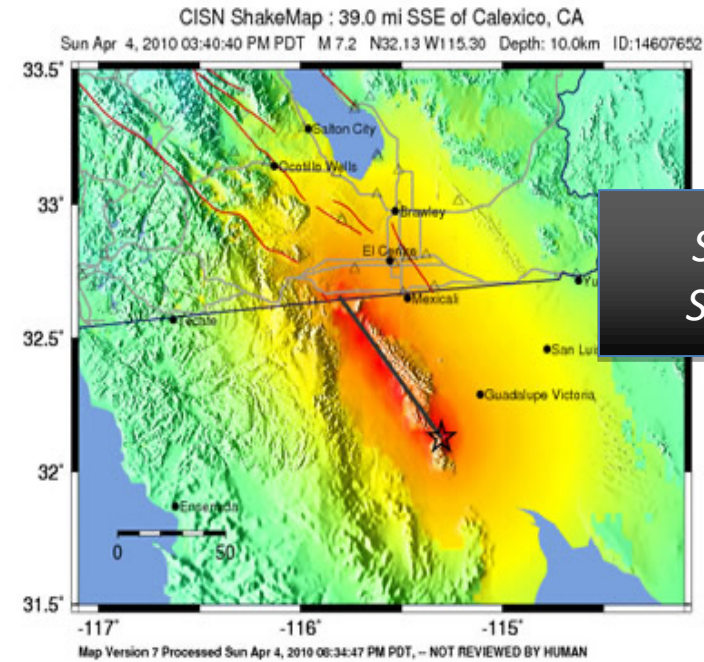
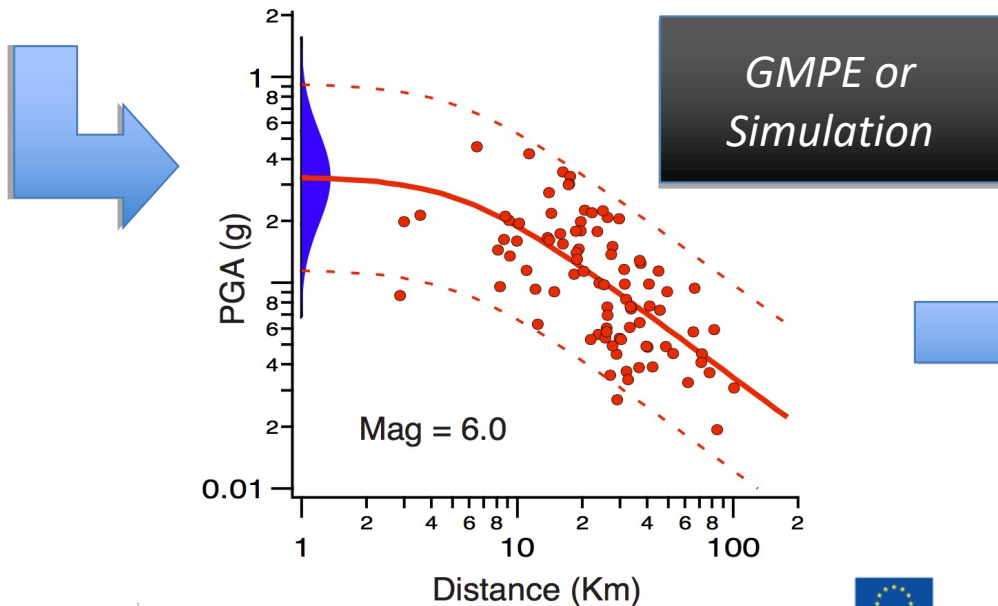


Scenario Based Approach

- 1) Select one or more sources through specific magnitude and distance combinations
- 2) Compute expected ground motion (accounting for variability)

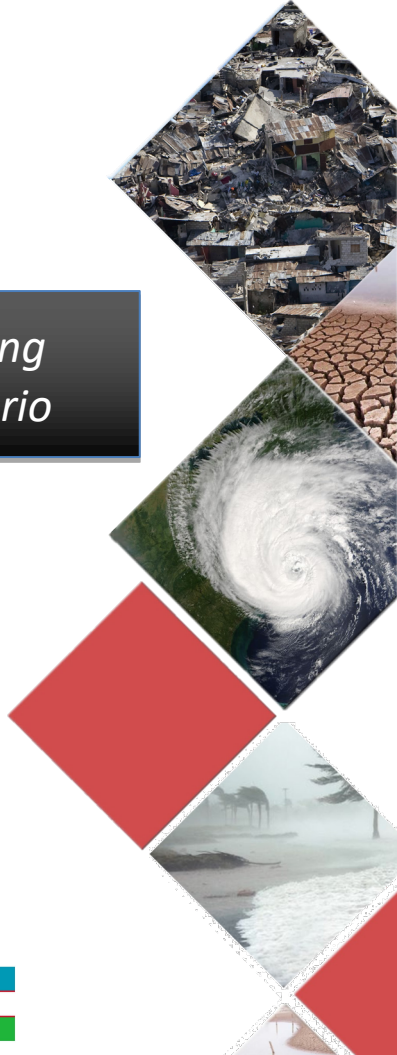


Modified from Field (USGS)



Shaking Scenario

PERCEIVED SHAKING	Not felt	Weak	Light	Moderate	Strong	Very strong	Severe	Violent	Extreme
POTENTIAL DAMAGE	none	none	none	Vary light	Light	Moderate	Moderate/Heavy	Heavy	Very Heavy
PEAK ACC.(g)	<.17	.17-1.4	1.4-3.9	3.9-9.2	9.2-18	18-34	34-65	65-124	>124
PEAK VEL.(cm/s)	<0.1	0.1-1.1	1.1-3.4	3.4-8.1	8.1-18	18-37	37-60	60-116	>116
INSTRUMENTAL INTENSITY	I	II-III	IV	V	VI	VII	VIII	IX	X+



Defining a Reasonable Scenario... ?

Note that worst-case ground motion is generally **NOT** selected in deterministic approach.

Combing largest earthquake with the worst-case ground motion is too unlikely a case:

→ The occurrence of the maximum earthquake is **rare**, so it is not “reasonable” to use a worst-case ground motion for this earthquake. Chose something smaller than the worst-case ground motion that is “reasonable”, but reasonable is of difficult quantification.

→ What if several sources are present? Is the closest source always the most dangerous?

→ **There is clear need to account for spatial-temporal variability and to evaluate ground motion exceedance!**



This is done in Probabilistic Seismic Hazard Analysis (PSHA)....

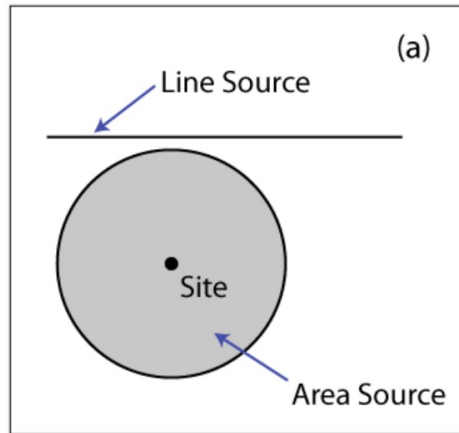


Probabilistic Seismic Hazard Analysis

The probability that a certain ground motion level will be exceeded in a given time interval is computed by considering the earthquake scenarios generated by all potential sources within a certain distance range from the investigated site.

Where

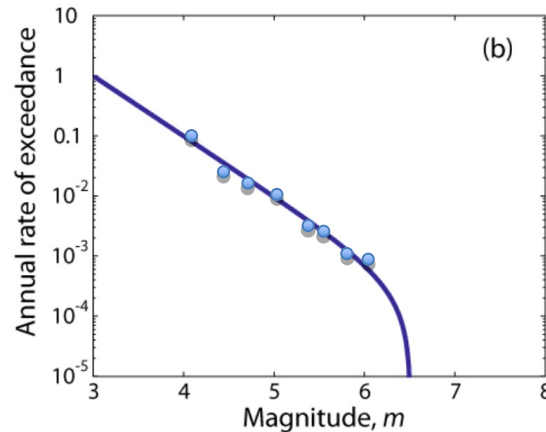
Seismogenic Models



Modified from Baker (2008)

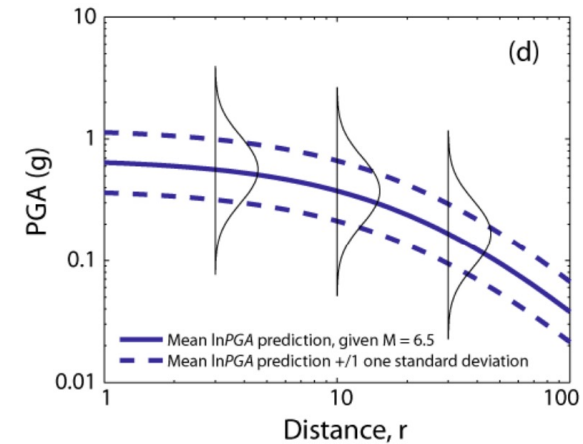
When (how often)

Recurrence Models



How (strong)

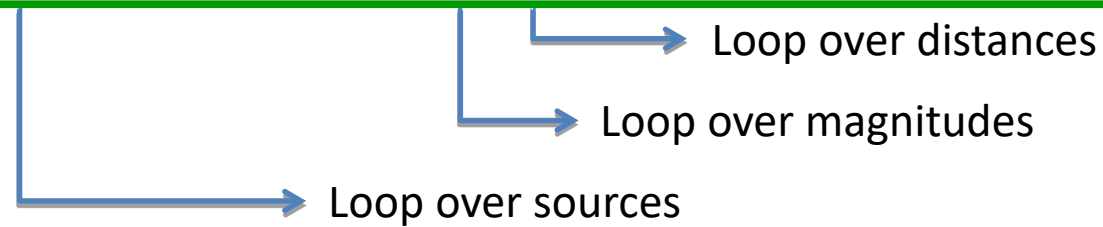
Ground Motion Models



The Earthquake Hazard Integral

The rate λ of events with intensity (IM) larger than a value x experienced at a given site from the contribution of all sources can be formalized as:

$$\lambda(\text{IM} \geq x) = \sum_{i=1}^{n_{\text{sources}}} \lambda(m_i \geq m_{\min}) \int_{m_{\min}}^{m_{\max}} \int_{r_{\min}}^{r_{\max}} \underbrace{P(\text{IM} \geq x | m, r)}_{\text{red}} \underbrace{f_{M_i}(m)}_{\text{blue}} \underbrace{f_{R_i}(r | m)}_{\text{green}} dm dr$$



