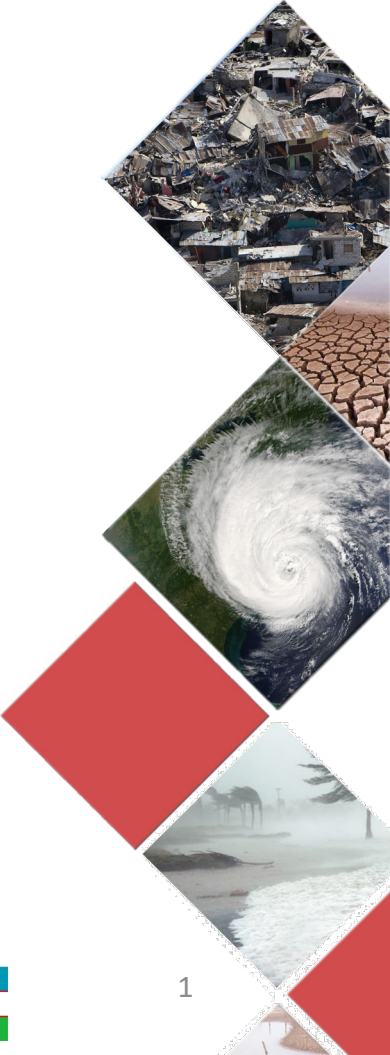


# A new Probabilistic Earthquake Hazard Model for Central Asian Countries

## SFRARR Central Asia disaster risk assessment

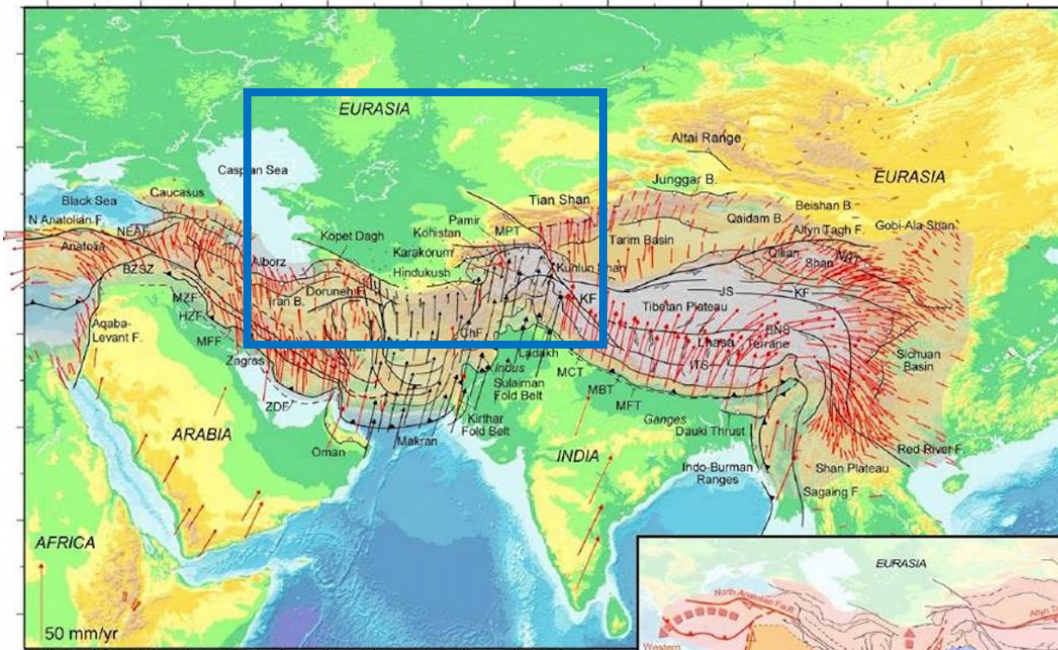
16, September 2021



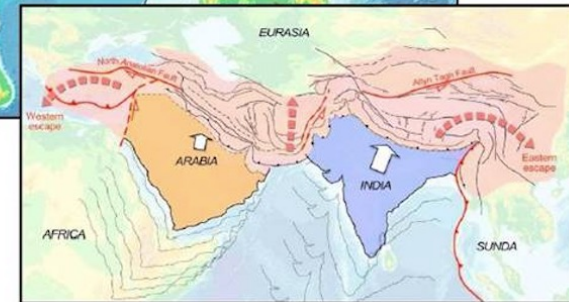
# Seismotectonic Overview

Central Asia is an area characterized by complex tectonic and active deformation.

Large historical earthquake events ( $M > 7$ ) have occurred, mostly caused by **thrust** and **reverse-faults** generated by the collision of the Eurasian and Indian plates.



GPS-derived velocity maps from Hatzfeld and Molnar (2010)

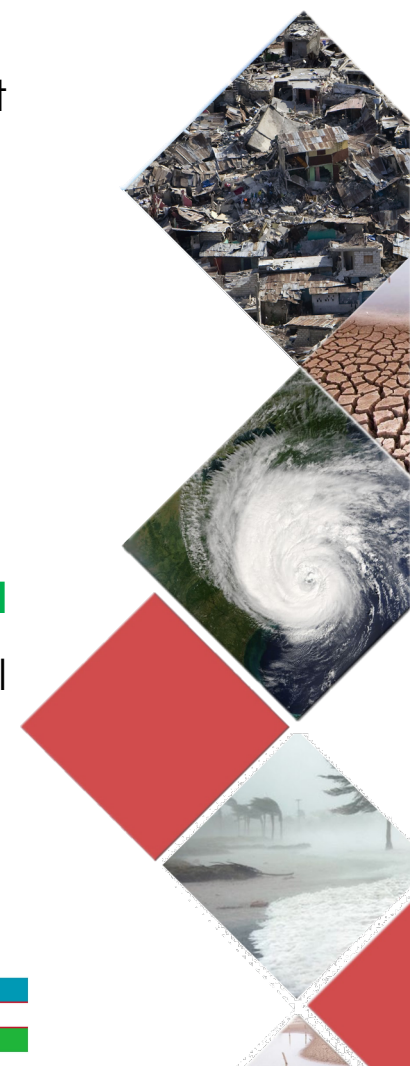


This regime was responsible for the development of the Cenozoic belts of Tien Shan and Pamir, which are accommodating a great part of the regional deformation.



# Motivation

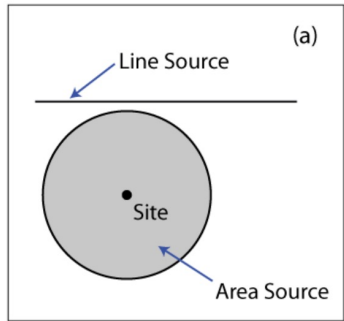
- For the purpose of developing a comprehensive risk model for Central Asia, a **probabilistic seismic hazard assessment (PSHA)** has been performed for the Central Asia countries (Kazakhstan, Kyrgyz Republic, Tajikistan, Turkmenistan, Uzbekistan).
- The analysis was conducted using **state-of-art methodologies** and analysis tools, using the most complete and **up to date information** available for the territory, such as:
  1. Previous geological and seismological studies
  2. Global and local earthquake catalogues
  3. Active fault databases
  4. Ground motion recordings
- The study took advantage from the collaboration and continuous interaction with the **local experts of the consortium**, that provided the necessary support in term of datasets, local knowledge and expertise.



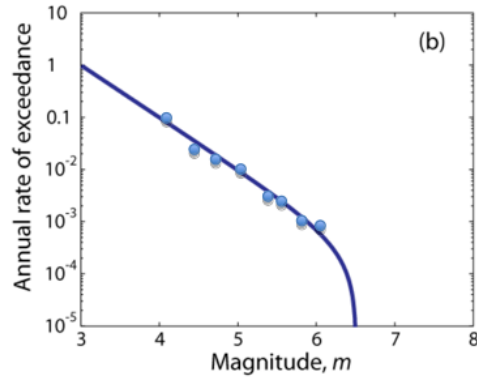
# Probabilistic Seismic Hazard Assessment (PSHA)

**In a nutshell**

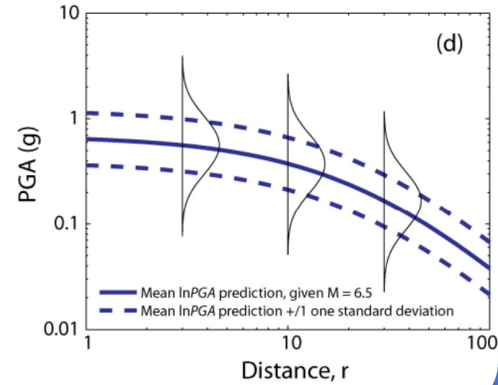
**Where:**  
Seismic Sources



**When (how often):**  
Recurrence Models



**How (how strong):**  
Ground Motion Models



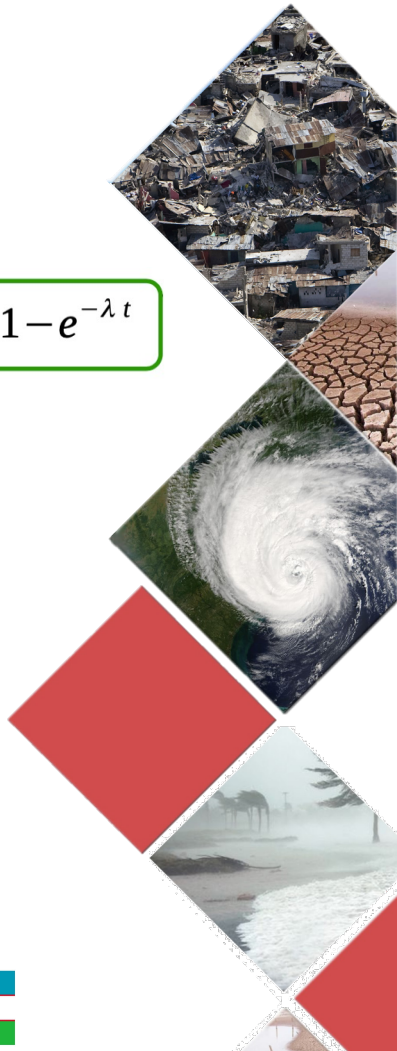
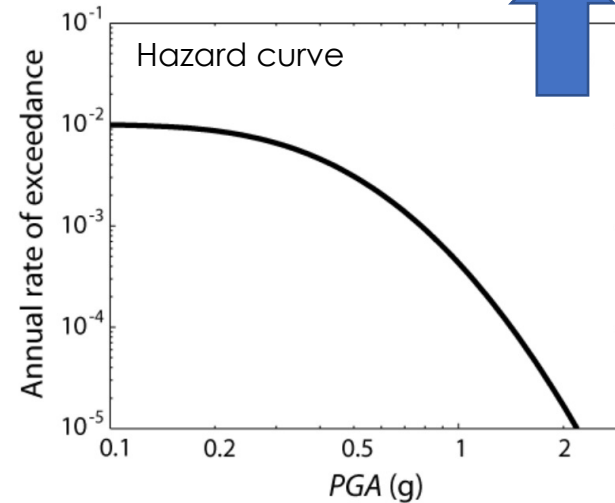
Poisson assumption

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

Hazard integral

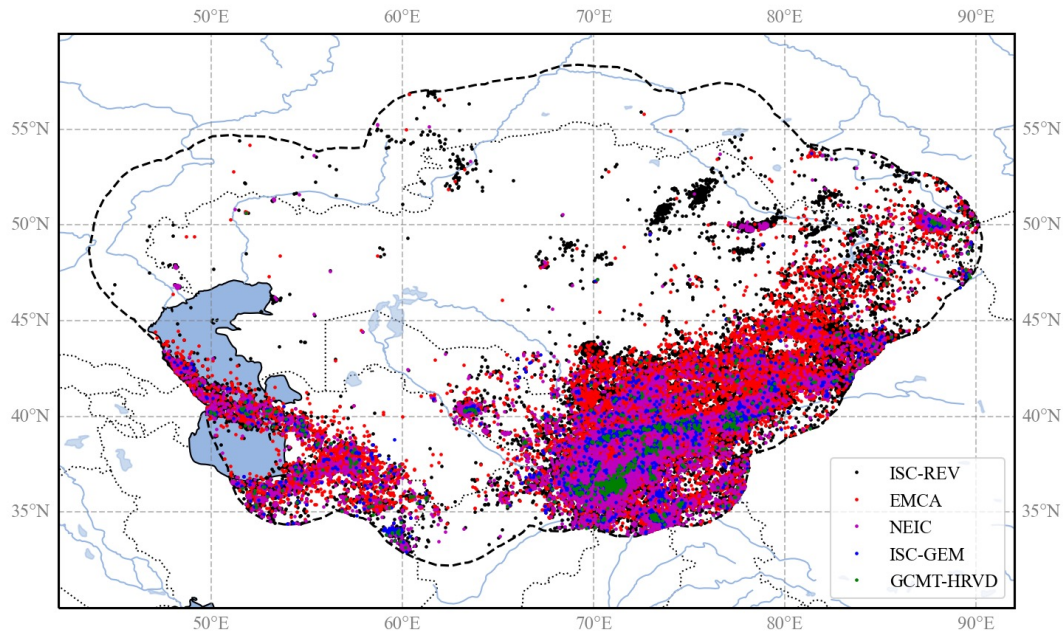
$$\lambda (IM \geq x) = \sum_{i=1}^{n_{sources}} \lambda (m_i \geq m_{min}) \int_{m_{min}}^{m_{max}} \int_{r_{min}}^{r_{max}} P(IM \geq x | m, r) f_{M_i}(m) f_{R_i}(r | m) dm dr$$

Loop over sources  
Loop over magnitudes  
Loop over distances



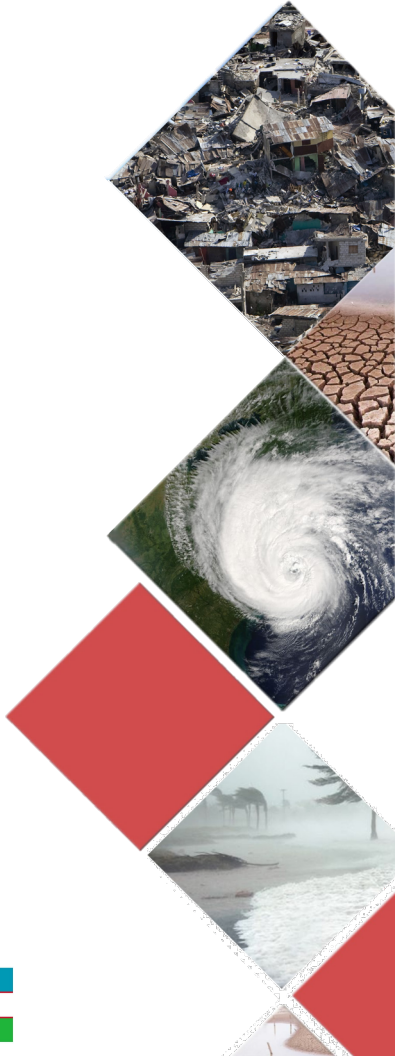
# Harmonized Earthquake Catalogue

The creation of a state-of-art earthquake catalogue with homogenous magnitude ( $M_w$ ) provides base information for the evaluation of the location, size, and occurrence of potentially damaging future earthquake events.