$\lambda(m_i \geq m_{\min})$ = the rate of occurrence greater than m_{\min}

$f_{M_i}(m)$ = the PDF of the magnitude distribution

$f_{R_i}(r | m)$ = the PDF of distance, conditional to magnitude m

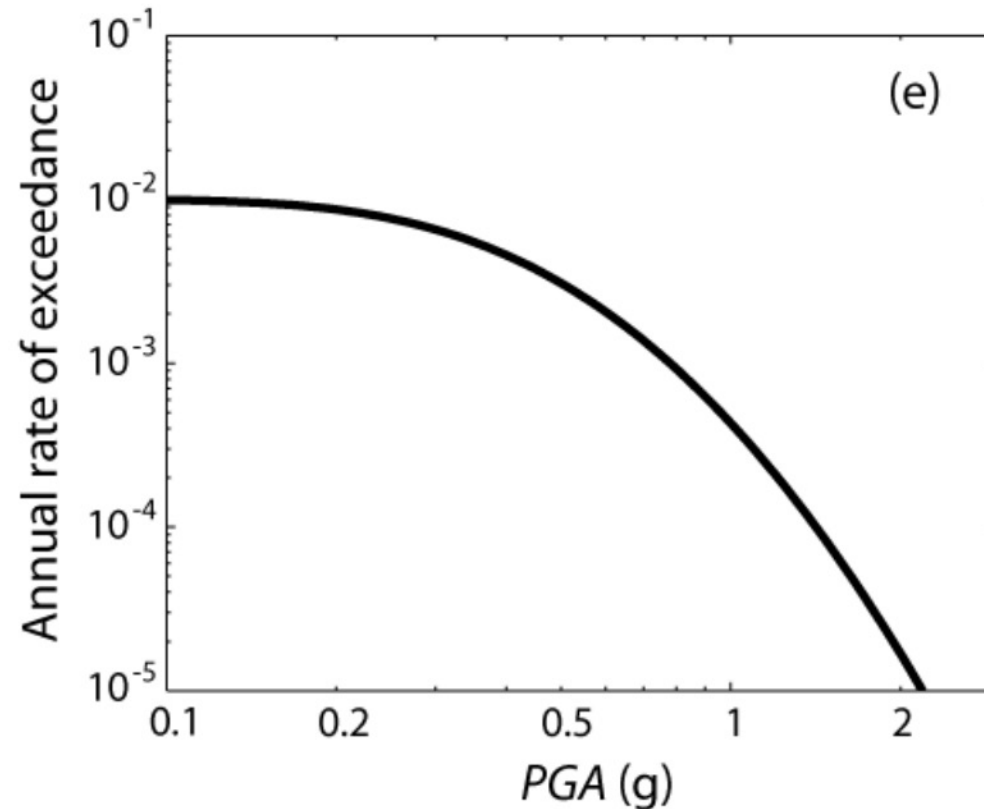
$P(\text{IM} \geq x | m, r)$ = the probability of exceeding an IM level, given m and r



PSHA Output: Hazard Curves

Using this equation, the annual rate λ of exceedance is computed for a range of intensity measures (IM) to produce hazard curves. Inverse of λ is defined the average return period.

The hazard curves are subsequently translated into probability by using a **Poisson recurrence model** (assuming independent events)



Poisson Process

Poisson process - describes the probability that a given number of events (n) with a known constant mean rate (λ) will occur in a given time interval (t), assuming that:

- The number of occurrences in one time interval are independent of the number that occur in any other time interval;
- Probability of occurrence in a very short time interval is proportional to length of interval;
- Probability of more than one occurrence in a very short time interval is negligible.

$$P(N = n|t) = \frac{(\lambda t)^n e^{-\lambda t}}{n!}$$

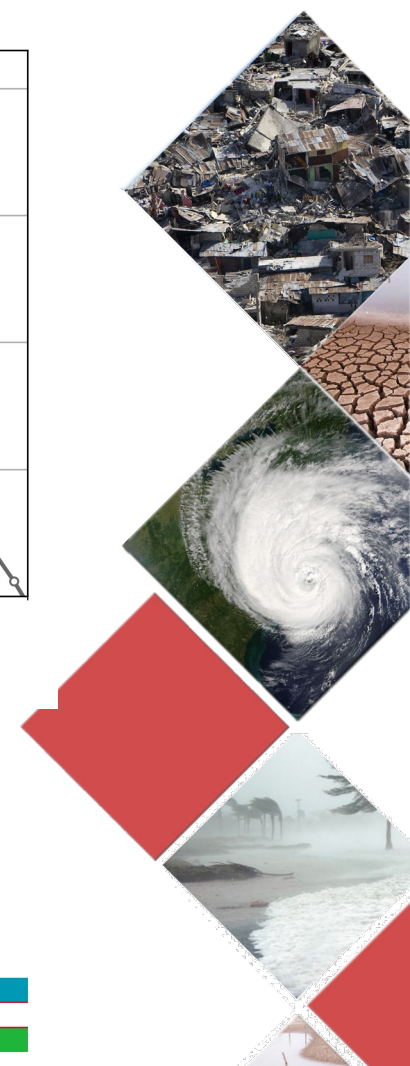
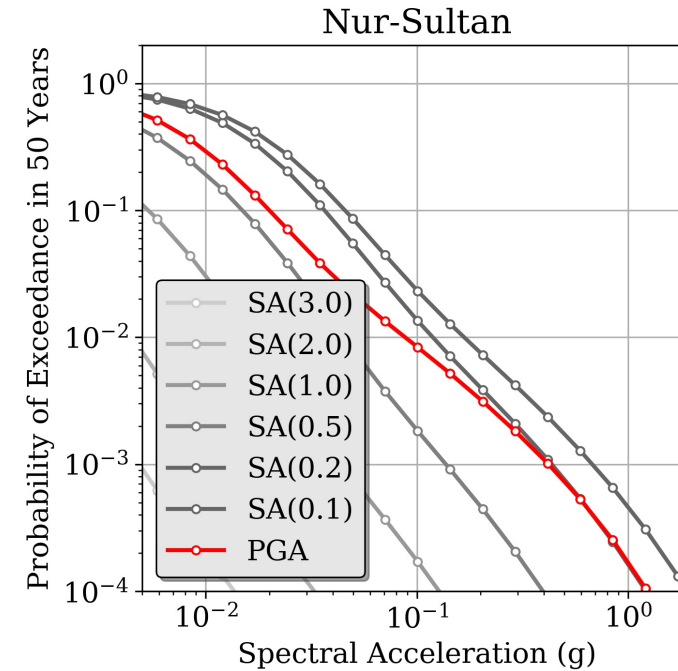
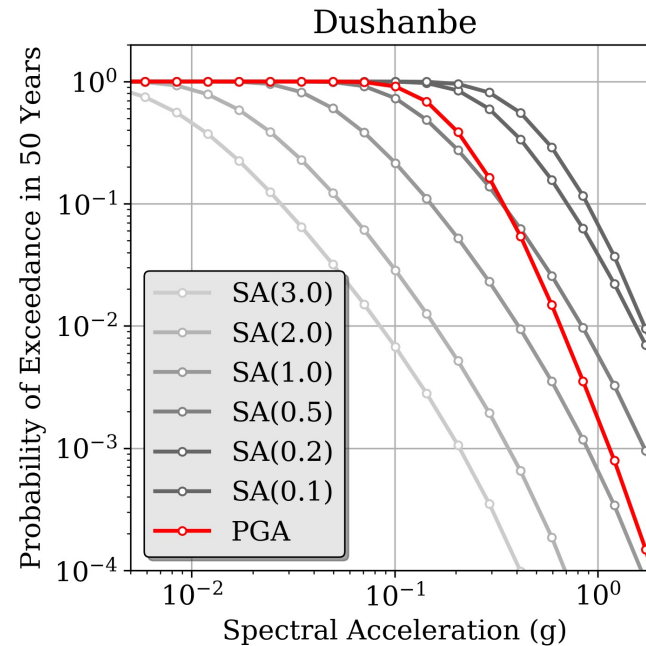
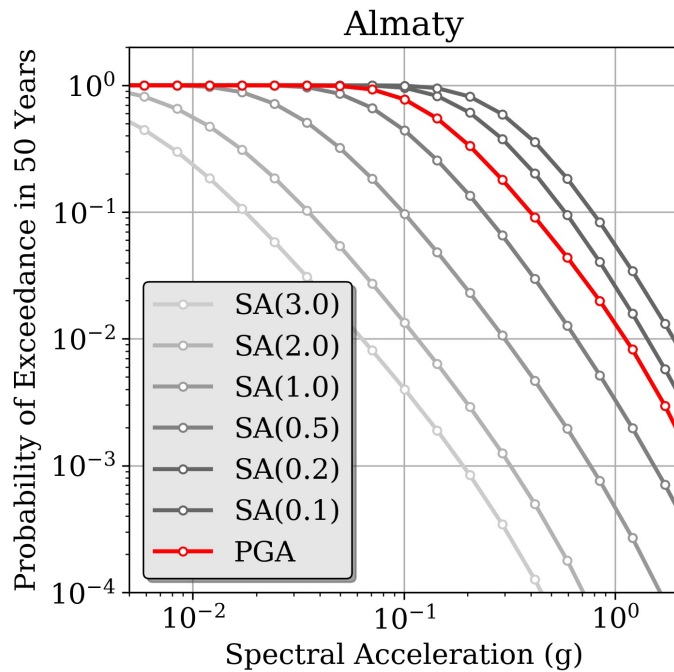
The probability of “at-least” one occurrence in time t (**observation time**) is then expressed as the total probability (1) minus the probability of no successful events (0):