The **Harmonized Earthquake Catalogue for Central Asia (HECCA)** is obtained by combination of:

- 1) publicly available global earthquake information (e.g., ISC-Reviewed, ISC-GEM, GCMT, NEIC compilations)
- 2) information from past regional projects (e.g., EMCA)
- 3) data from agencies and scientific institutions of the project state members



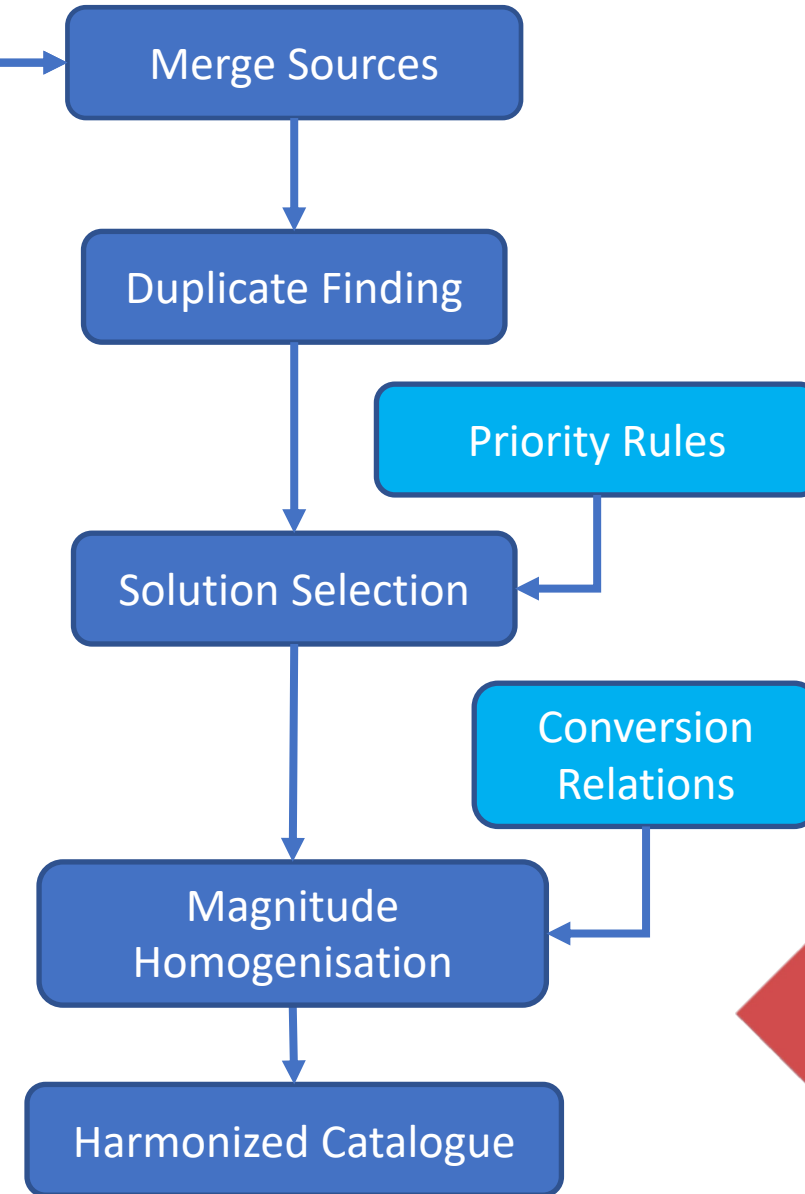
# Assembling Workflow

Global / Regional Datasets

Source	N. of Events	Mag. Range	Mag. Type	Year Range	Depth Range
ISC-GEM	1525	4.96 - 8.02	Mw	1906 - 2016	5.0 - 274.1
ISV-Rev	51093	2.0 - 8.4	Various types	1906 - 2018	0.0 - 441.4
GCMT	814	4.64 - 7.61	Mw	1976 - 2017	2.7 - 400.6
USGS-NEIC	15804	2.9 - 7.8	Mw, Ms, mb	1902 - 2020	0.0 - 400.57
GEM-GEHC	24	7.0 - 8.3	Mw, Ms	1052 - 1902	20.0 - 200.0
EMCA – Hist.	173	3.5 - 8.3	MIh	-2000 - 1898	3.0 - 180.0
EMCA – Inst.	30700	2.0 - 8.2	MIh	1901 - 2009	0.0 - 404.0

Local Datasets

Source	N. of Events	Mag. Range	Mag. Type	Year Range	Depth Range
Kazakhstan	30930	2.1 - 8.3 (Ms)	Kp, MIh, Ms	-250 - 2020	0 - 210
Kyrgyzstan	34434	2.2 - 7.7 (Ms)	Kr, MIh, Ms	-250 - 2020	0 - 99
Tajikistan	66602	4.0 - 16.5 (Kr)	Kr	1962-1991	0 - 350
Uzbekistan	1837	3.5 - 9.2 (MIh)	Kr, MIh	1955-2020	0 - 35
Turkmenistan	4928	8.6 - 14 (Kp)	Kp, Mpv	1997-2008	0 - 63

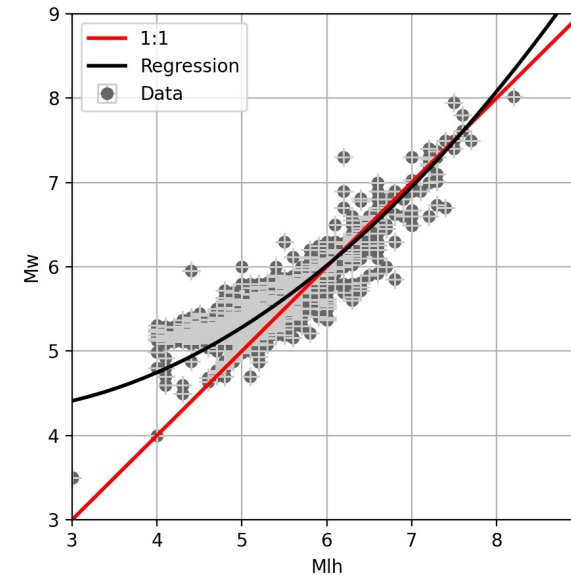
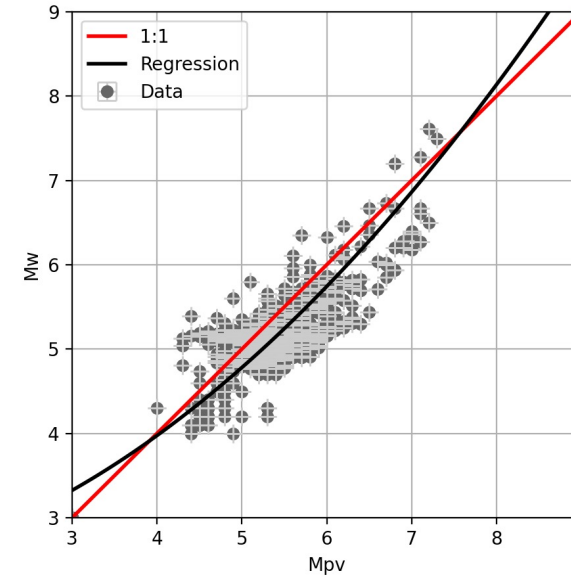


# Magnitude Conversion

All events with different magnitude types must be converted to a reference scale (Mw), using:

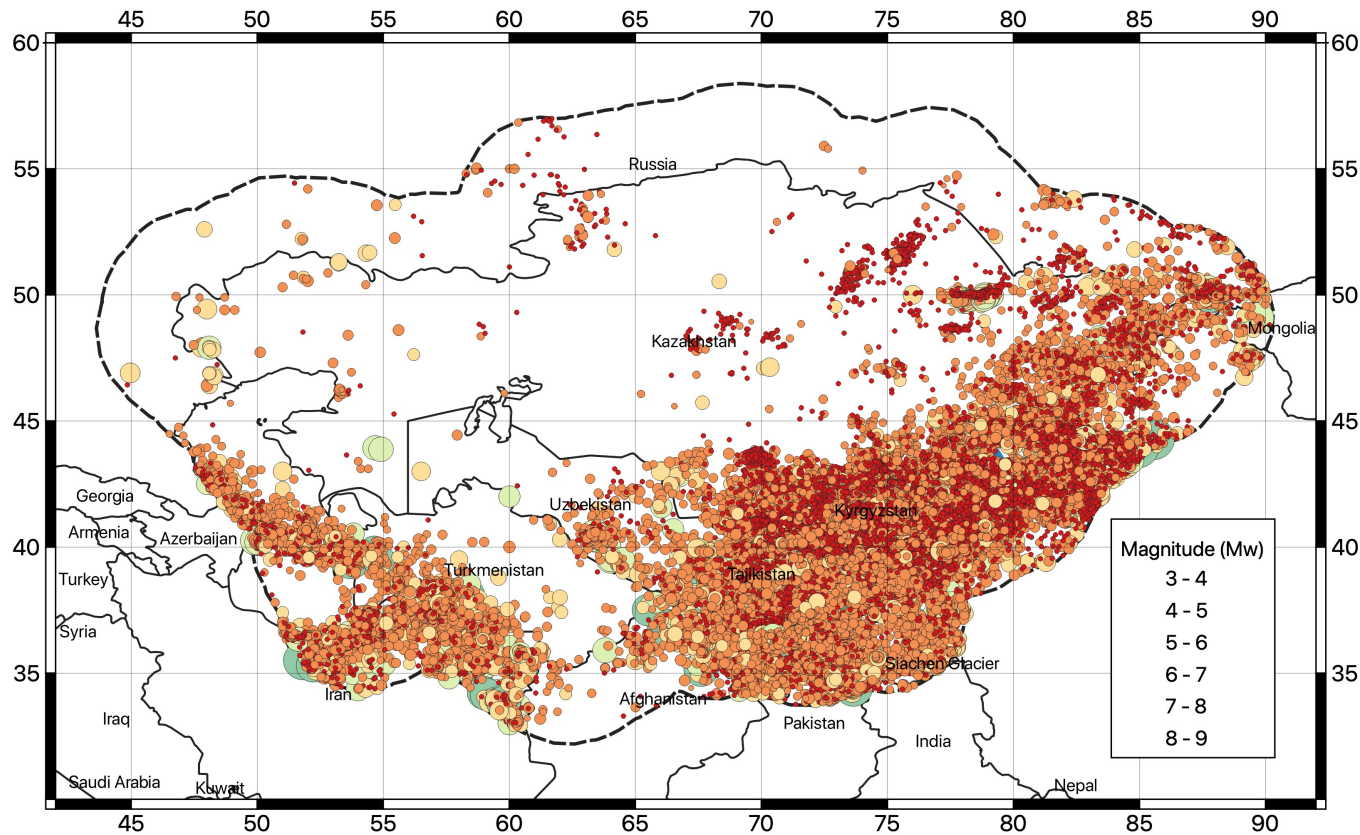
- globally calibrated magnitude conversion relations for the most common magnitude scales (Ms, mb, MI)
- ad-hoc relations have been developed using an orthogonal regression approach to convert specific scales (Mpv and MIh) to Mw

Type	Conversion Rule
Mw	1:1
MIh	<b><math>4.594 - 0.359M + 0.099M^2</math> (this study)</b>
Ms	Di Giacomo et al. (2015) – Exponential
Mpv	<b><math>2.311 + 0.104M + 0.078 M^2</math> (this study)</b>
mb	Weatherill et al. (2016) – Linear (NEIC calibration)
ml	Edwards et al. (2010) - Polynomial
Md and other types	1:1
Kr (energy magnitude)	Bindi et al. (2011)



# The Final Harmonized Catalogue for Central Asia

The harmonized backbone catalogue for Central Asia presently consists of 77376 events up to 2020 and in the range  $3.0 < M_w < 8.5$ , although minimum regional completeness is found of about  $M_w$  4 to 4.5.



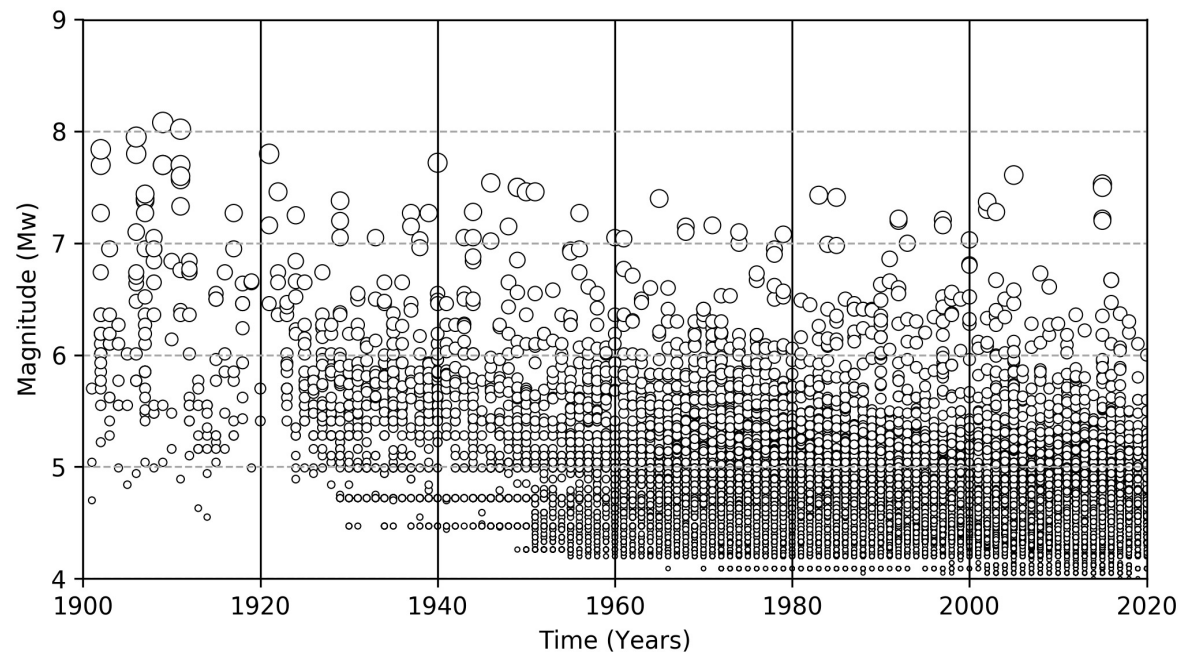
Geographical distribution of earthquake hypocentres ( $M_w > 3$ ) of the newly developed  $M_w$  harmonized catalogue for Central Asia (HECCA)





# The Final Harmonized Catalogue for Central Asia

The historical period (before 1900) is covered mostly by the EMCA catalogue, while the instrumental period has been deeply revised in this study and extended by the inclusion of new homogenous location solutions from global datasets, additional magnitude conversion relations and recent events (e.g., after 2009) from regional datasets.



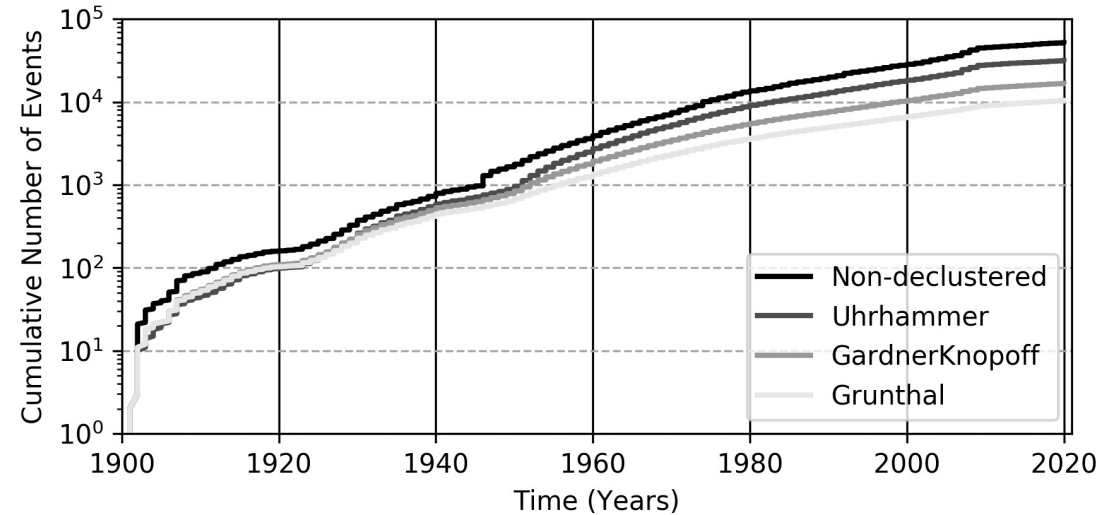
Time-magnitude distribution of the earthquake events of the HECCA catalogue in the instrumental period (after 1900).



# Removal of Dependent Events

Probabilistic seismic hazard analysis assumes that earthquake occurrences are independent and that their probability distribution is that of a Poisson process.

To fulfil the assumption, naturally correlated events (foreshocks, aftershocks) must be removed by applying a **declustering procedure** based on time-distance window matching.



Cumulative number of events over time using the three considered declustering algorithms.

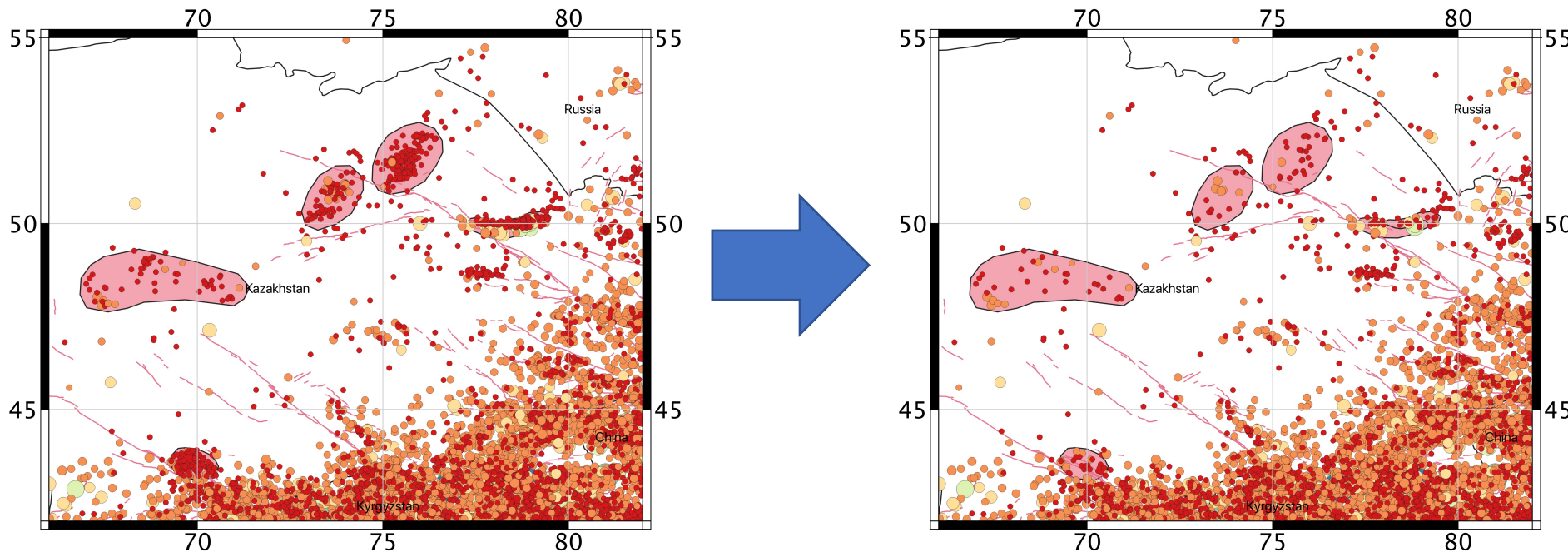
	All events	3<Mw<4	4<Mw<5	5<Mw<6	6<Mw<7	7<Mw<8
Before declustering	77376	25178	47599	4060	444	91
GardnerKnopoff	24373	7398	14878	1774	248	71
Uhrhammer	49018	17191	29146	2337	272	68
Grunthal	14283	3654	8788	1539	228	70



# Removal of Anthropogenic Events

Man-made events (from geothermal exploitation, blasts, mining explosions) must also be purged from the earthquake record.

A modification of the declustering algorithm is used: starting from a Gardner and Knopoff (1974) window, a variable scaling factor is then applied till an optimal trade-off between purged event and residual seismicity (regional background) is found.

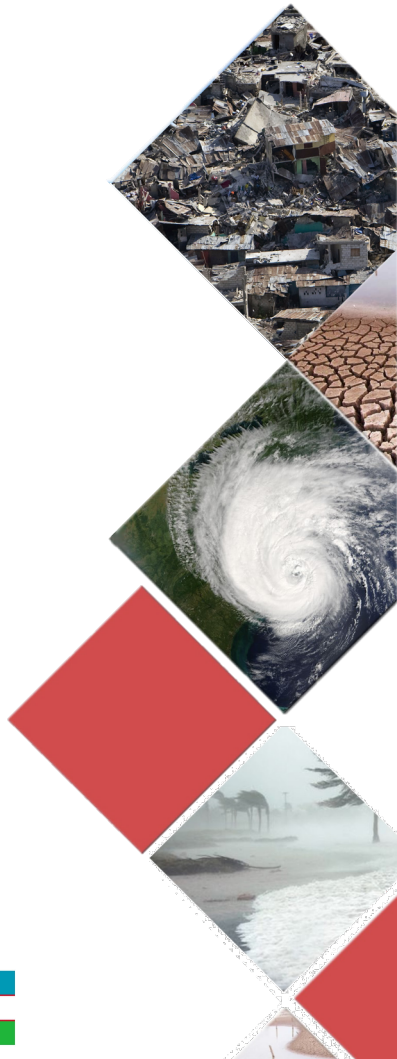
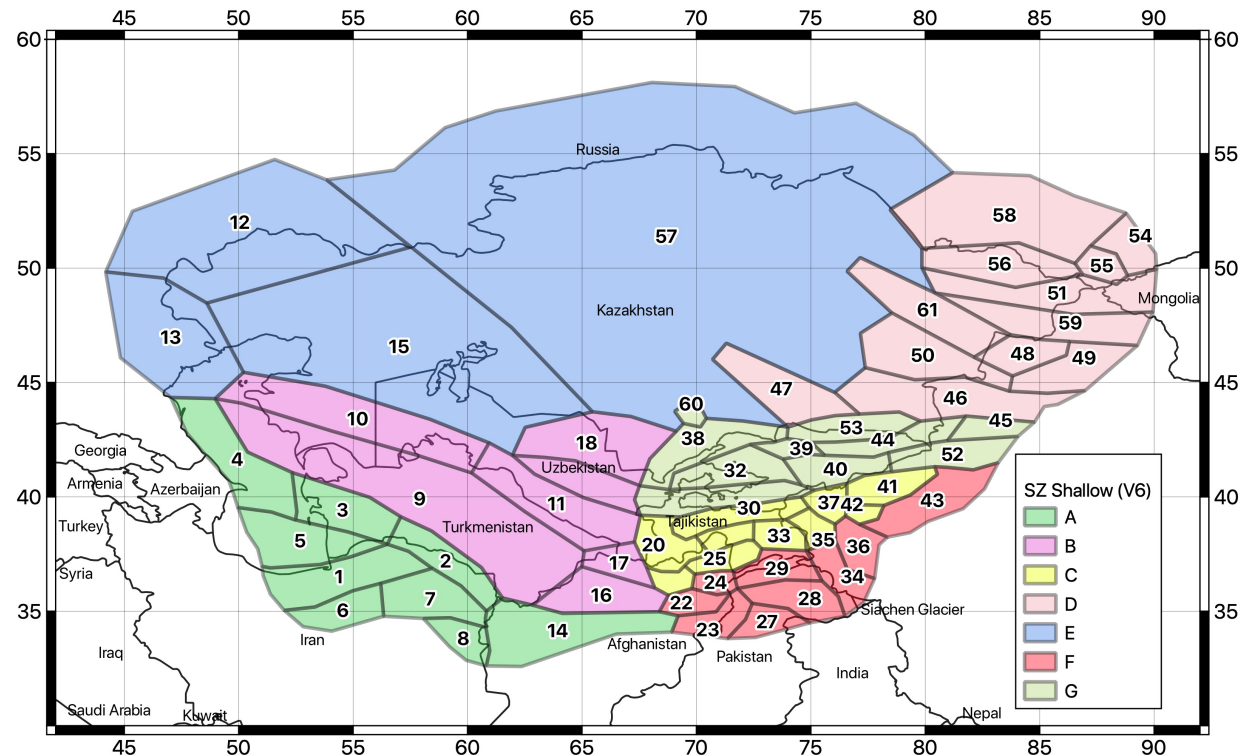


# The Homogenous Area Source Model

In homogenous area source zonation, observed seismicity is assumed to have equal probability to occur anywhere within the area. Zones are defined on the base of the observed seismicity and the available geological and seismotectonic information for the area.

The shallow seismicity model was developed in collaboration with local partners and it represents earthquake sources within 50 km depth.

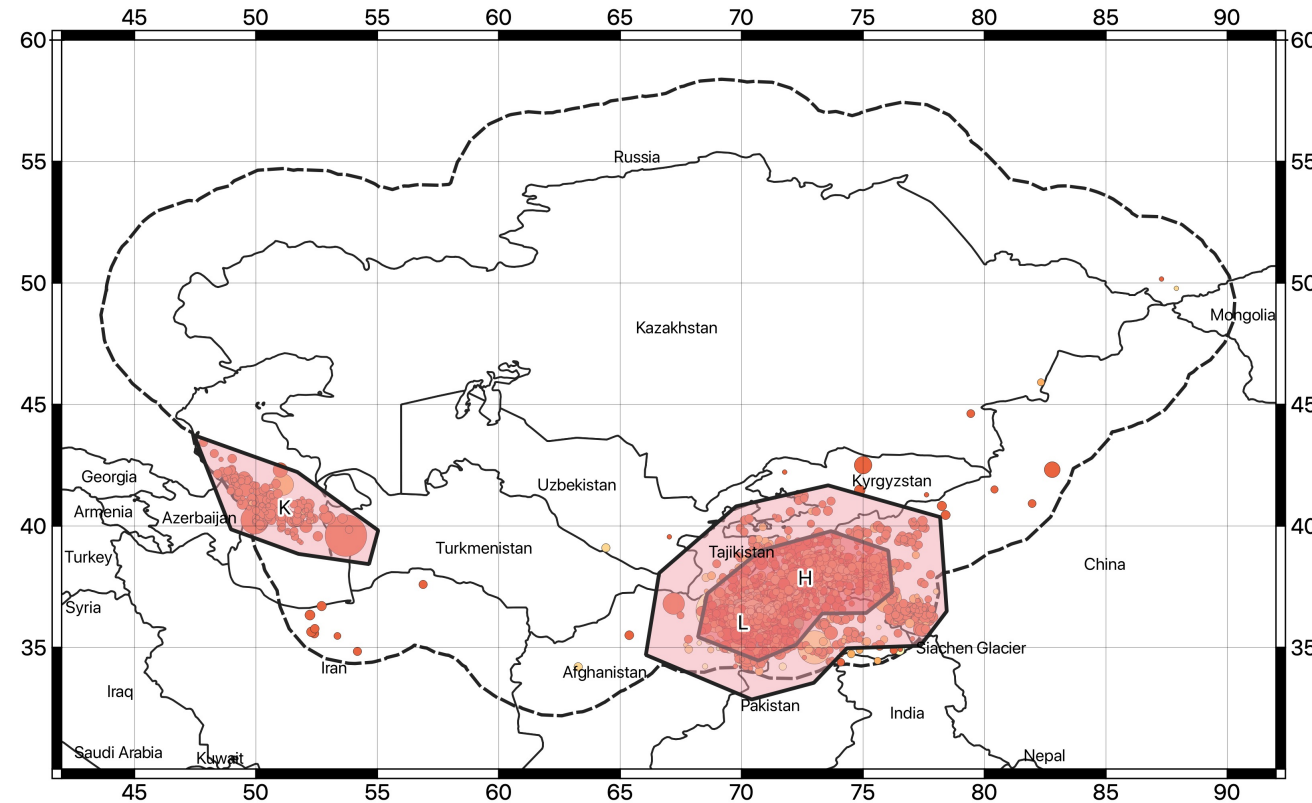
Its consists of **61 homogenous source zones**, grouped into 7 main tectonic groups (A to G).



# Deep Source Model

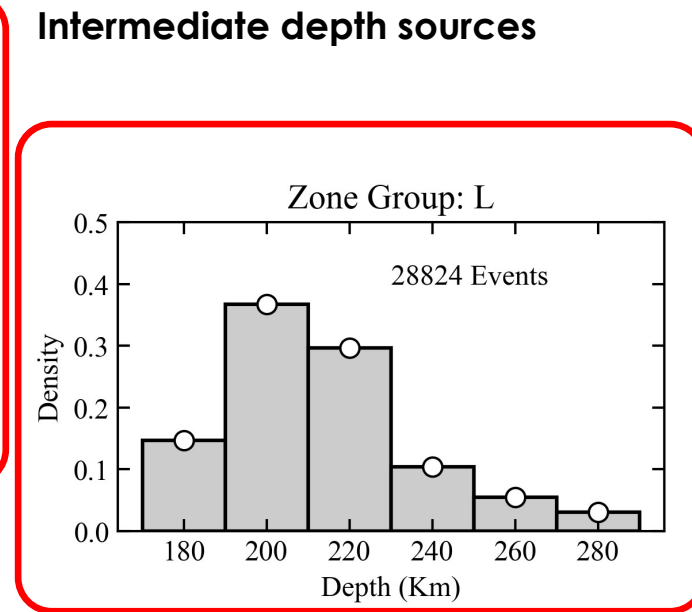
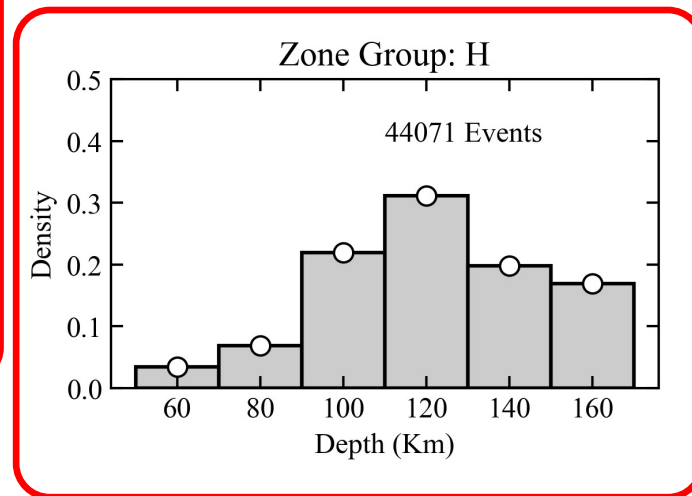
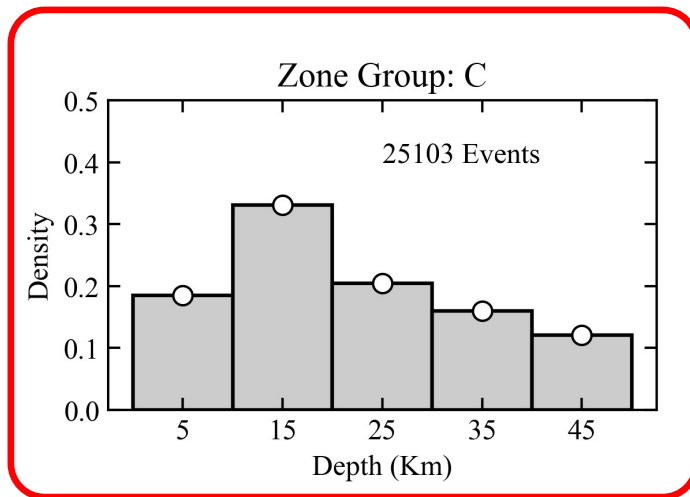
A significant fraction of earthquakes is located at depth below 40-50km, considered the lowermost thickness of the continental (brittle) crust for the area.

Two intermediate-depth (H and K) and one deep (L) source zones have been implemented separately, to represent the seismogenic range 50-150km and 150-400km.



# Hypocentral Depth Distribution

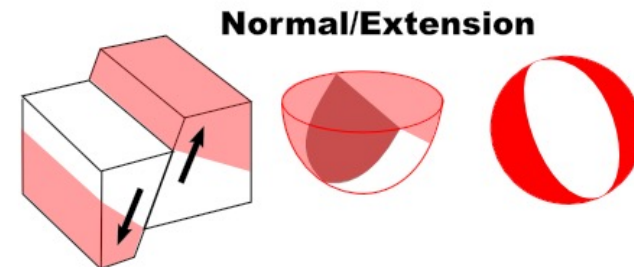
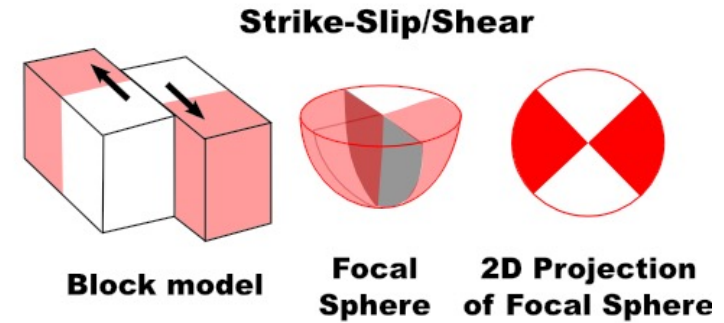
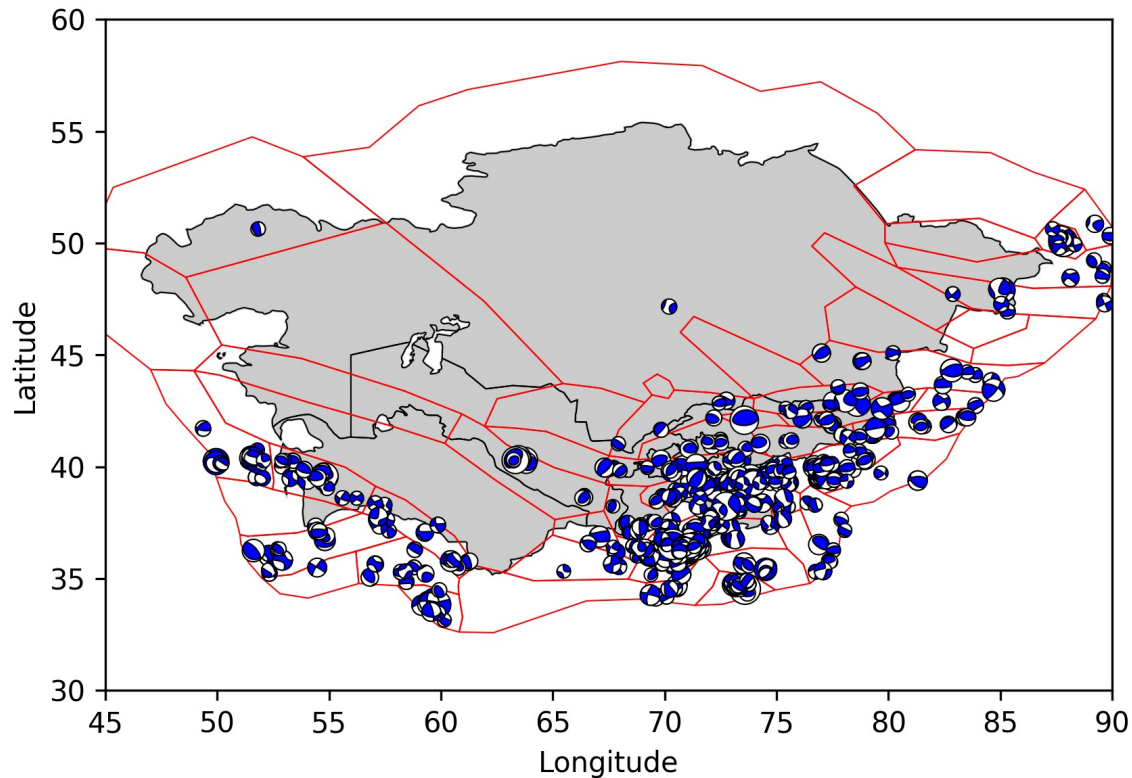
A depth probability density distribution was estimated for the different source groups from the analysis of the harmonized earthquake catalogue. Events with unknown depth were excluded from the analysis, as well as events with typical fixed depth solution (e.g., 0, 5, 10, 33 km etc.)



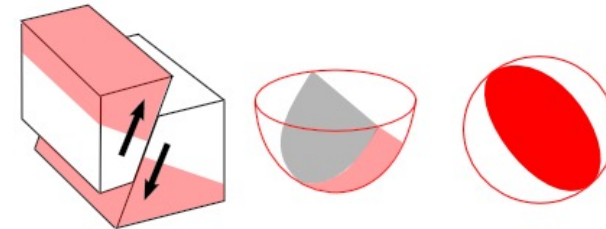
Increasing hypocentral depth

# Rupture Mechanism Definition

The available information from mapped surface faults and **moment tensor solutions** from the GCMT bulletin were used to define the dominant rupture mechanism of each zone.