$$P(N \geq 1|t) = 1 - P(0) = 1 - e^{-\lambda t}$$



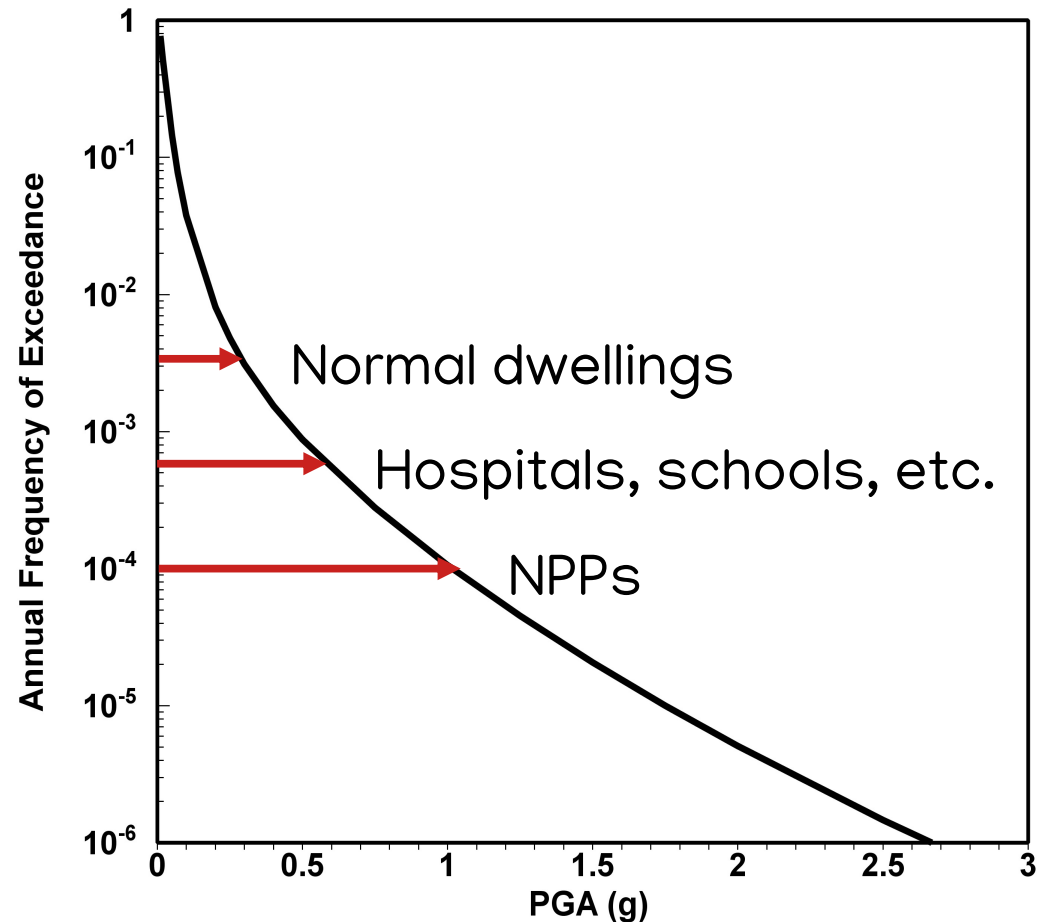
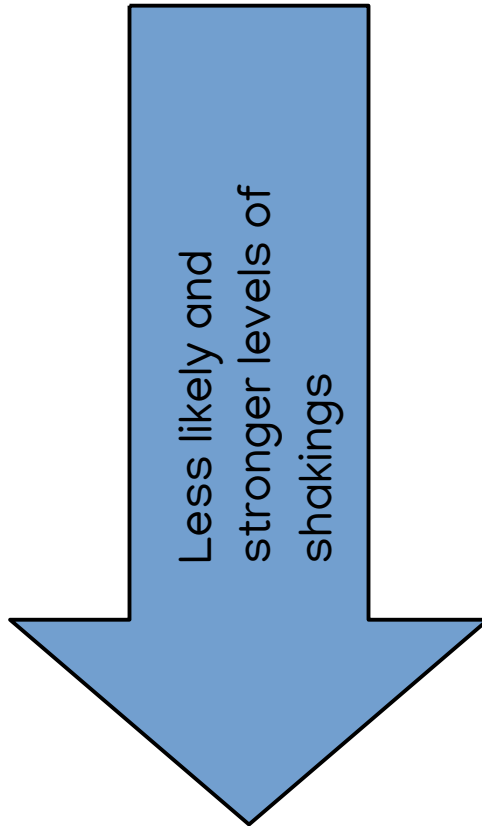
Hazard Curves in Probability of Exceedance

The Poisson assumption is used to convert the output of the hazard integral from rate λ of events to probability.



Which Probability of Exceedance?

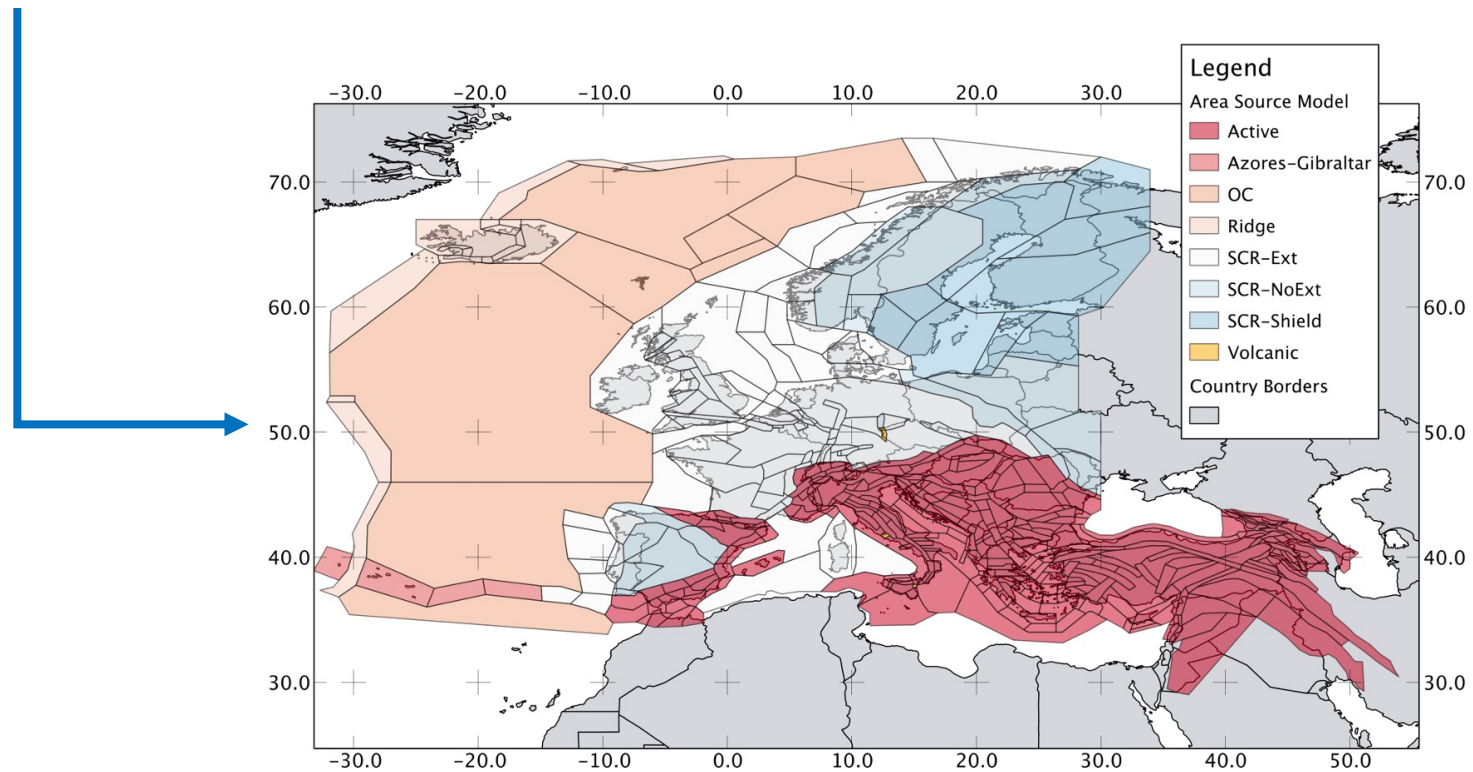
Normative and building codes usually consider a selected number of probability of exceedance (PoE), which is representative of the ground shaking potentially hazardous for different structure typologies.



Seismogenic Source Model

Distributed Seismicity:

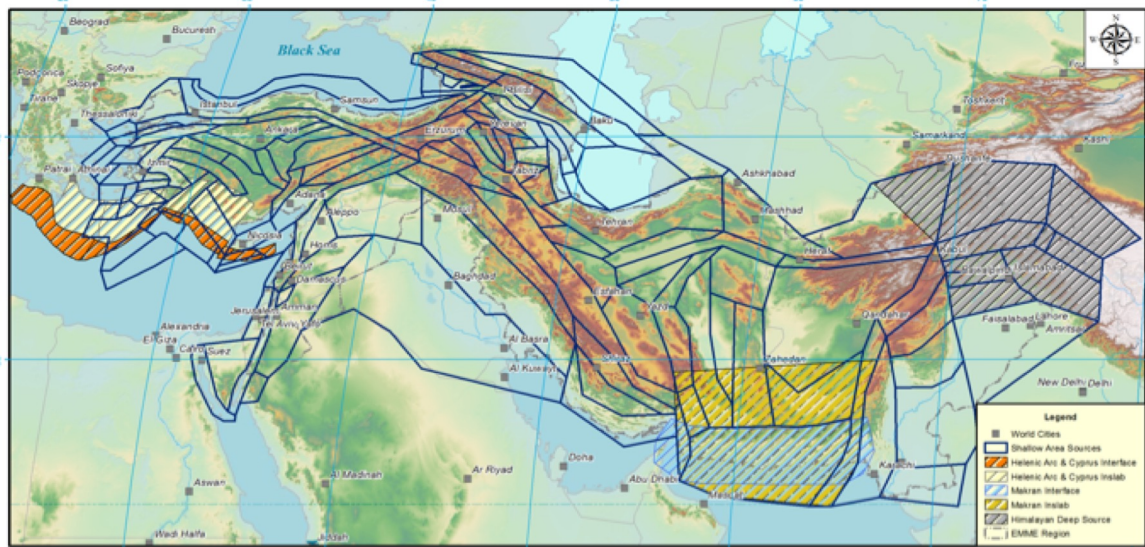
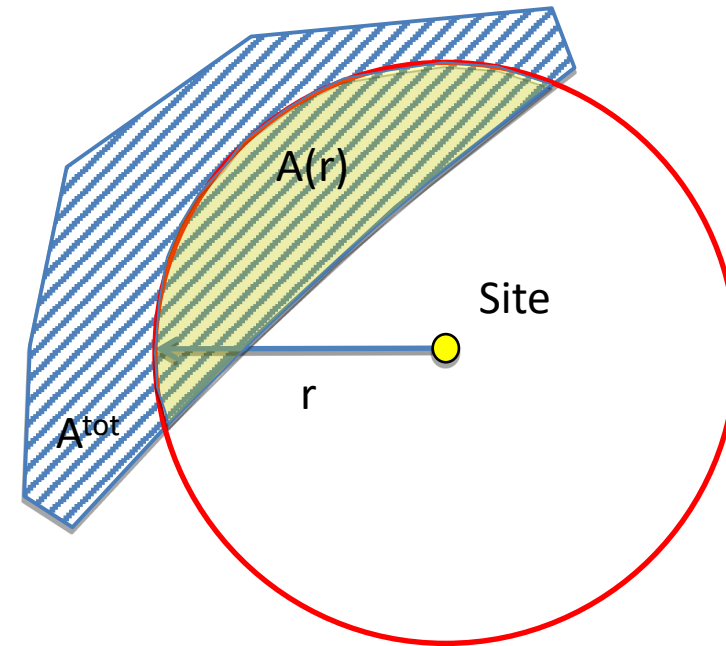
- Single points
- Line sources
- Grid representations (e.g., smoothed seismicity)
- Polygon of Uniform Seismicity (so far, the most widely used approach)



The Homogenous Area Source Zonation

In **homogenous area source zonation**, observed seismicity is assumed to have equal probability to occur anywhere within the area.

Source Zone

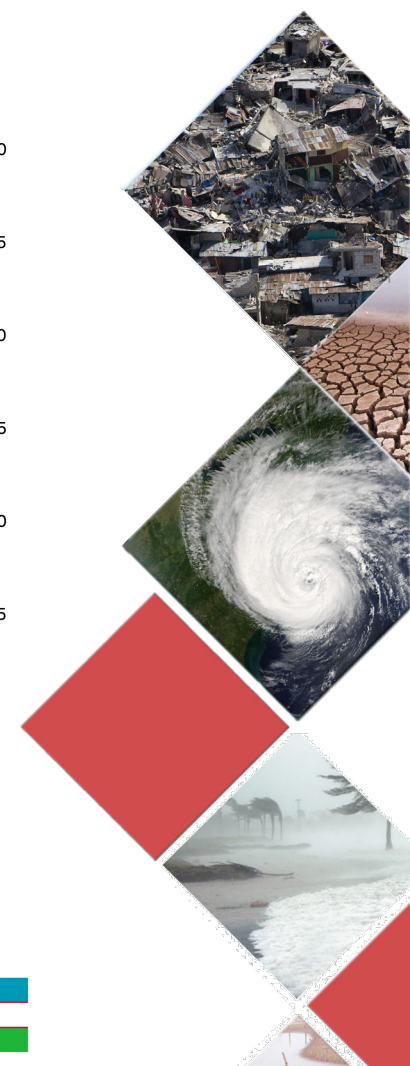
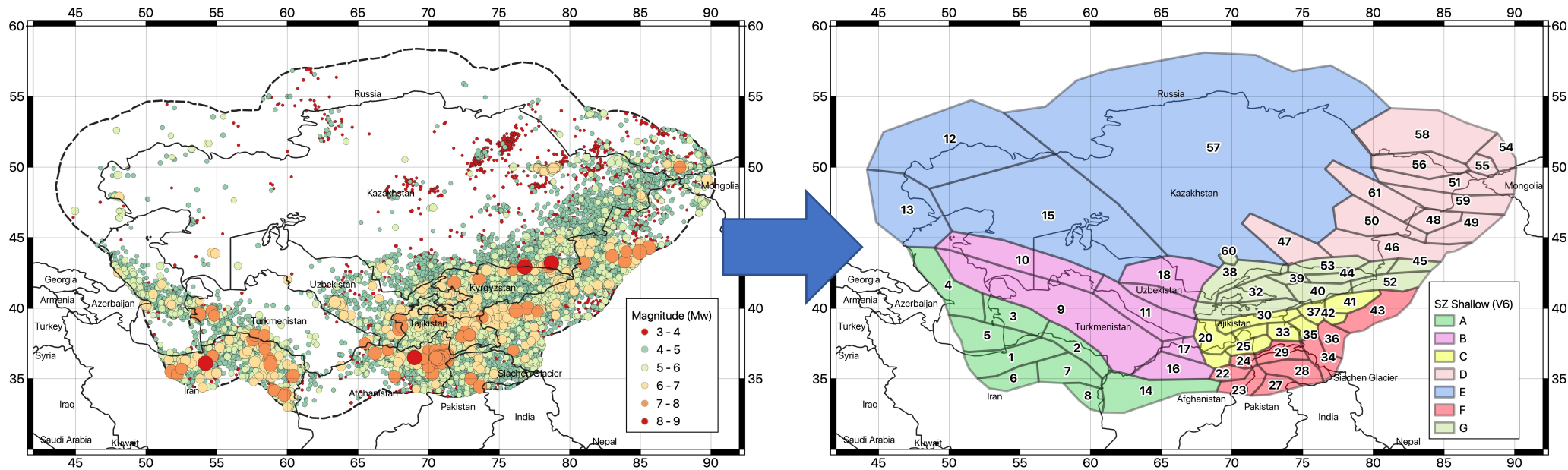


EMME Area Source Model



The Homogenous Area Source Zonation

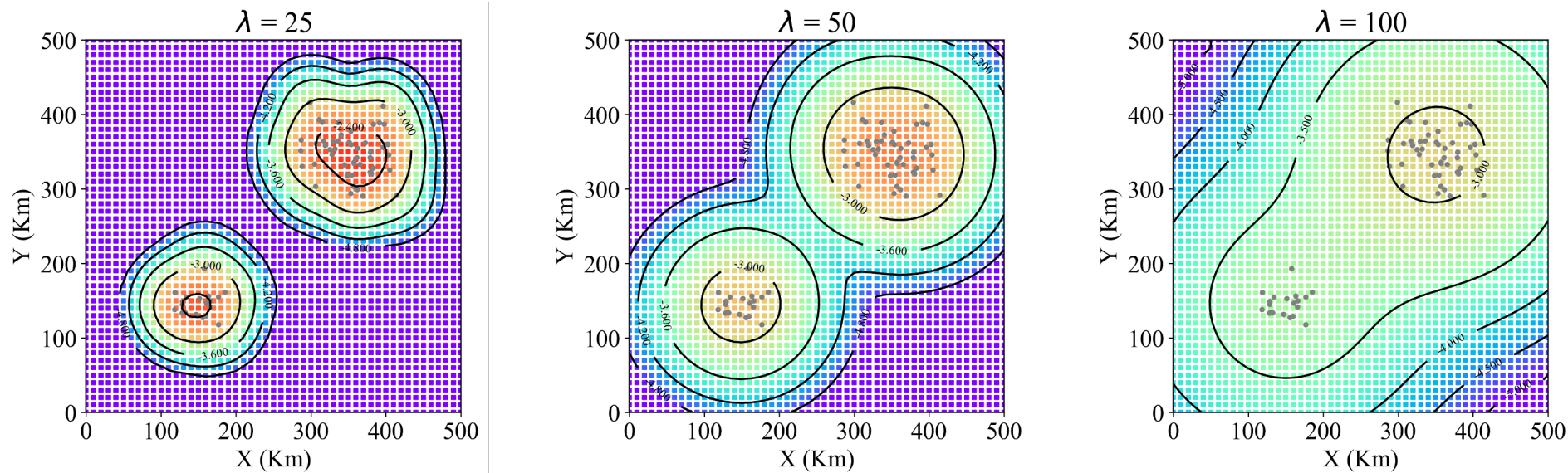
Zones are defined on the base of the observed seismicity and the available geological and seismotectonic information for the area.



Smoothed Seismicity Model

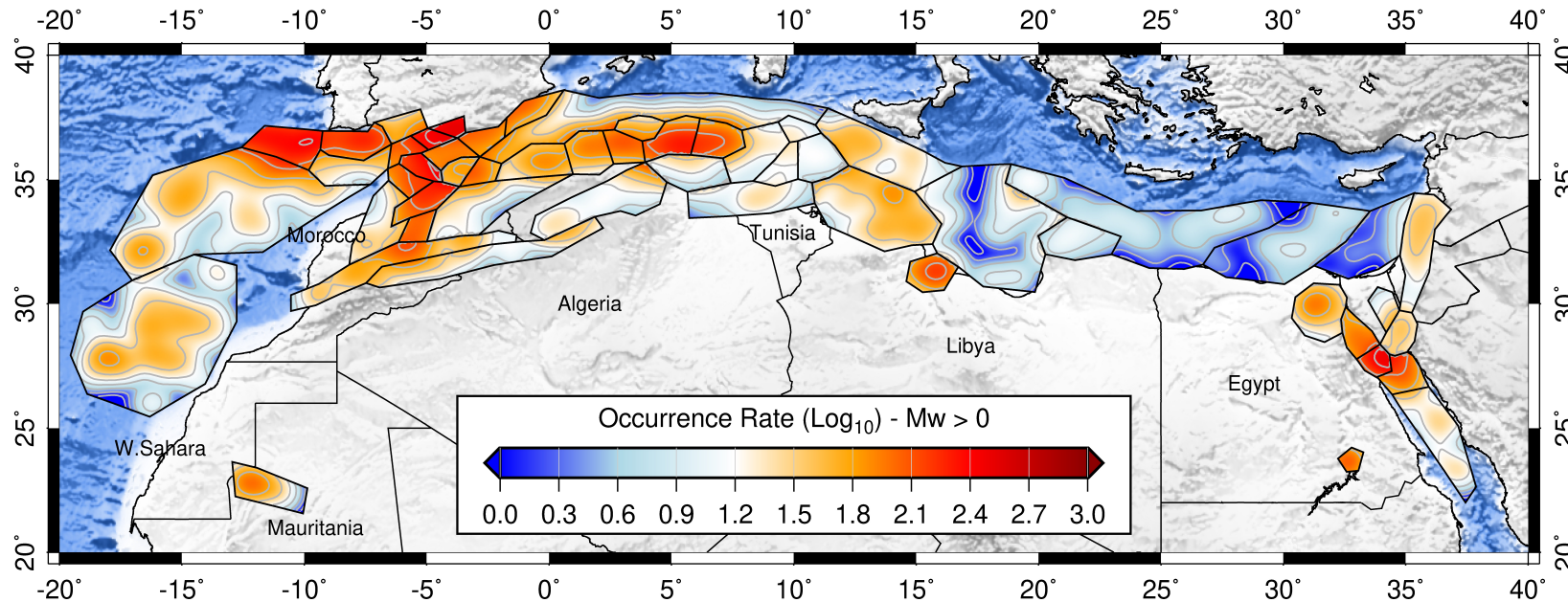
The homogenous area source zonation approach may not be appropriate for regions where seismicity is known to be spatially localized.