**Reverse/Thrust/Compression**

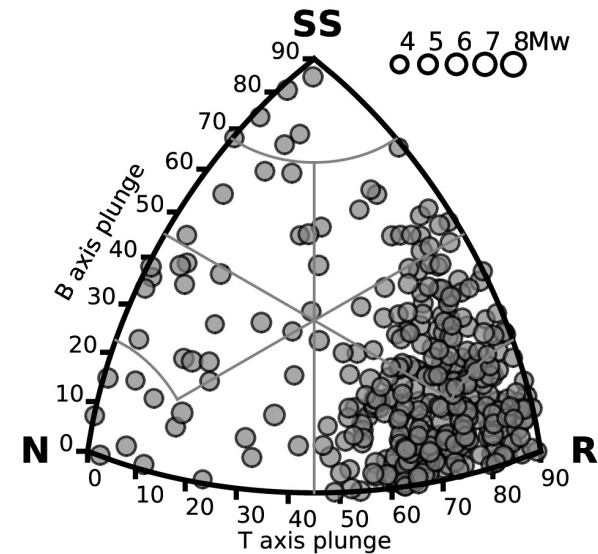
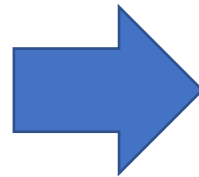
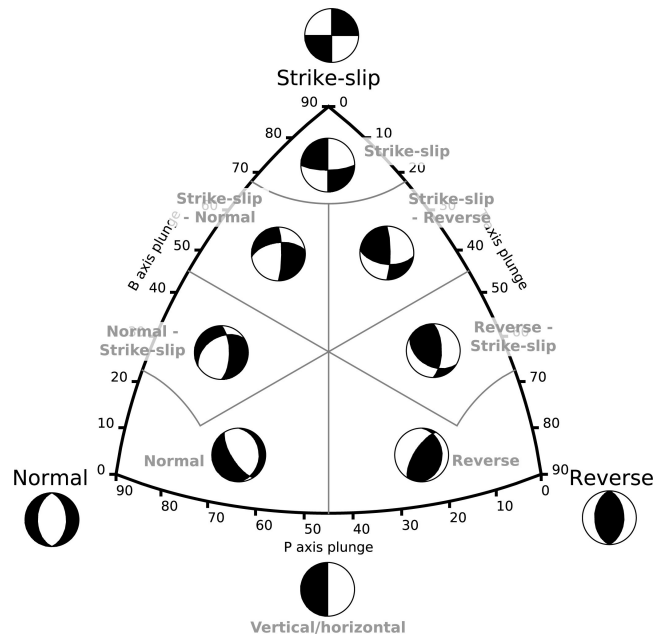


For the study region, 814 focal mechanisms are available for events in the range  $4.64 < M_w < 7.61$



# Rupture Mechanism Definition

Geometrical parameters (strike and dip orientation) of the different source zones were characterized by analysing the geometry of the focal mechanism using the “beachball” representation, while dominant faulting style was accessed by inspecting the distribution of the B-T axis orientations using Kaverina et al. (1996) classification diagrams.



FMC code of Álvarez-Gómez (2019)

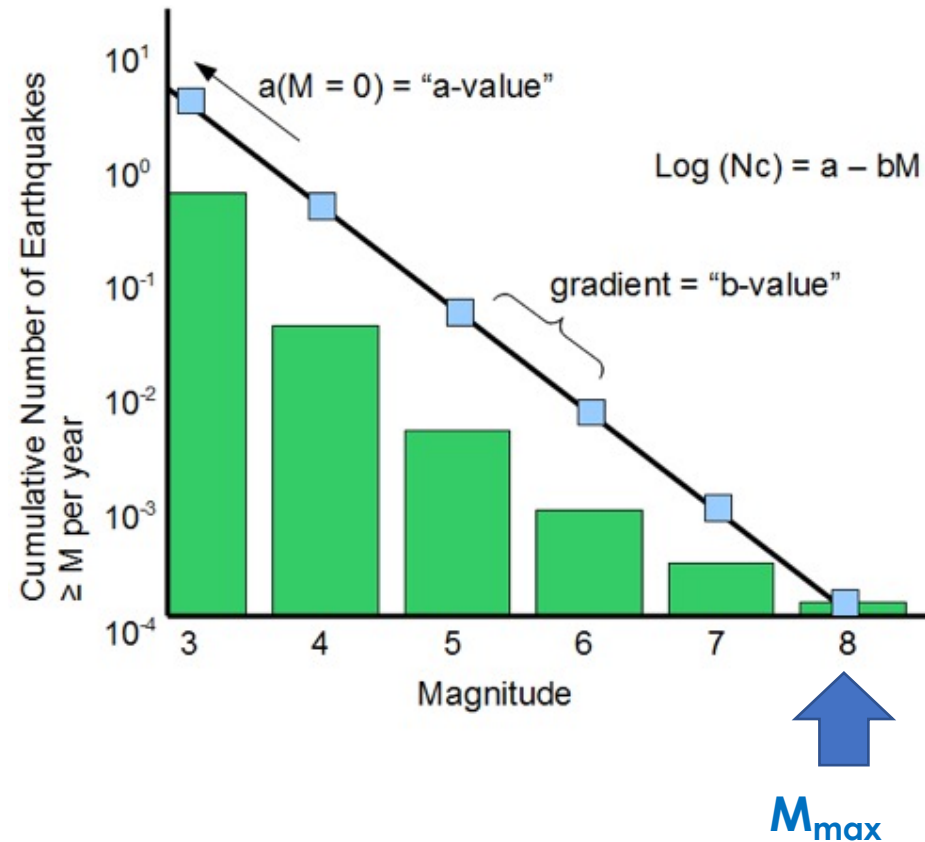




# Magnitude Frequency Distribution

The temporal occurrence of the seismic events was assumed to follow a **truncated Gutenberg-Richter** (GR) model.

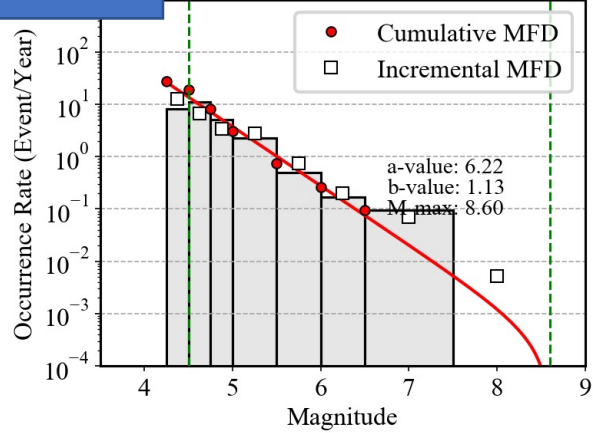
a- and b-value were estimated for each tectonic group and source zone by fitting observed annual rates from the declustered earthquake catalogue using a linear least-square approach on incremental (non-cumulative) magnitude bins



# Magnitude Frequency Distribution

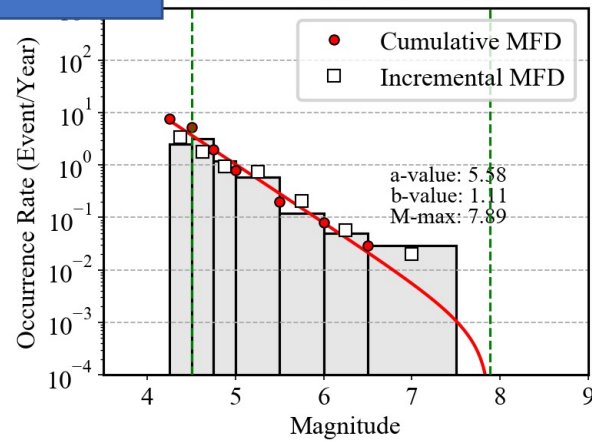
Group A

Truncated G-R Distribution



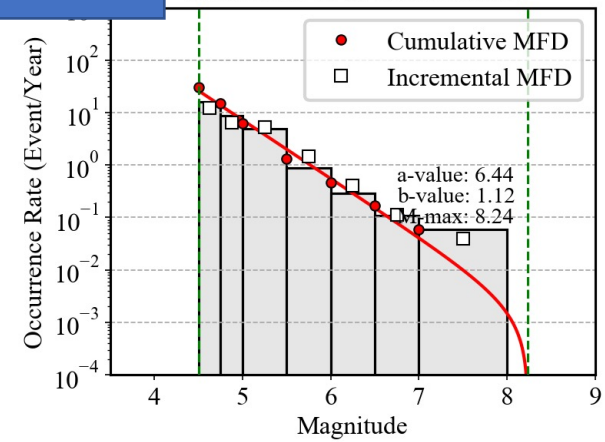
Group B

Truncated G-R Distribution



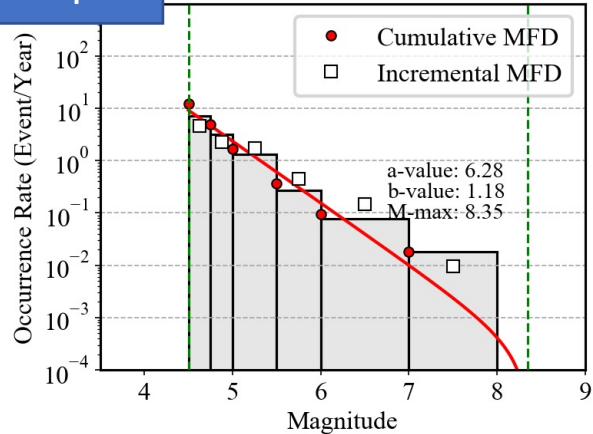
Group C

Truncated G-R Distribution



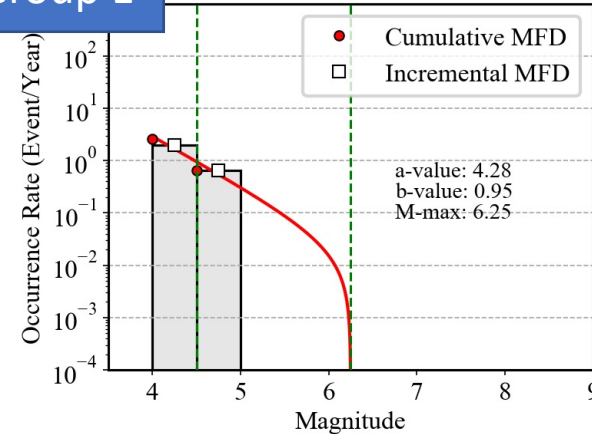
Group D

Truncated G-R Distribution



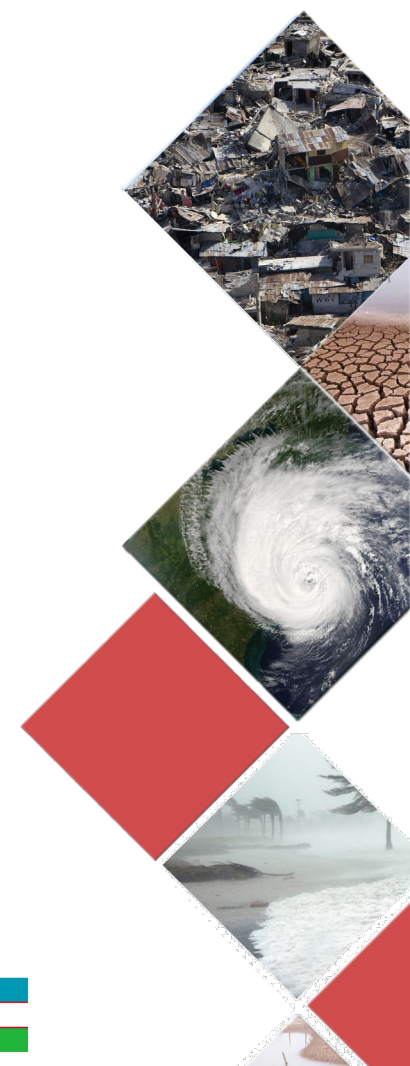
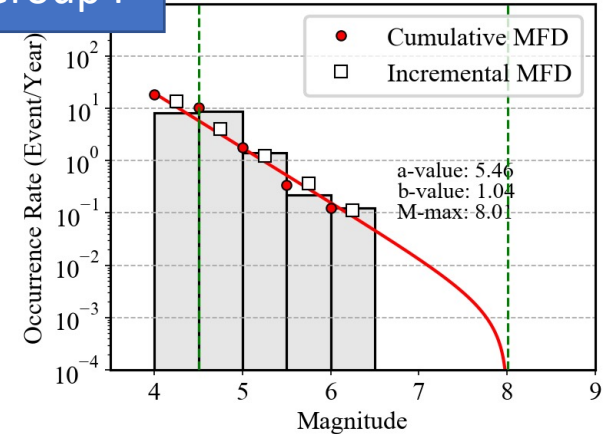
Group E

Truncated G-R Distribution



Group F

Truncated G-R Distribution



# Smoothed Seismicity Model

The homogenous area source zonation approach may not be appropriate for regions where seismicity is known to be well localized along main tectonic structures and specific crustal domains.

To overcome this limitation, a variant of the smoothing procedure proposed by Poggi et al. (2020) is used, which has the significant advantage of preserving the overall rate balance of each discrete zone.

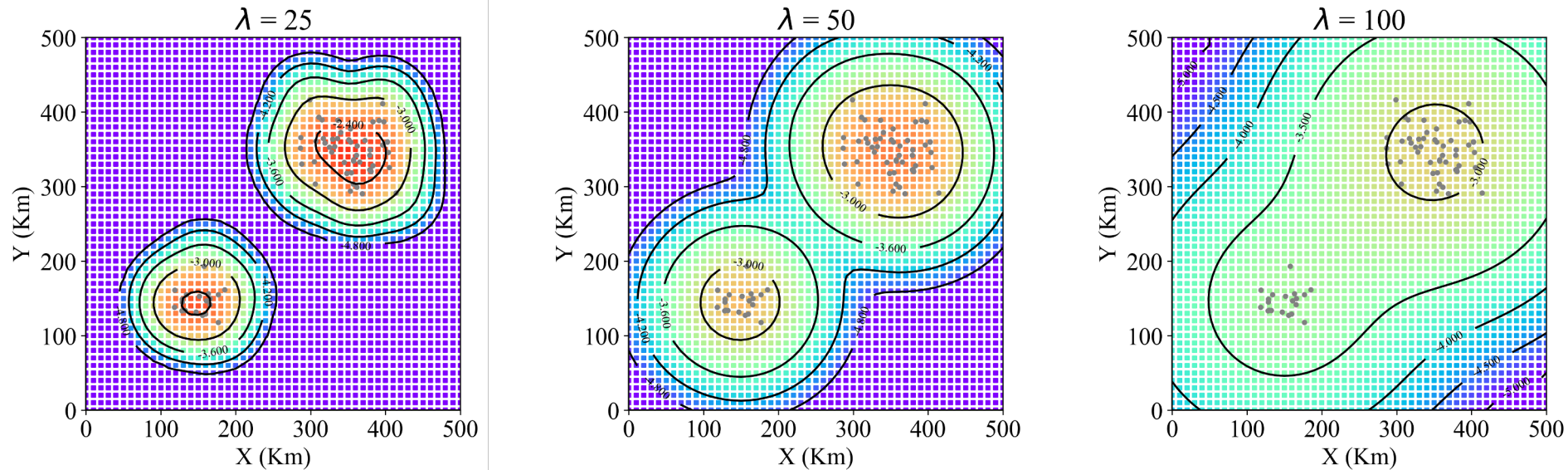
$$R_i = \frac{W_i}{\sum_{k=1}^{N_{tot}} W_k} R$$
$$W_i = \sum_{j=1}^{E_{tot}} e^{-0.5 \left( \frac{D_j}{\lambda} \right)^2}$$

In this approach, total occurrence rates ( $R=10^a$ ) are redistributed on a uniform grid (i) by weighting the relative distance (D) of the grid cell to the surrounding earthquake events (j).



# Smoothed Seismicity Model

The level of smearing of the rates is controlled by smoothing length parameter ( $\lambda$ ), which reflects the belief in the actual observed seismicity pattern. To account for the variability of  $\lambda$ , three different values are used for each zone.

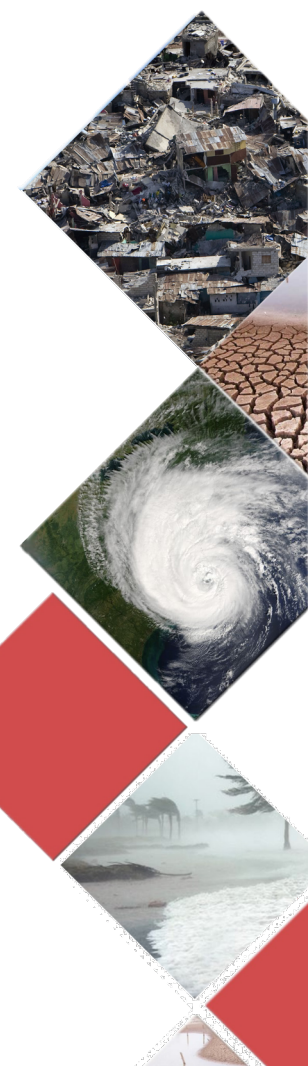
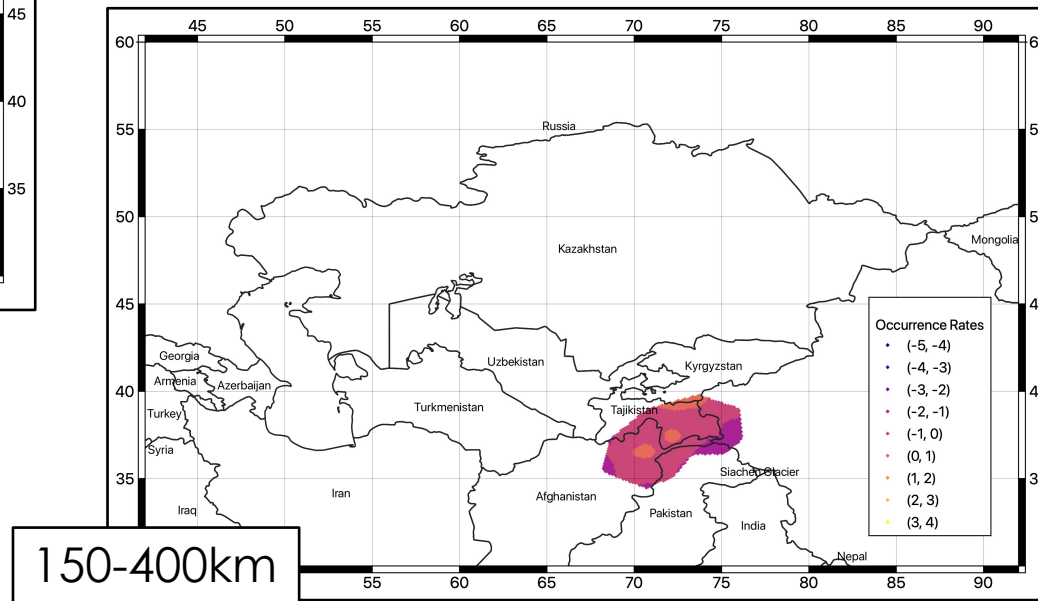
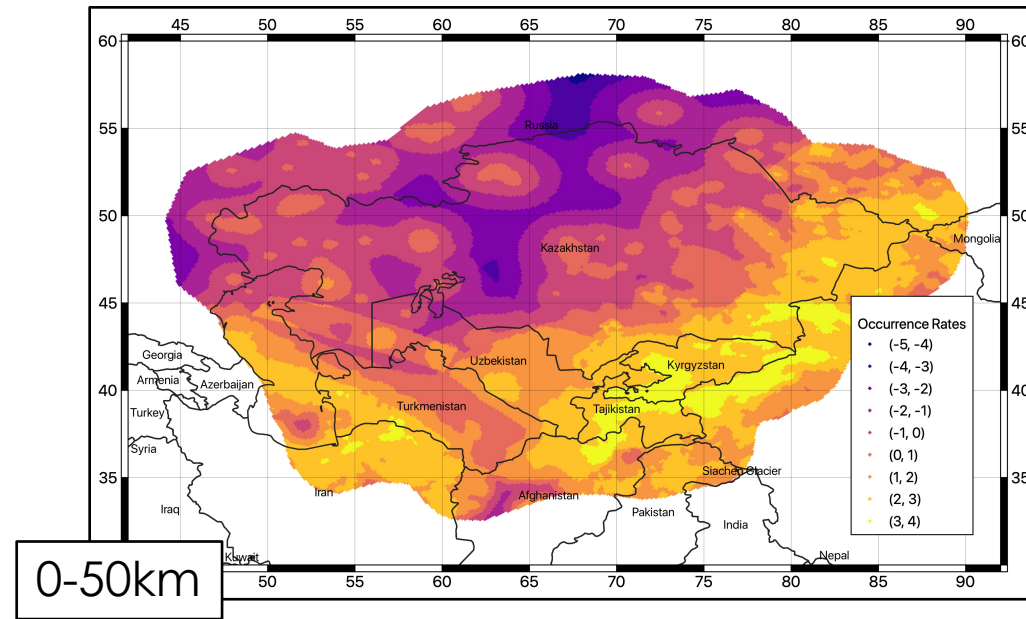
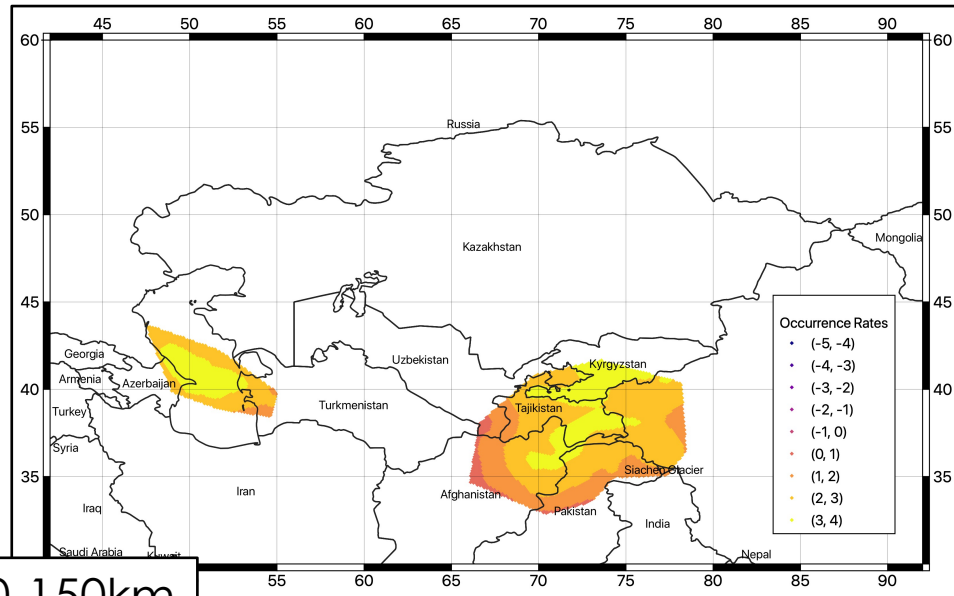


A different combination of smoothing length is also used for high and low activity zones, to avoid the development of “bull-eye” effect.



# Smoothed Seismicity Model

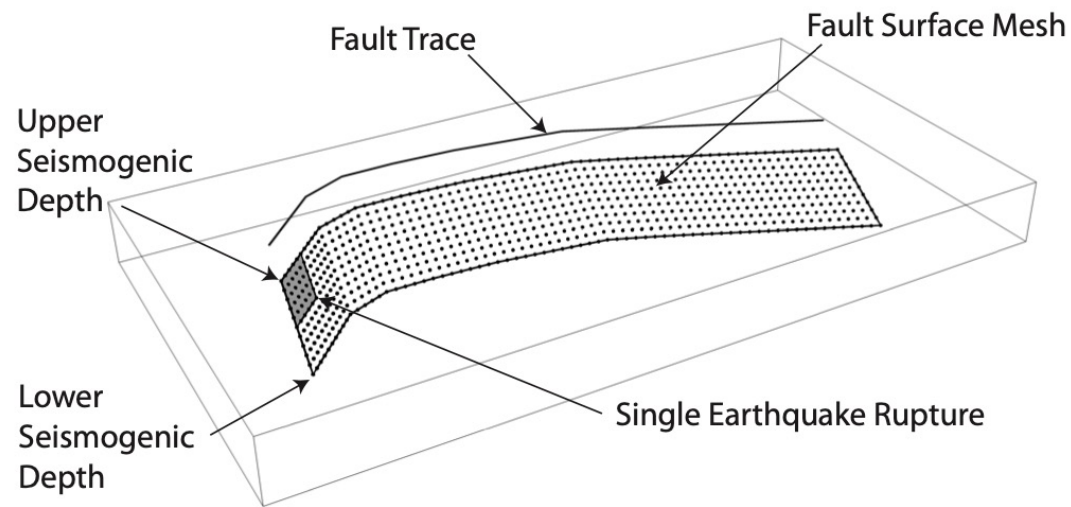
Smoothing procedure applied separately to the shallow, intermediate, and deep seismicity layers.



# 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.



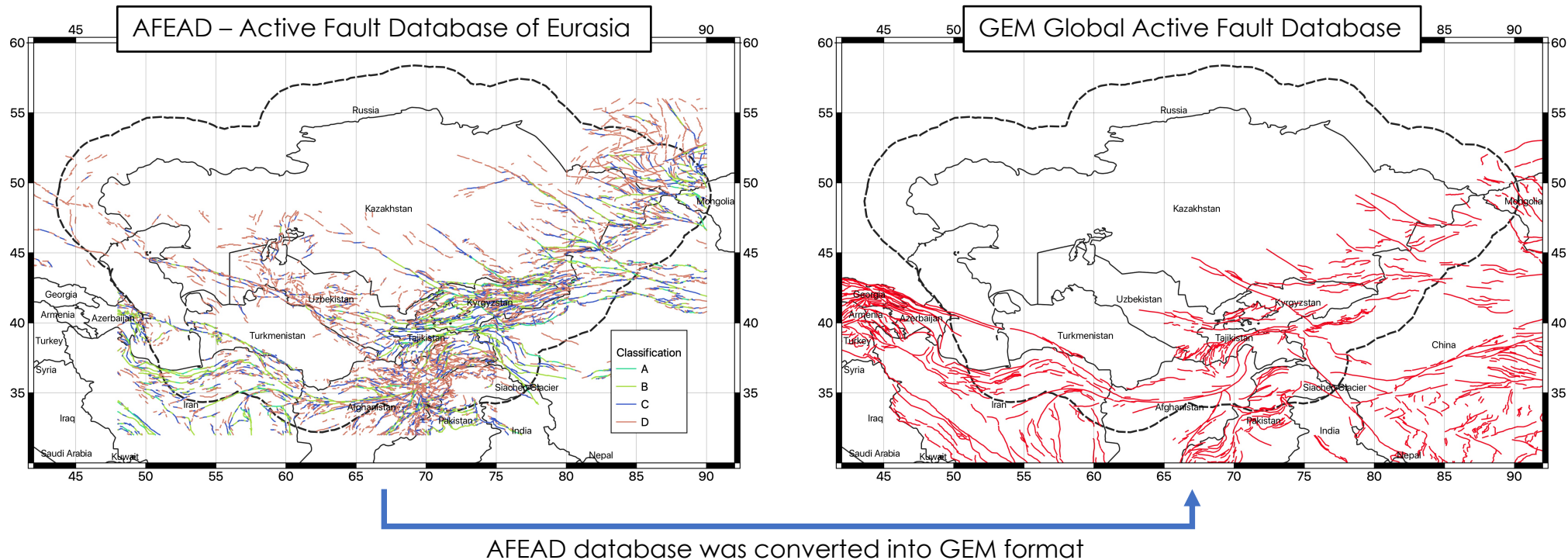
modified from "the OpenQuake-engine book: underlying hazard science"

In OpenQuake, finite faults can be approximated by shifting the fault trace from the Earth's surface to the lower seismogenic depth with an inclination equal to the dip angle.



# Regional Active Fault Datasets

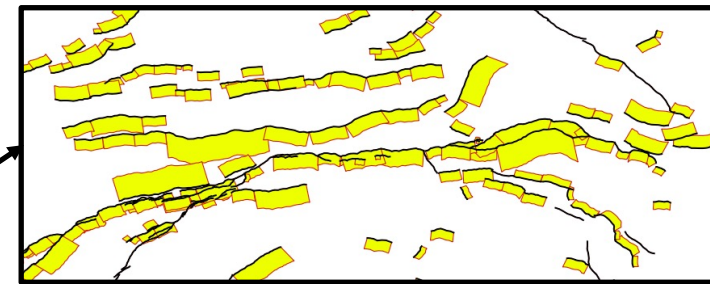
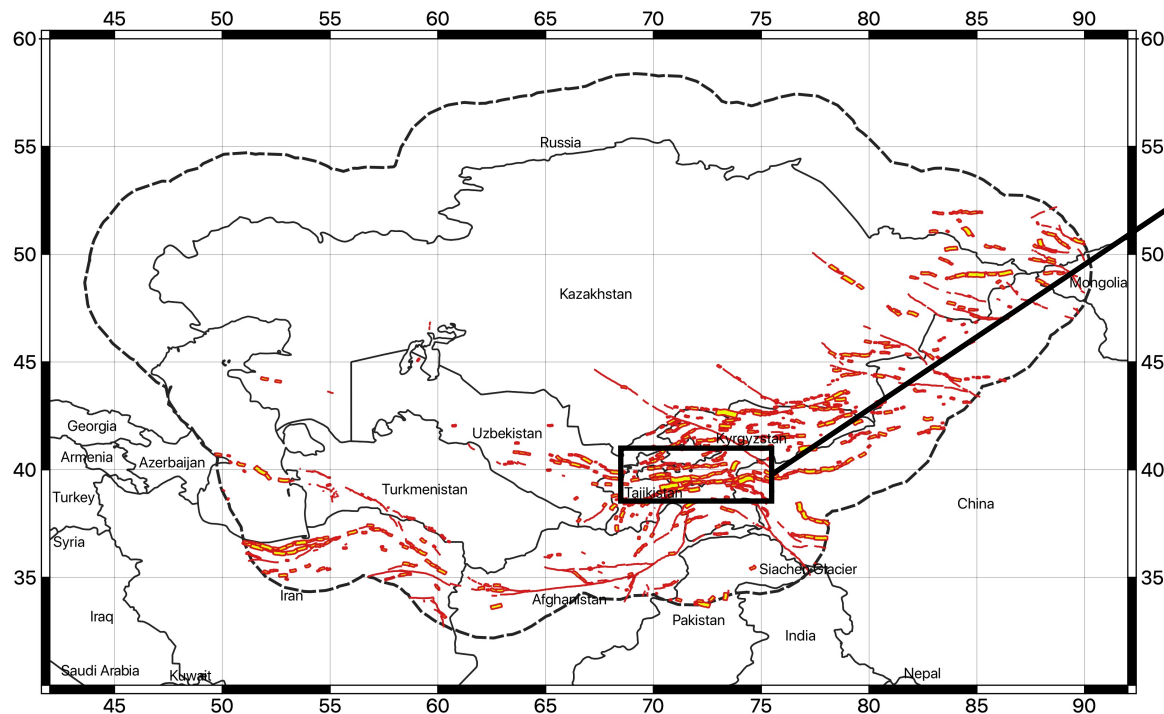
At regional level, the most significant existing compilations are the **GEM Global Active Fault Database** (GEM GAF-DB, Styron and Pagani, 2020) and the **Active Fault Database of Eurasia** (hereinafter AFEAD, Bachmanov et al., 2017), which review and summarize most of the information available from published scientific studies for the target area.



# The Fault Source Model

The fault source model presently contains 1444 individual fault segments, covering the most part of the active shallow crust presently interested by active seismicity.

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



A **background seismicity layer** with magnitude cut-off of 6 was also included to complement the fault source model.

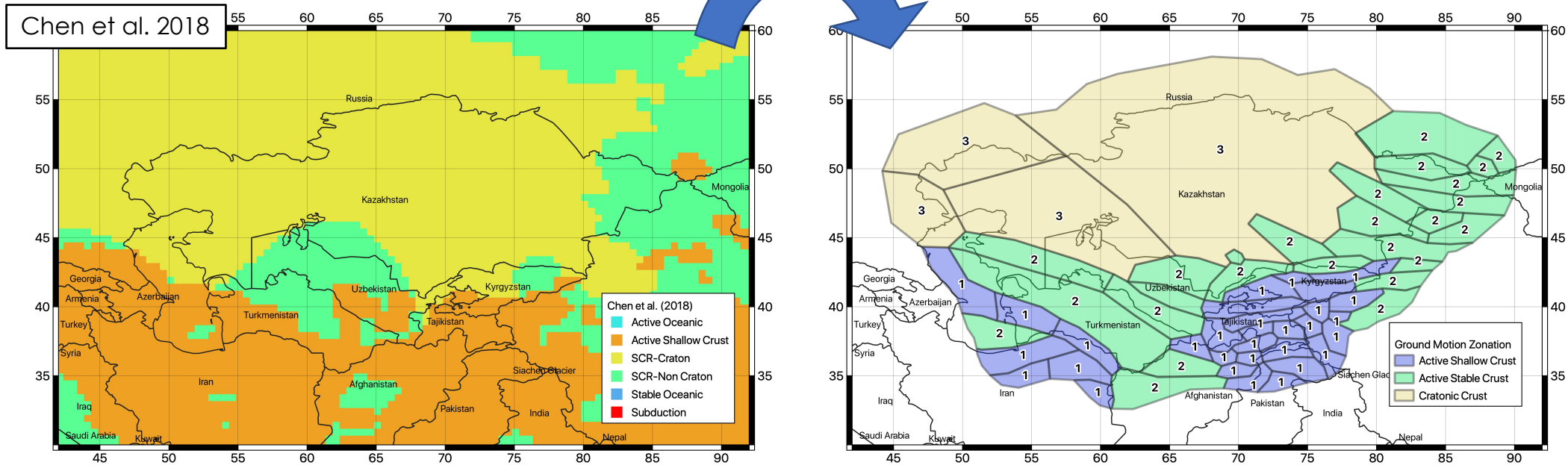




# Tectonic Regionalization

To account for the variability of the ground motion attenuation across the region, a regionalization zonation was performed based on the classification proposed by Chen et al. (2018), which combines seismological, geological and geophysical data from worldwide datasets.

Three **tectonic region types (TRT)** were defined for shallow crust conditions, plus a fourth region for the deep source zones.



# GMPE Selection

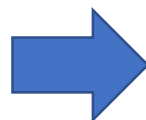
Ground motion models compatible with the identified TRT have first been isolated from the ground motion model library of OpenQuake (the HazardLib).