A smoothed source model can be used instead, where occurrence rates of each homogenous zone are spatially reorganized on a grid of point sources, weighted according to the spatial density of nearby events.



Smoothed Seismicity Model

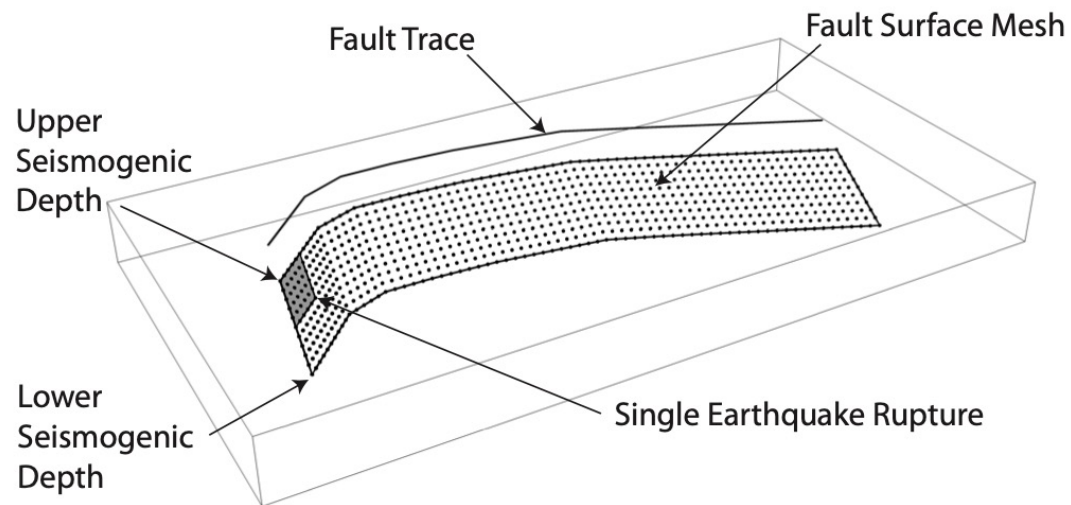
The smoothing approach produces a more realistic spatial source pattern but, heavily relying on the location of past known events, is on the contrary less effective in depicting future events happening in mismatching locations.



Finite Fault Model

Complementary to the distributed seismicity, the **direct modelling of finite faults** has the advantage of better representing ground motion in the source near field.

However, this is possible if enough information (fault geometry, kinematic parameters, displacement rates) is available for the investigated area with sufficient reliability.

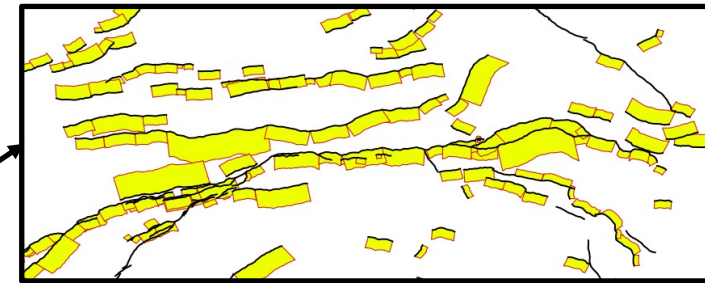
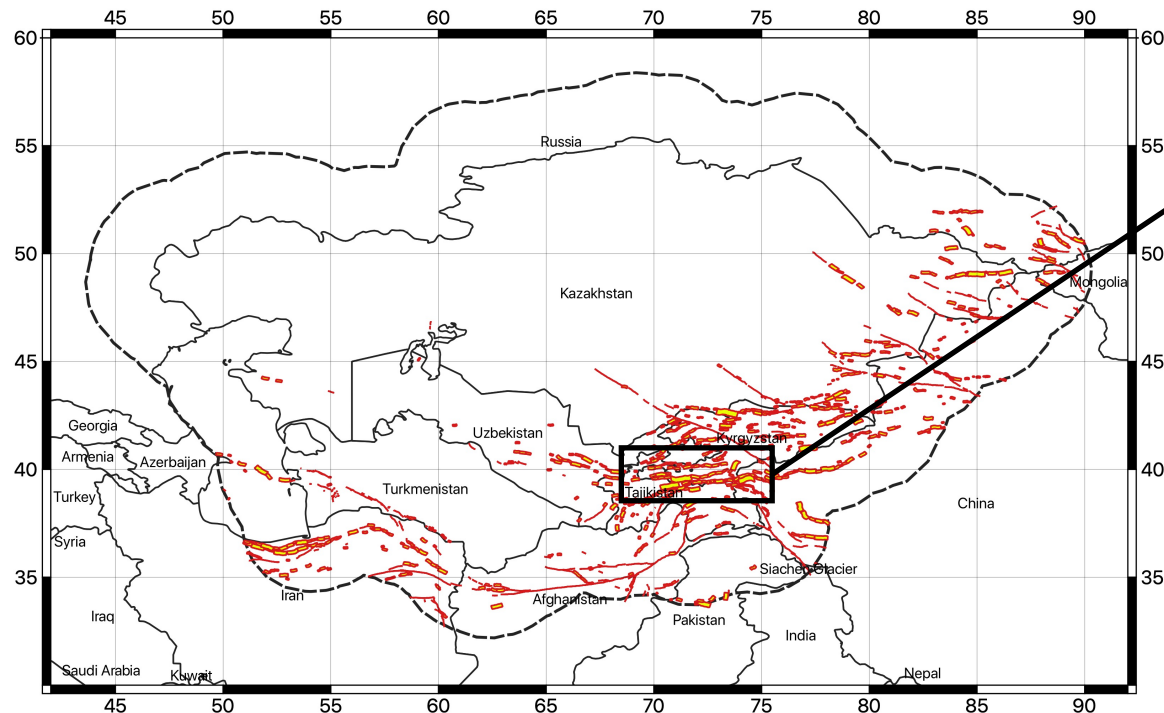


modified from "the OpenQuake-engine book: underlying hazard science"



The Fault Source Model

Occurrence rates of each fault can be derived from observed seismicity or from **slip rate estimates**, by balancing the scalar seismic moment accumulation from the integral of the incremental MFD through a direct fitting procedure.



This provides a complementary mean of evaluating source productivity for the very low return periods.



Variability and Uncertainty

Uncertainty and variability are concepts tightly linked with seismic hazard analysis

Two are the typologies of uncertainty considered:

- *Aleatory*
- *Epistemic*



Aleatory uncertainty relates to the intrinsic randomness and the nature of the earthquake process

Epistemic uncertainty on the contrary depends on our limited knowledge the phenomenon (e.g., lack of observation data)

This means that: aleatory uncertainty is irreducible whereas epistemic uncertainty can be potentially reduced



Variability and Uncertainty

Epistemic and aleatory variability are nonetheless handled separately into the hazard analysis process:

1) Aleatory uncertainty is usually incorporated in the PSHA integrals

Examples: Earthquake location, uncertainty on ground motion estimates

2) Epistemic uncertainty is formally considered by using alternative models (or parameterizations) within a **logic-tree** structure