Following the selection criteria recommended by Cotton et al. (2006) and the recommendations by the local experts of the consortium, the number of suitable models was then restricted to the five most representative for the study region:

Tectonic Id	Ground Motion Model	Weight
AS	Campbell and Bozorgnia (2014)	0.5
	Chiou and Youngs (2014)	0.5
SC	Pezeshk et Al. (2011)	0.5
	Atkinson and Boore (2006) – Modified 2011	0.5
DS	Parker et Al. (2020) – for subduction interface	1



TRT weighting scheme



	AS	SC	DS
TRT 1	1	0	0
TRT 2	0.5	0.5	0
TRT 3	0	1	0
TRT 4	0	0	1

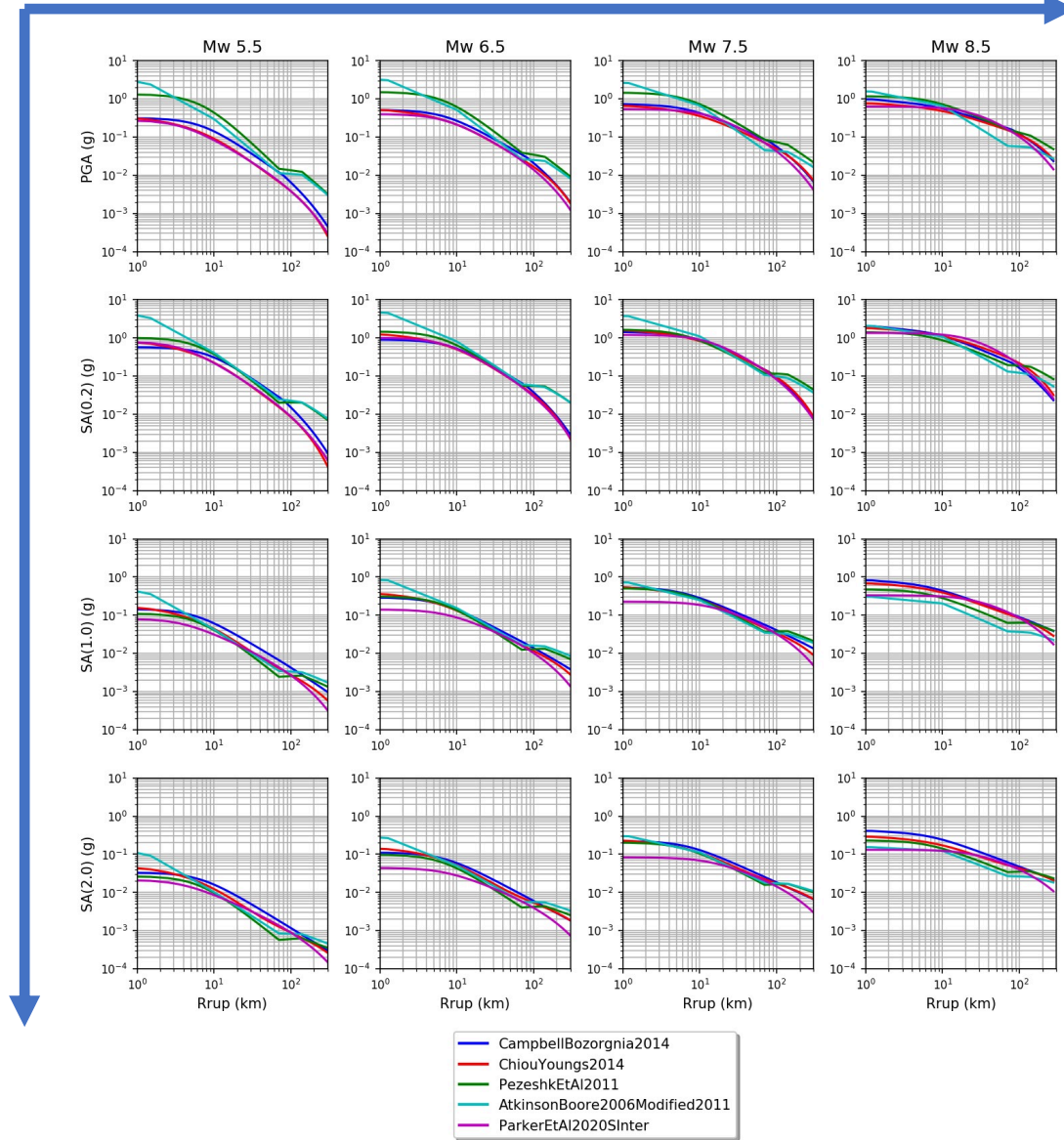


# GMPE Performances

The performances of the ground motion prediction models were tested for various magnitude, distance and intensity measure type combinations by means of Trellis plots.

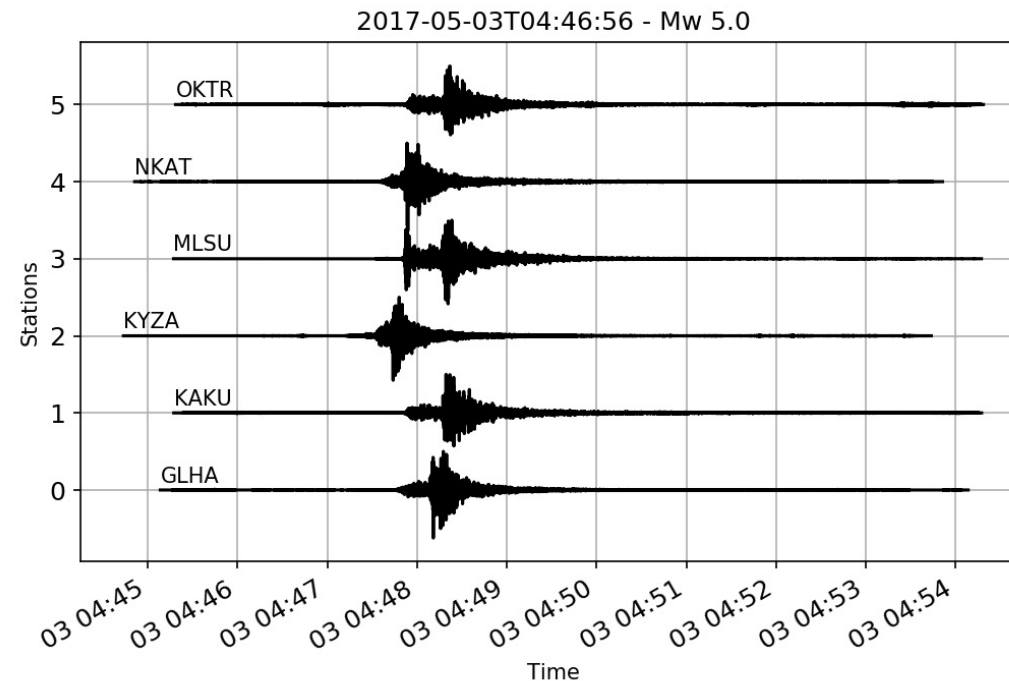
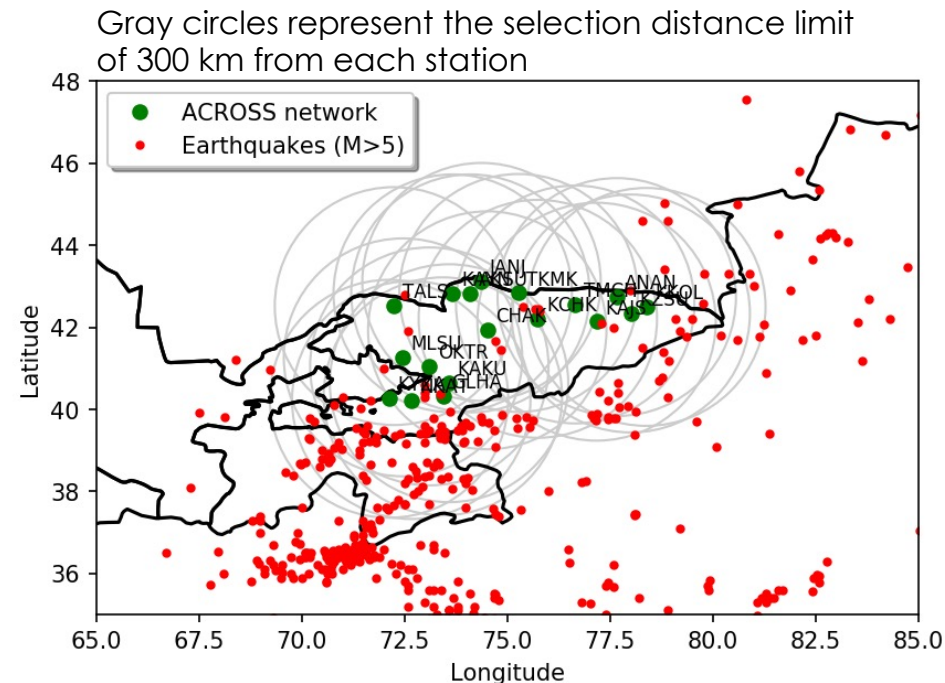
Magnitude (Mw)

IMT  
(Periods)



# Strong Ground Motion Recordings

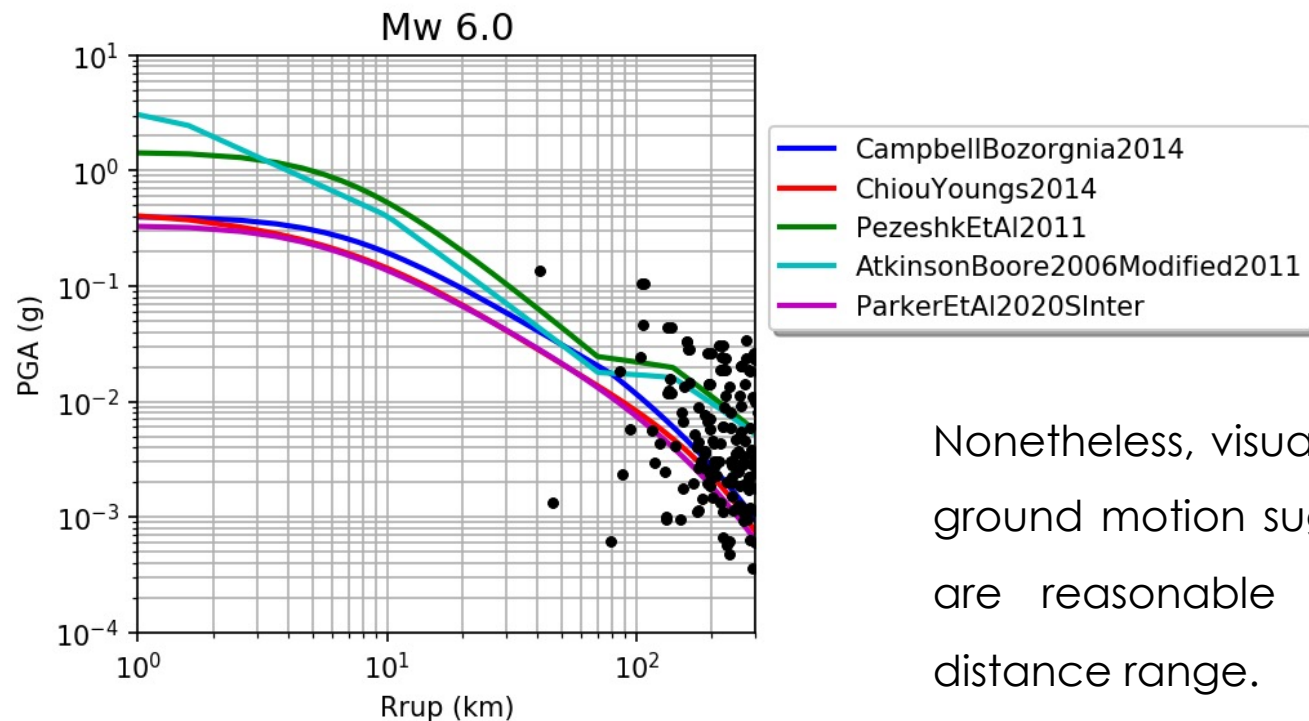
The ACROSS network (Parolai et al., 2017) was developed and it is currently maintained by *Helmholtz GeoForschungsZentrum (GFZ, Potsdam)* in cooperation with the Central Asian Institute for Applied Geosciences (CAIAG). It consists of 18 three-channel accelerometric stations deployed in Kyrgyzstan and operating since 2005.



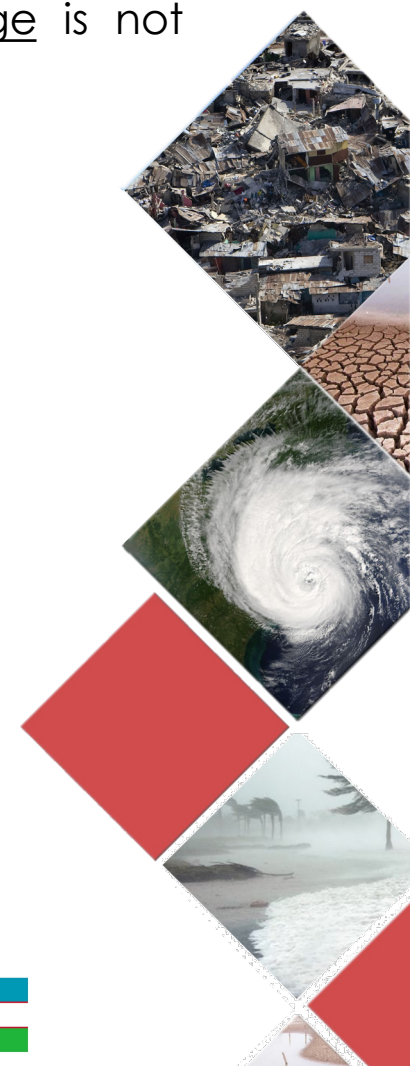
# Empirical Verification of Attenuation Models

Of 708 identified regional events with magnitude larger than 5, 35 events ( $5 < M_w < 6.6$ ) were recorded from the network within 300 km from the stations, for a total of 153 three-components waveforms.

Unfortunately, the number of waveform recordings in a significant magnitude-distance range is not sufficient for the objective validations of the selected GMPE models.

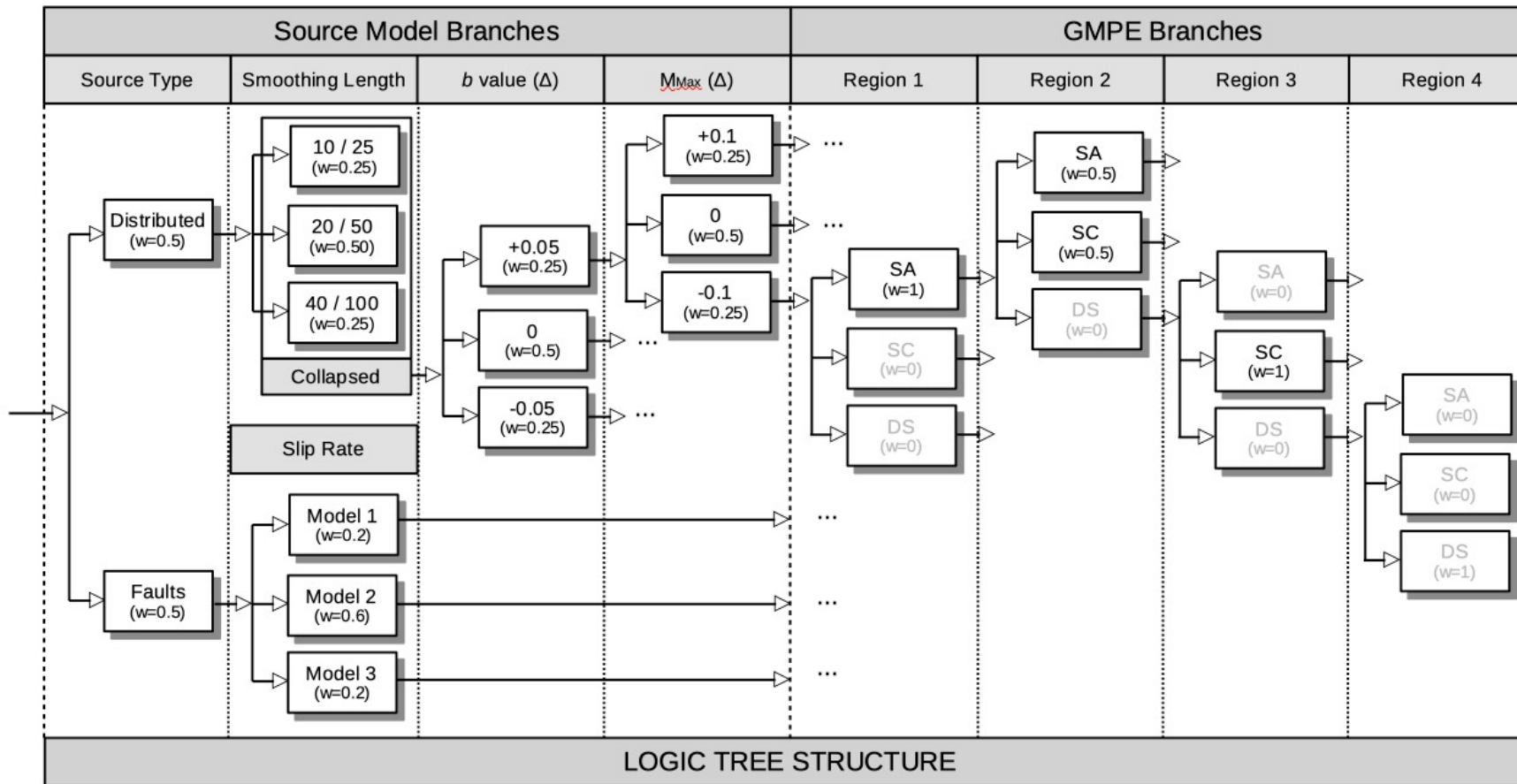


Nonetheless, visual comparison with the predicted ground motion suggests that the selected models are reasonable in the intermediate to large distance range.



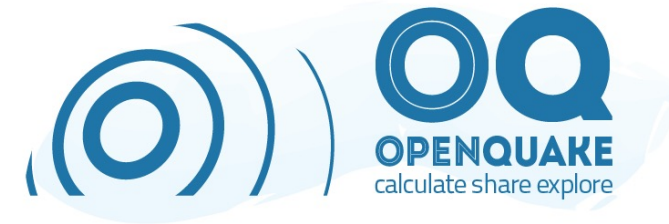
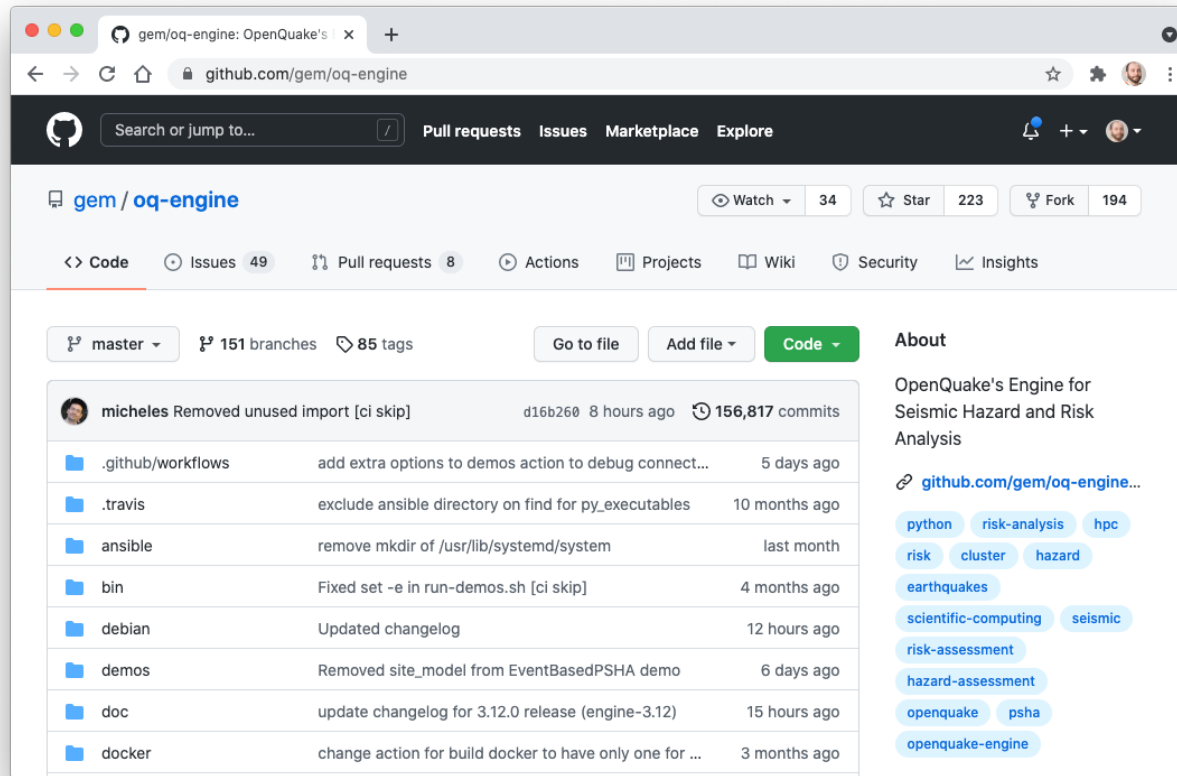
# Epistemic Uncertainty and Logic Tree

Logic-tree is split between the two main components: source uncertainty (source type, rates, b-value and  $M_{Max}$ ) and ground motion modelling variability (including GMPE regionalisation).



# Hazard Calculations

All calculations for this study were performed using Version 3.11 of the **OpenQuake engine** (Pagani et al., 2014), an open-source seismic hazard and risk calculation software developed, maintained, and distributed by the Global Earthquake Model (GEM) Foundation.

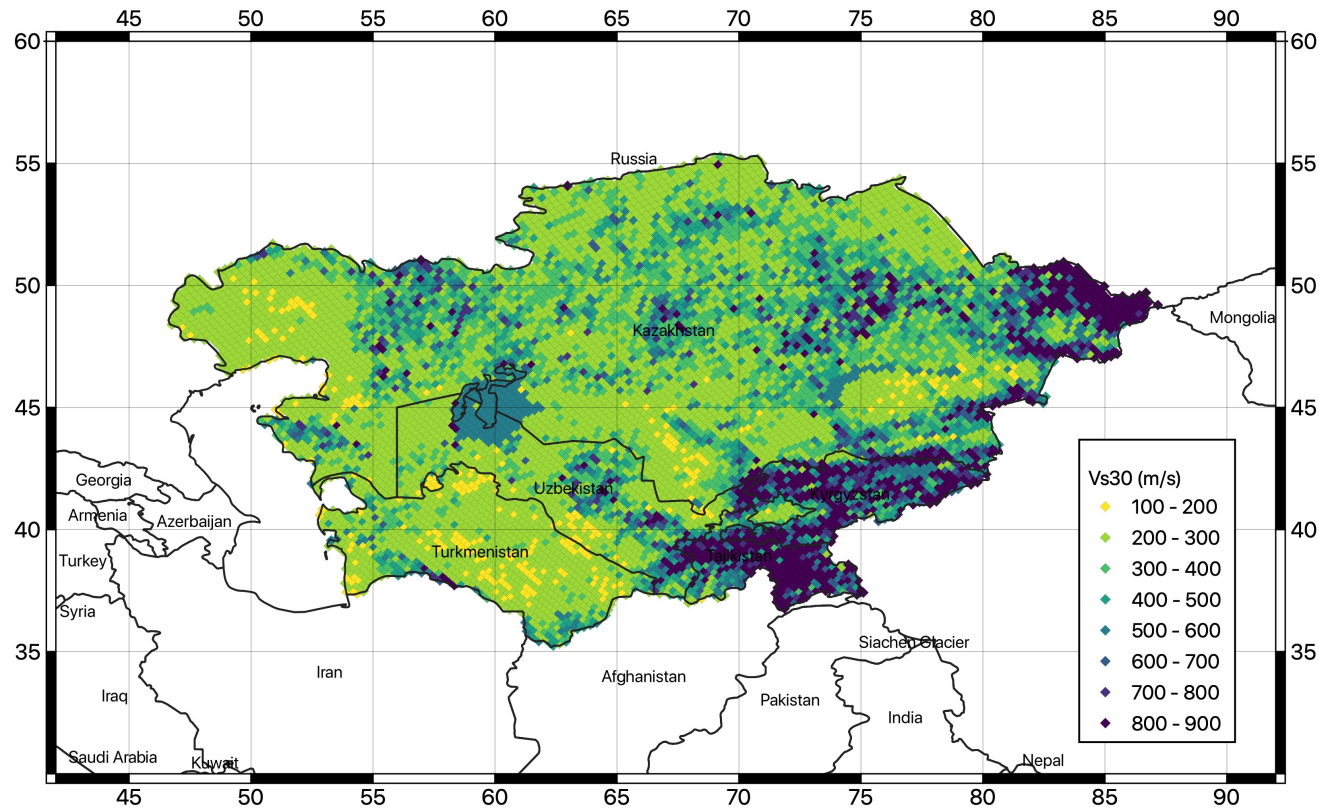


<https://github.com/gem/oq-engine/tree/engine-3.11>



# Hazard Calculations

Calculations are performed on a mesh of 8028 sites with 0.2 degrees spacing (about 20 km). Free rock conditions are assumed, with a fixed 30-metre averaged shear-wave velocity ( $V_{s30}$ ) reference value of 800 m/s (class A).



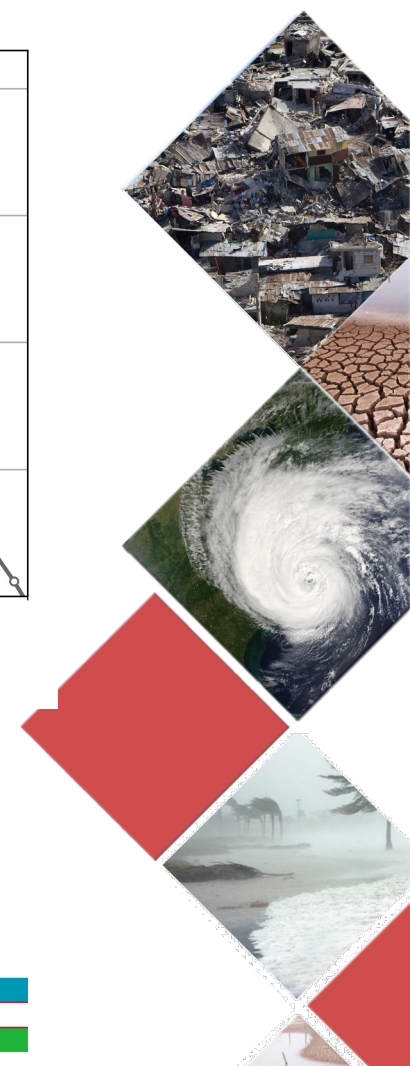
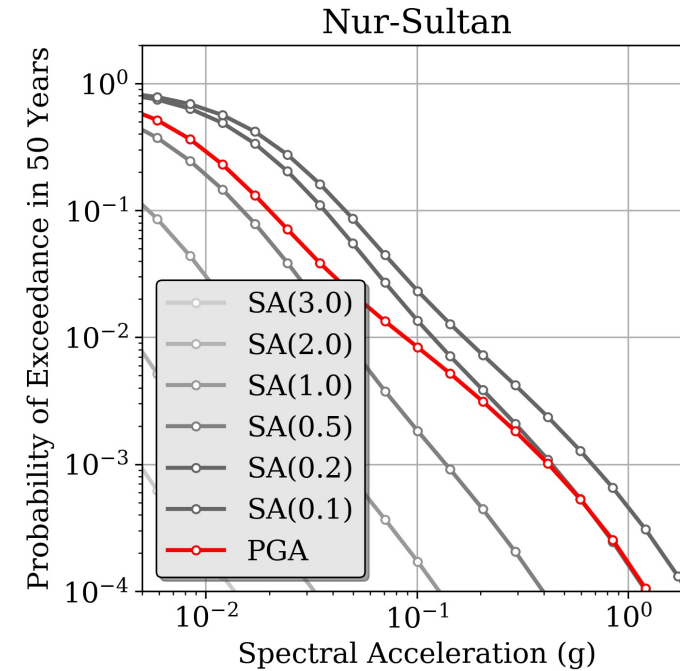
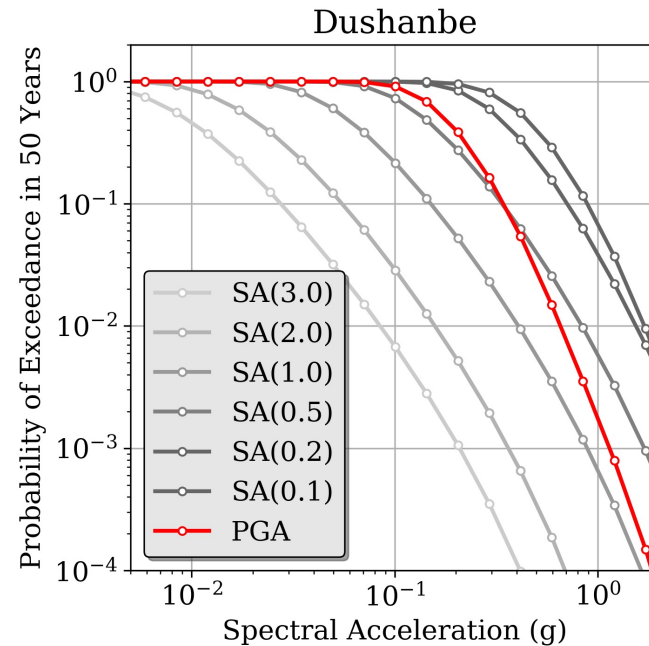
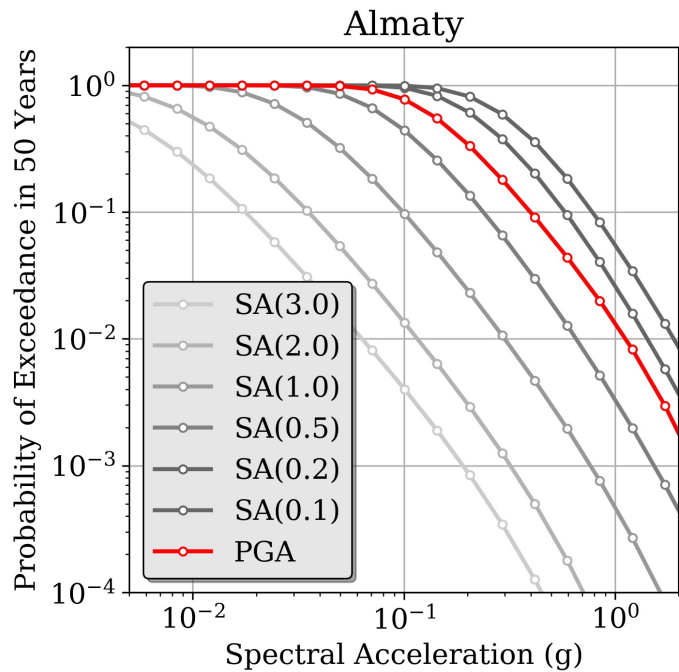
Risk calculation will be computed using site specific ground motion, by using the local slope-based  $V_{s30}$  value obtained from the global USGS  $V_{s30}$  Map Server (Worden et al., 2015)





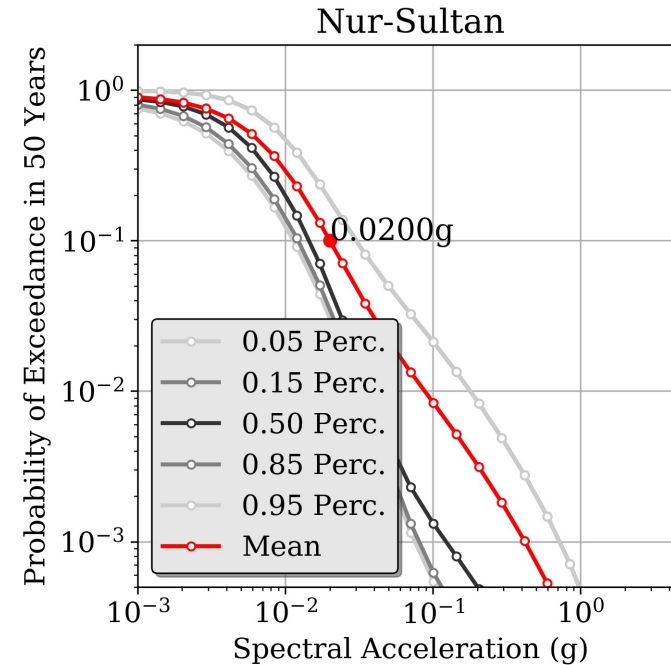
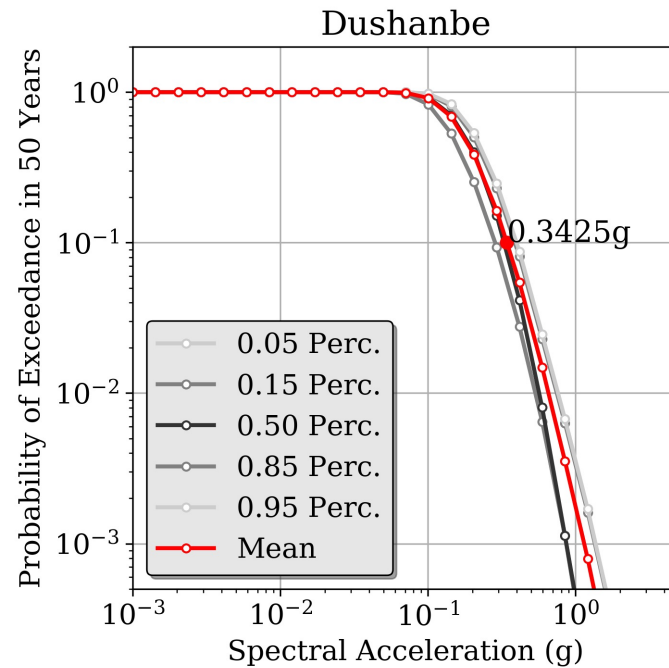
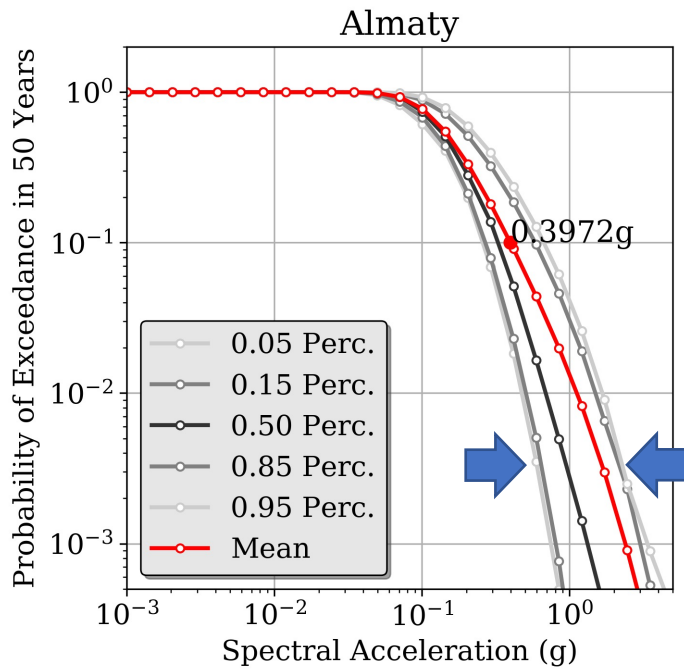
# Results: Hazard Curves

Hazard curves in ground motion probability of exceedance (PoE) for 50 year observation time are computed for PGA and for 5%-damped response spectral acceleration at 0.1s, 0.2s, 0.5s, 1s, 2s and 3s (vibration periods allowed by the selected ground motion models)

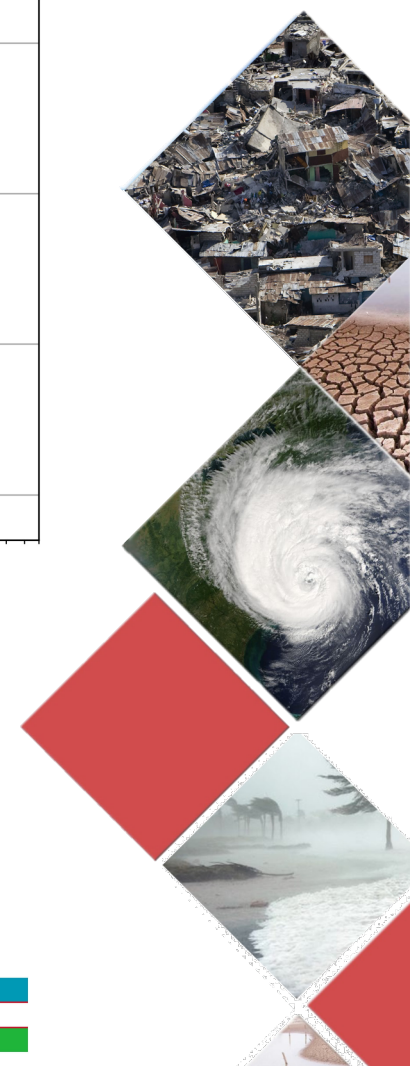


# Results: Hazard Curves (Uncertainty)

Mean and quantile (0.05, 0.15, 0.5, 0.85 and 0.95) hazard curves are computed separately for each intensity measure type (IMT) and at each site of the grid.