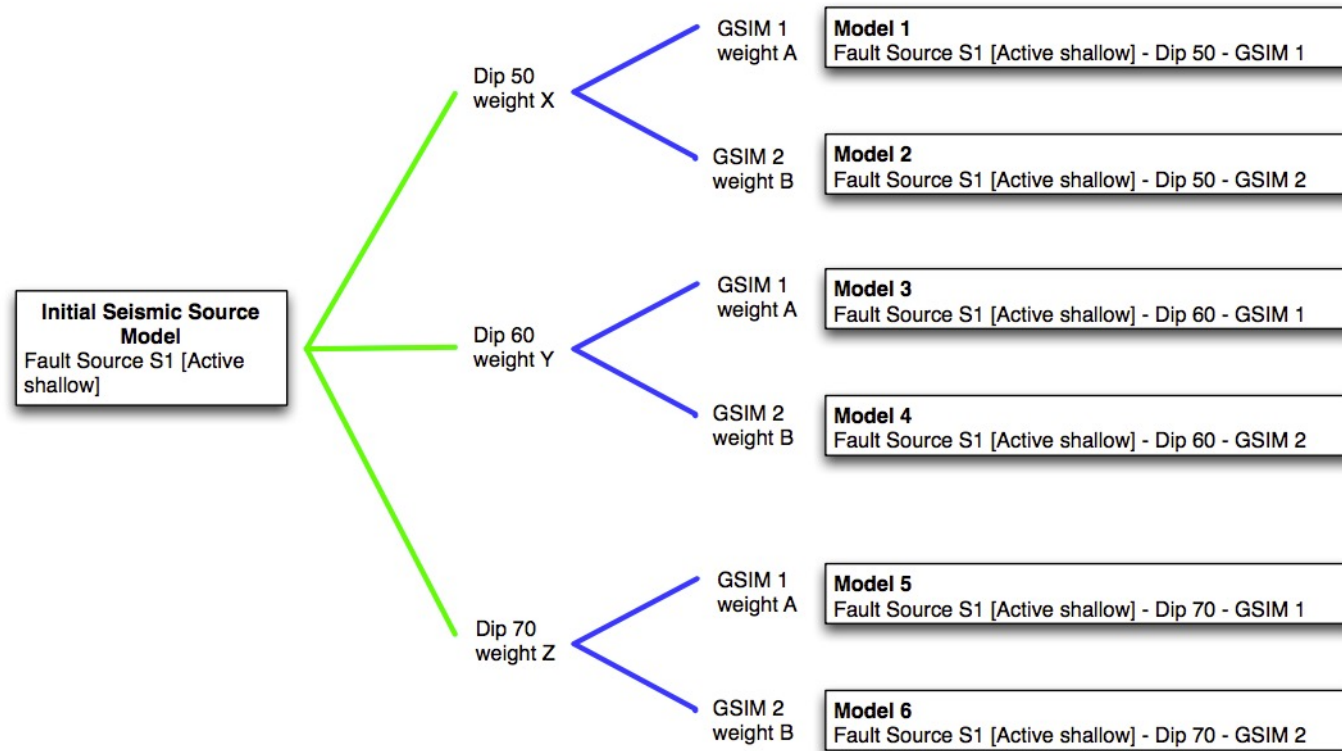
Examples: ground motion models, recurrence parameters (b-value, maximum magnitude), style of faulting....



Logic-Tree Strategy

A **logic-tree** consists of branches, which are **independent, mutually exclusive and collectively exhaustive** representations of the source and ground motion variability.

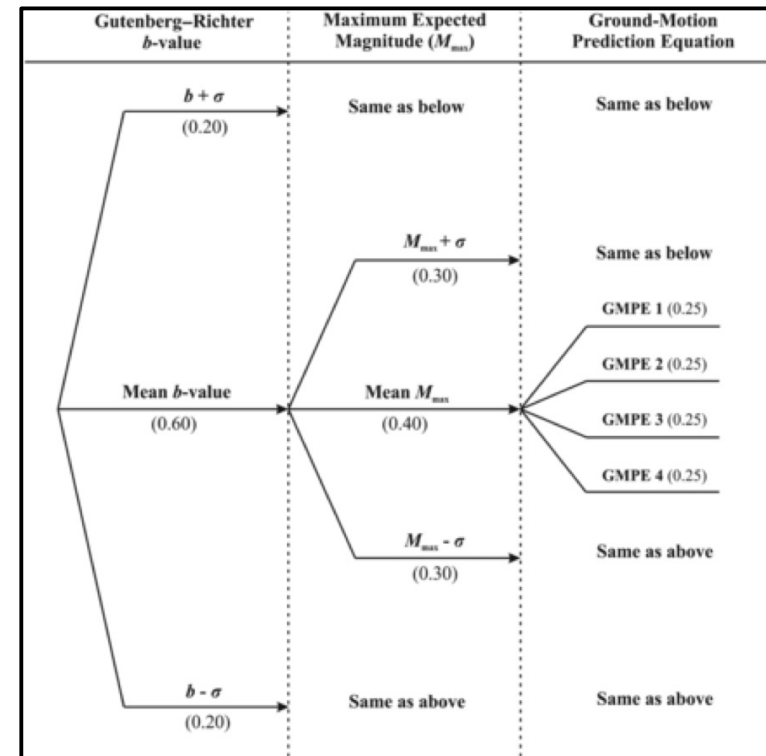
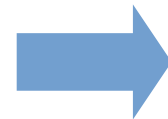
Commonly, several **branching levels** are used to combine uncertainties of different type.



Assigning Weights

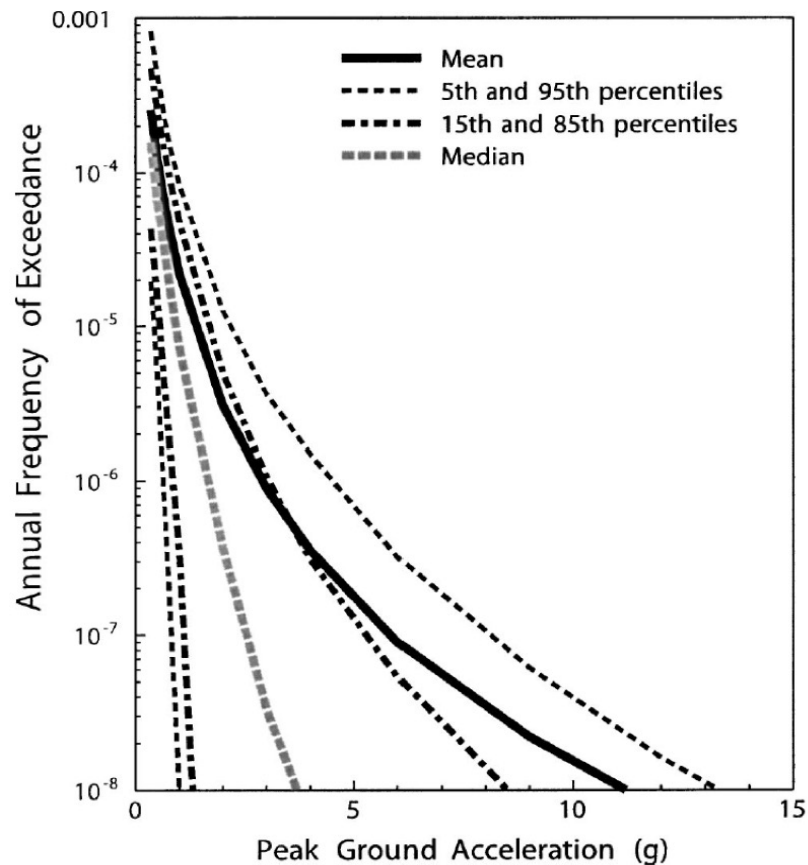
Each model is assigned **weights**, which express the degree of belief on that model. But how to assign weights?

- Based on fits to observed data? (**Empirical approach**)
- Based on theoretical representation of the physics of the process? (**Physical approach**)
- Weights assignment could be (actually, often is) a subjective process based **expert judgement**.



A Posteriori Statistic

From the ensemble of all hazard curves from each log-tree realization, **mean** and **percentile curves** can be computed



Note: Less data or knowledge should imply greater epistemic uncertainty

HOWEVER

Use of additional “conflicting” models (from newly available data) can increase epistemic uncertainty

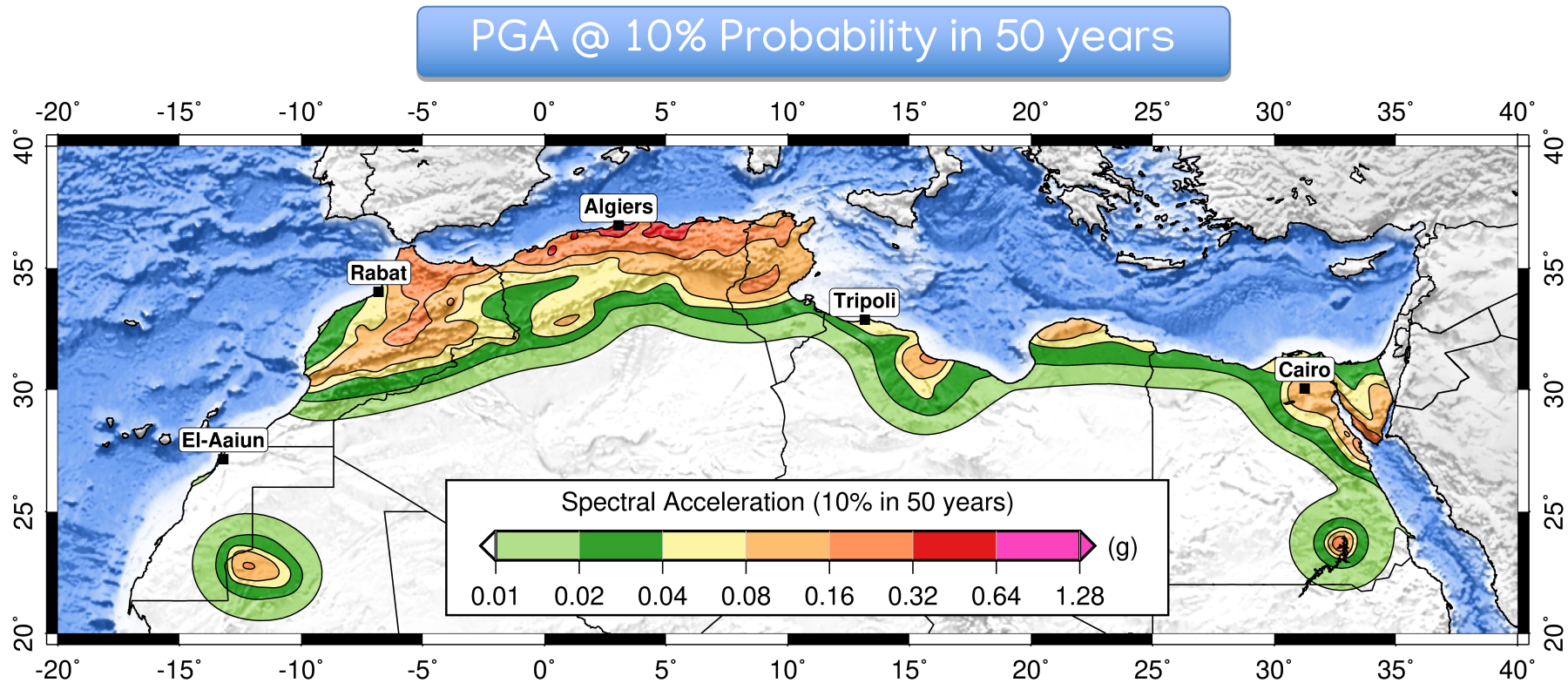


Epistemic uncertainty might be (paradoxically) lower in regions with less data!



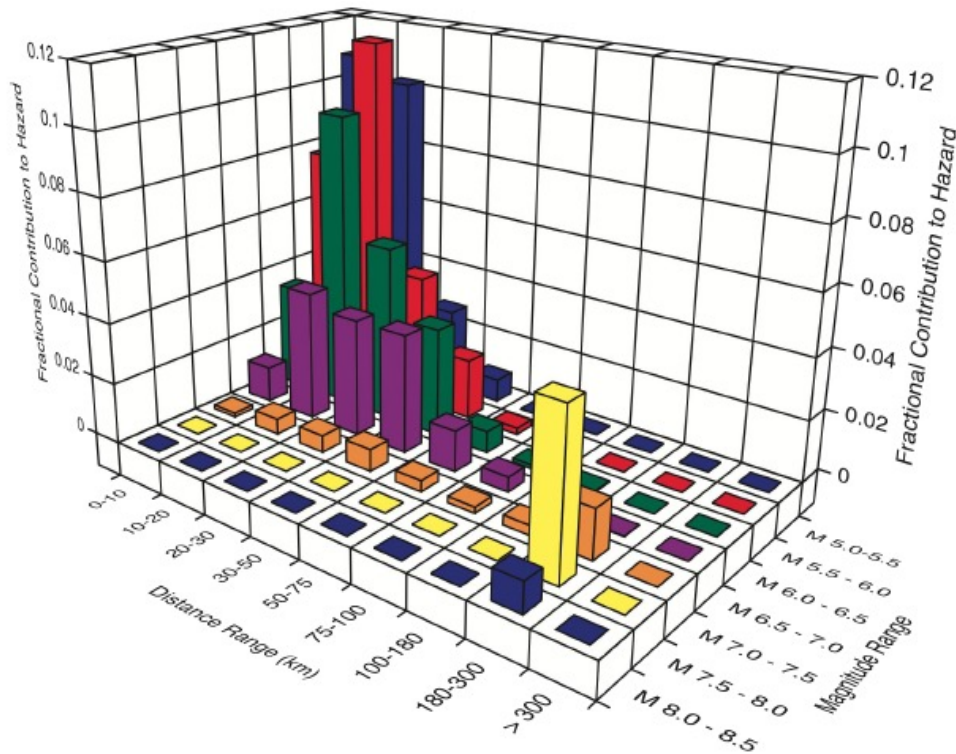
PSHA Output: Hazard Maps

Hazard maps are used to show how uniform probability of exceedance of a given ground motion measure for a given observation period distributes over the area.

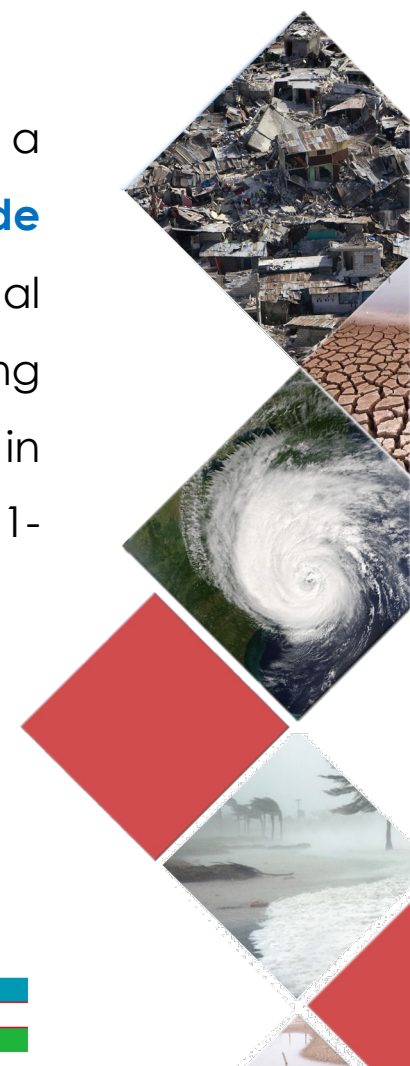


Hazard Disaggregation

For a given site, ground motion intensity measure and return period, the fractional contribution of specific scenarios to the hazard can be extracted from the hazard analysis via disaggregation.



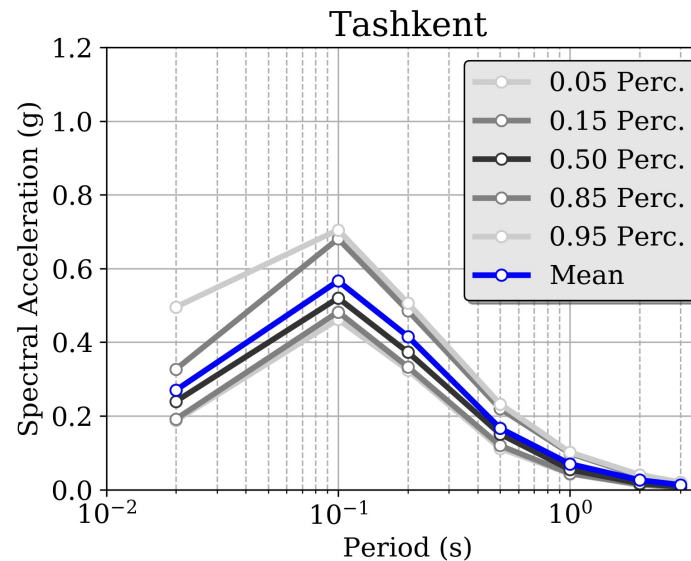
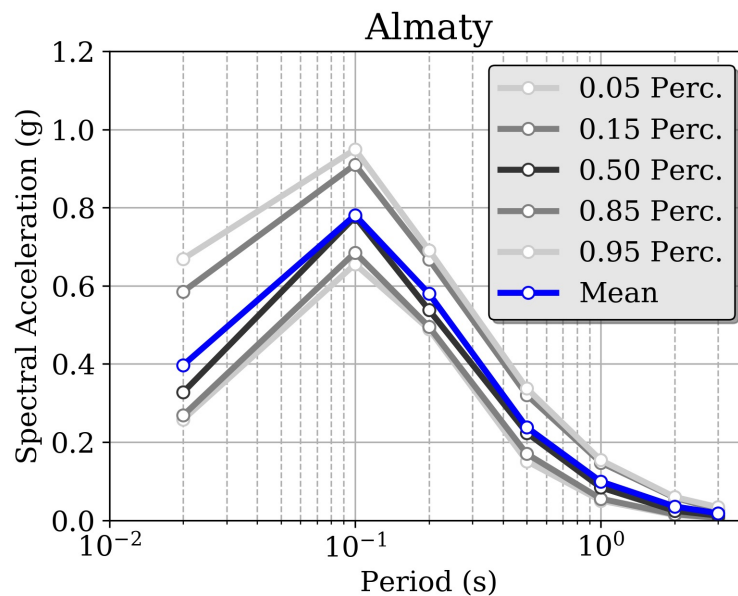
The most common form of disaggregation is a two-dimensional disaggregation in **magnitude** and **distance** bins (formally, it is the conditional probability of the ground motion being generated by an earthquake with magnitude in the range M1-M2 and distance in the range R1-R2).



Uniform Hazard Spectra

A common goal of PSHA is to identify a design response spectrum to be used for both structural and geotechnical analysis.

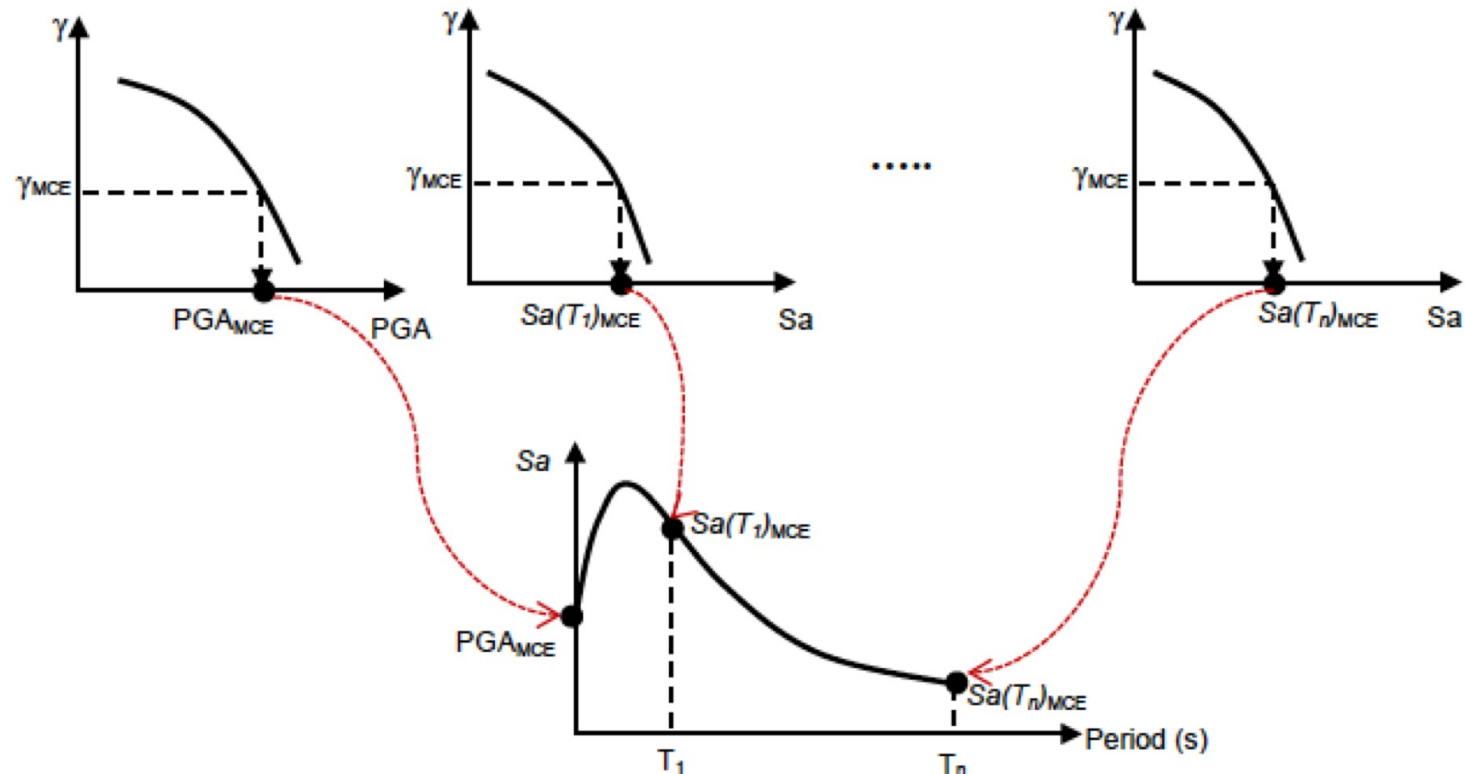
Uniform **hazard spectra (UHS)** is used to represent ground motion that have an equal probability of being exceeded in a fixed time span.



Uniform Hazard Spectra

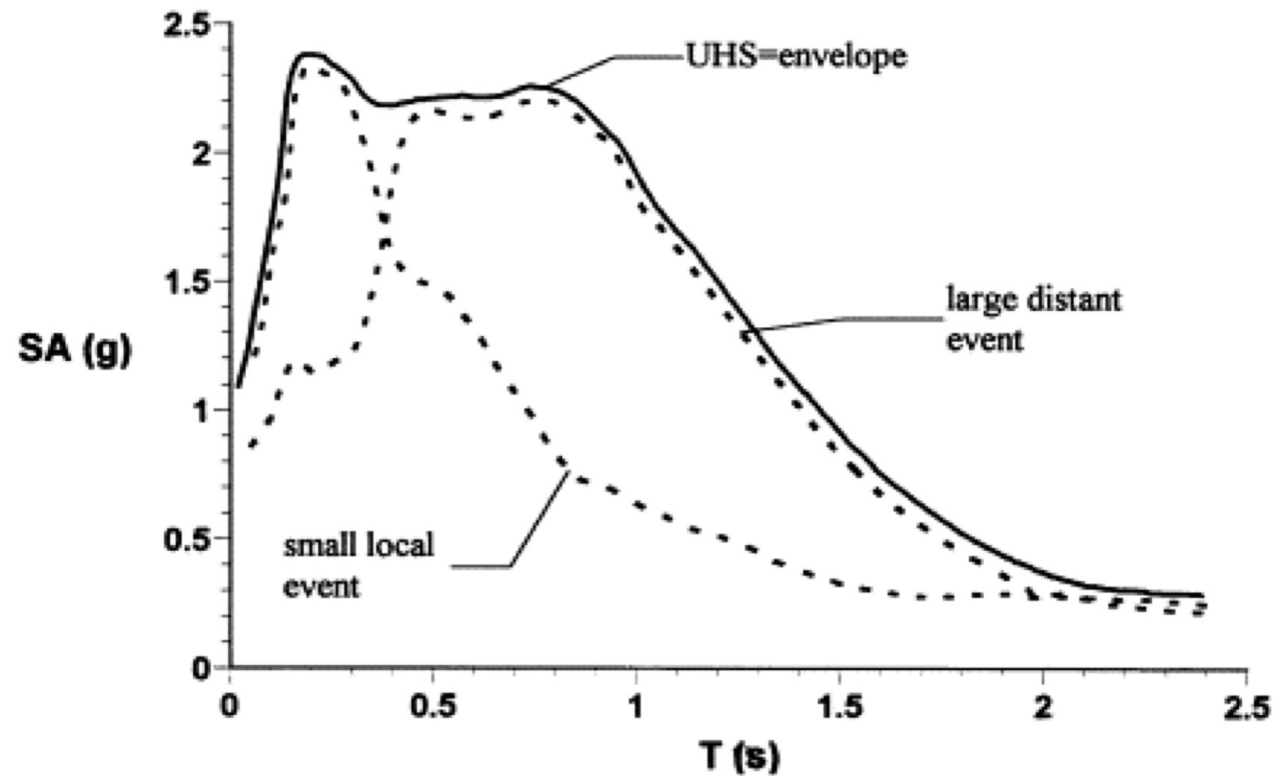
UHS can be computed using GMPs that support several spectral periods in the following way:

- 1) Choose the target return period to use for the calculation of the UHS (e.g., 475 years)
- 2) Compute the hazard curve for each spectral ordinate
- 3) Select the S_a for the RP specified at point 1



Uniform Hazard Spectra

Since the hazard is computed independently for each spectral period, in general, a uniform hazard spectrum does not represent the spectrum of any single earthquake. Each “part” of the spectrum is sensitive to a generally different controlling scenario.



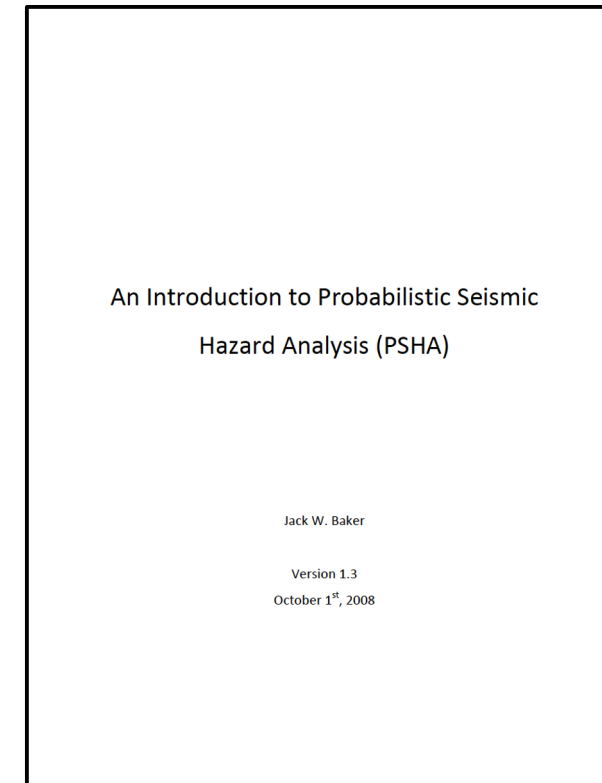
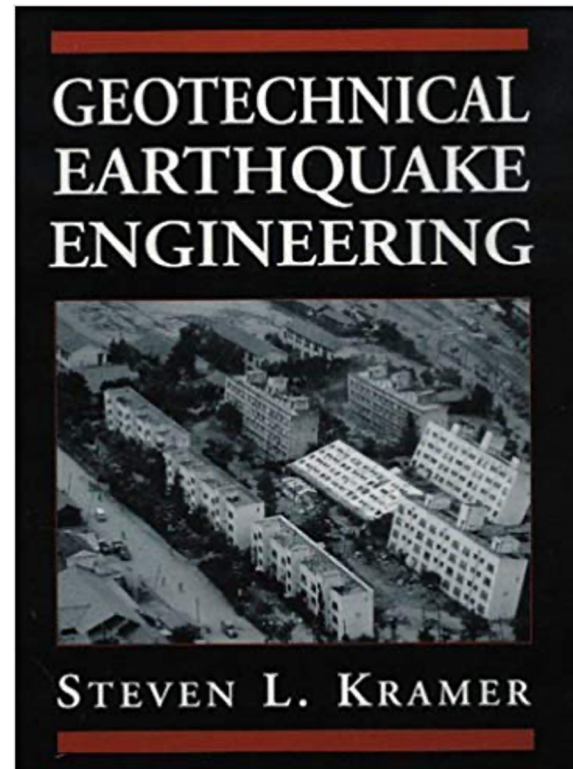
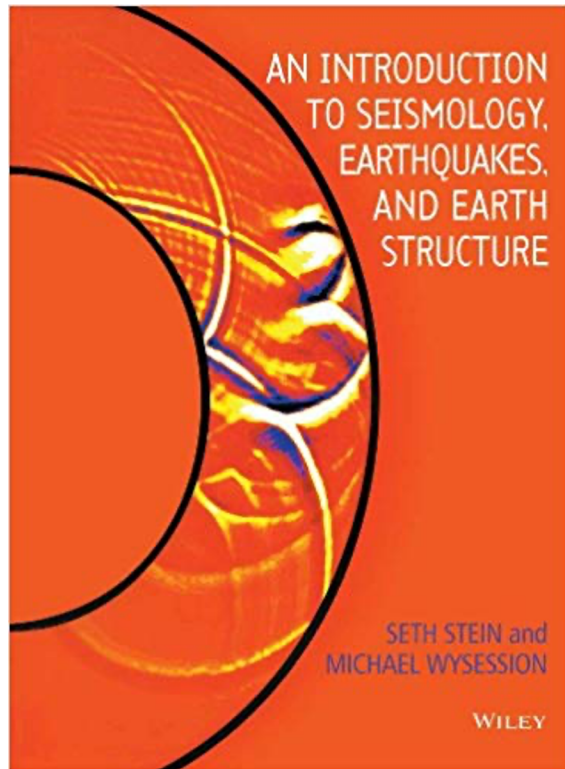
Conclusions

- Probabilistic Seismic Hazard Assessment (PSHA) is a powerful seismological tool to overcome the limitation of earthquake unpredictability.
- It provides engineers, insurers, decision makers and politician with a mean of evaluating the likelihood of damaging ground motion to happen, so that appropriate mitigation strategies can be applied.
- However, PSHA is a complex process, and it should be performed by experts with appropriate understanding of the matter and experience.
- PSHA itself is just a tool, and the quality of the result is highly driven be the knowledge we have for the study area and the availability of calibration data.
- Very common mistakes:
 - Mixing scales of applicability (e.g. regional and site-specific)
 - Comparison with occurrence of single events (mixing probabilistic with deterministic)



Suggested textbooks and tutorials

- Stein S., and M. Wyession. An Introduction to Seismology, Earthquakes, and Earth Structure. 1st ed. Malden, MA: Blackwell, September 2002. ISBN 9780865420786.
- Kramer, S.L., Geotechnical Earthquake Engineering, Prentice Hall, 1996, ISBN 0133749436



Thank you very much for your attention!