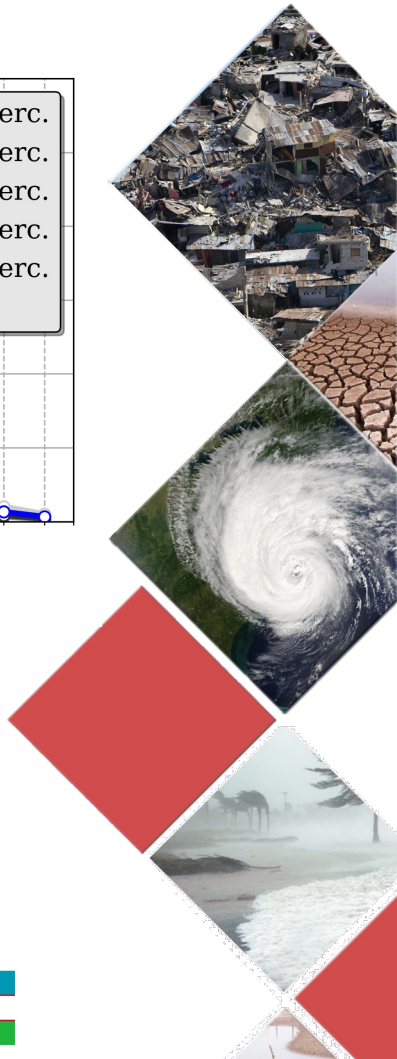
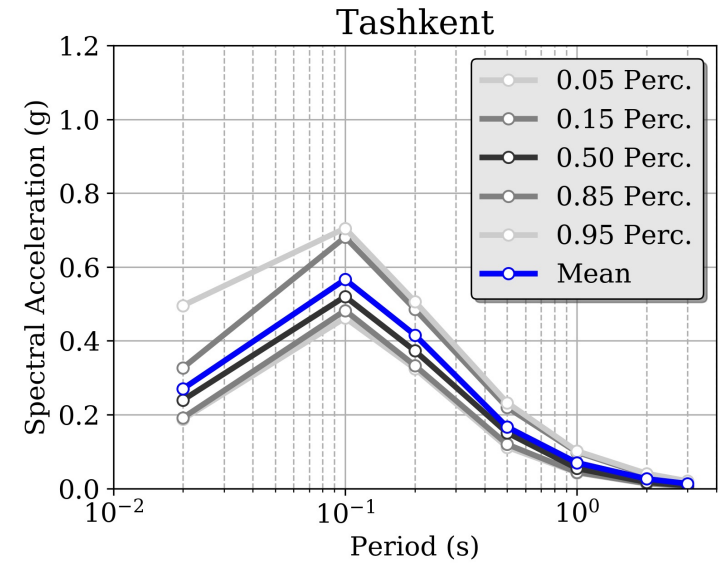
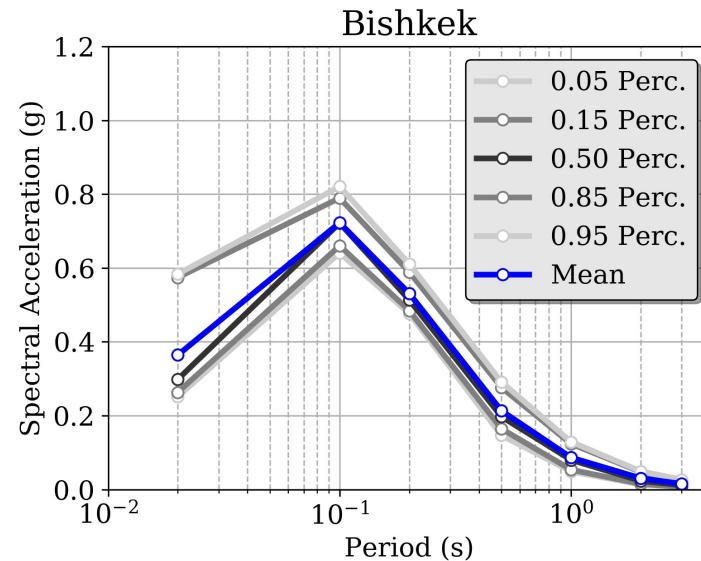
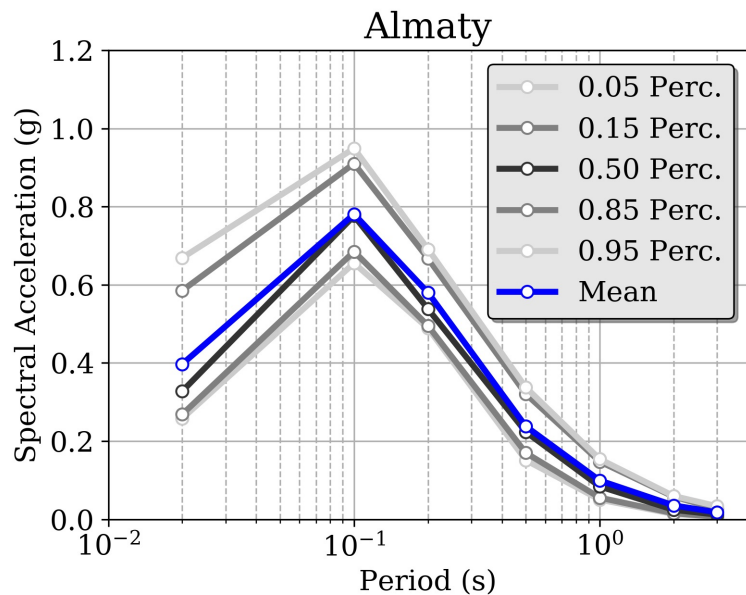


Uncertainty at Peak Ground Acceleration (PGA)

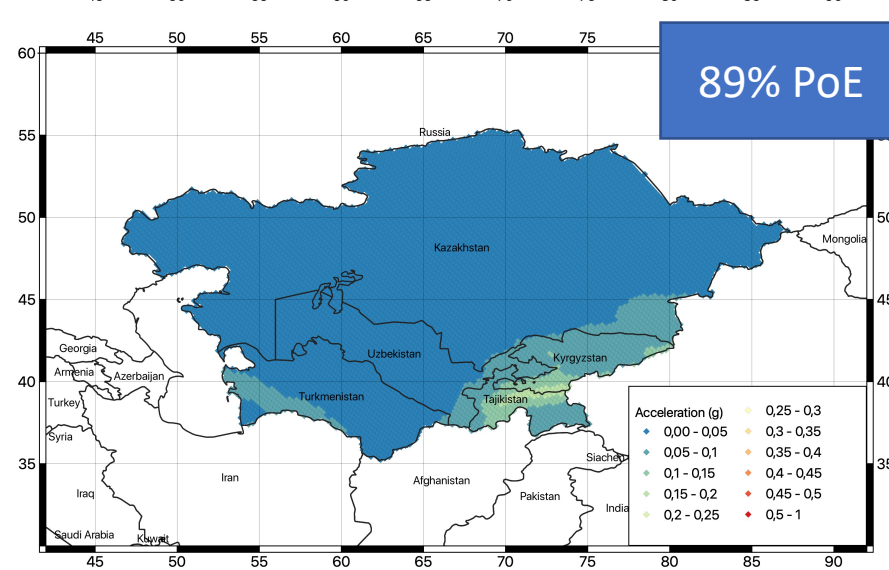
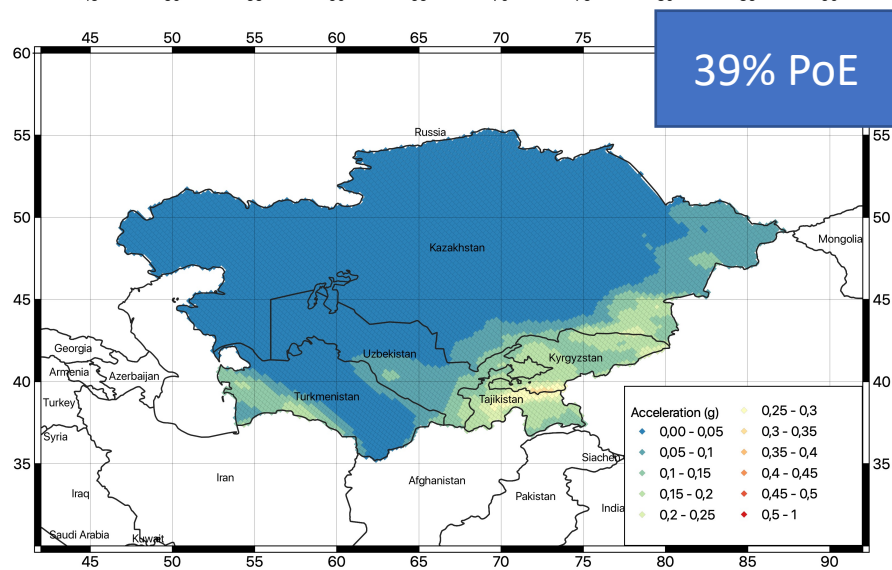
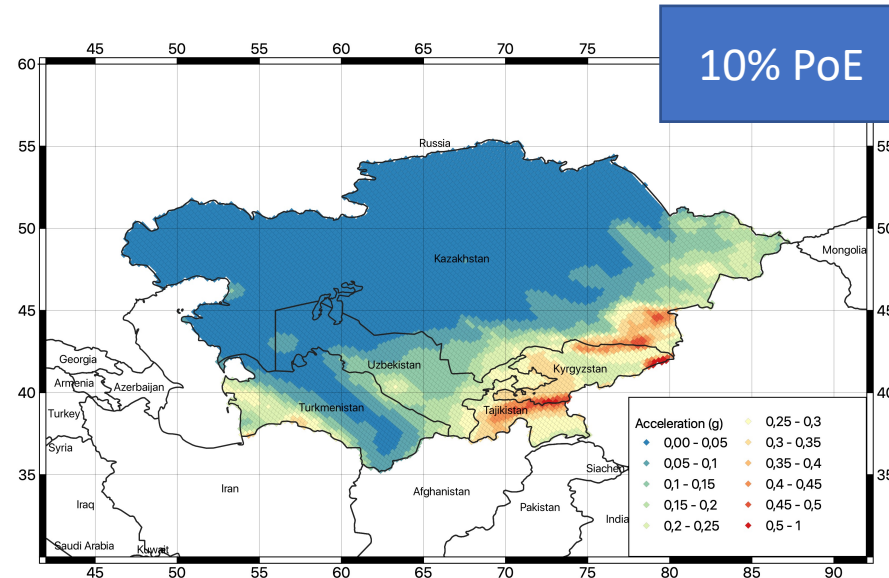
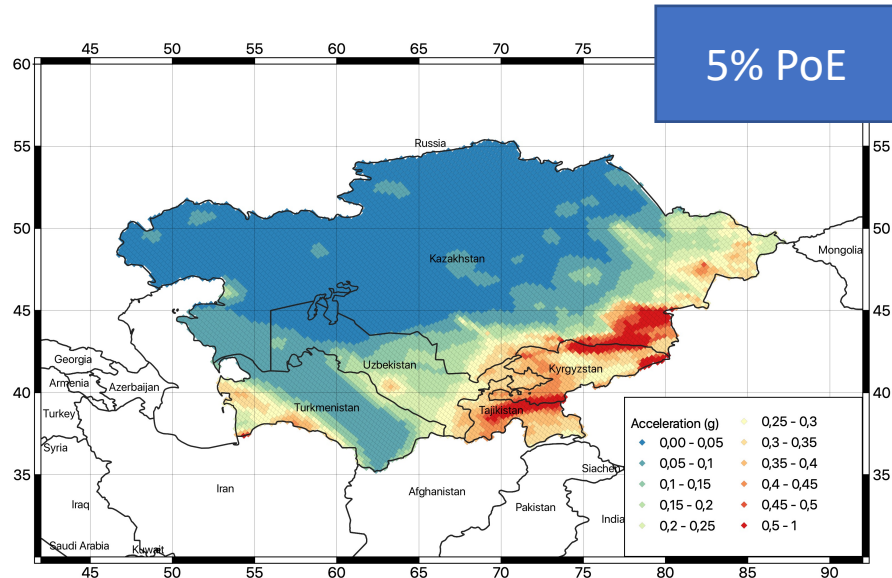


# Results: Uniform Hazard Spectra

Uniform Hazard Spectra are computed for return periods of 25, 50, 100, 250, 475, 500 and 1000 years, corresponding respectively to 86, 63, 39, 18, 10, 9 and 5% probability of exceedance in 50 years observation time (assuming a Poisson earthquake occurrence model)

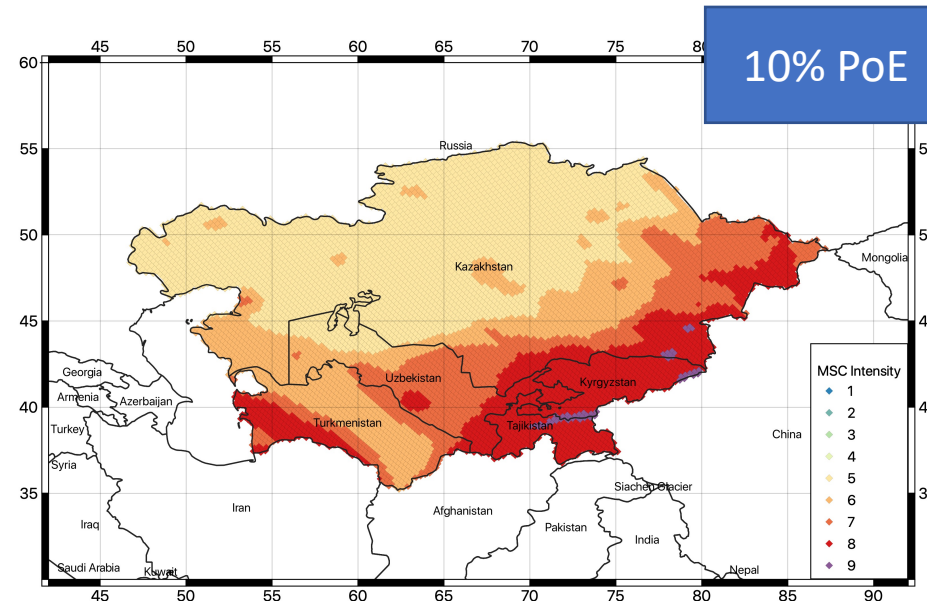
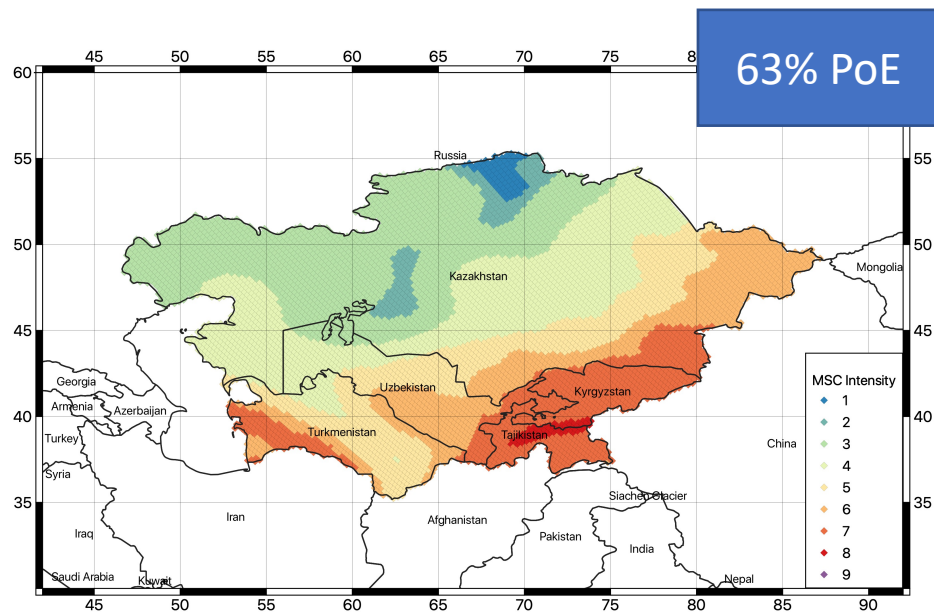


# Results: Hazard Maps



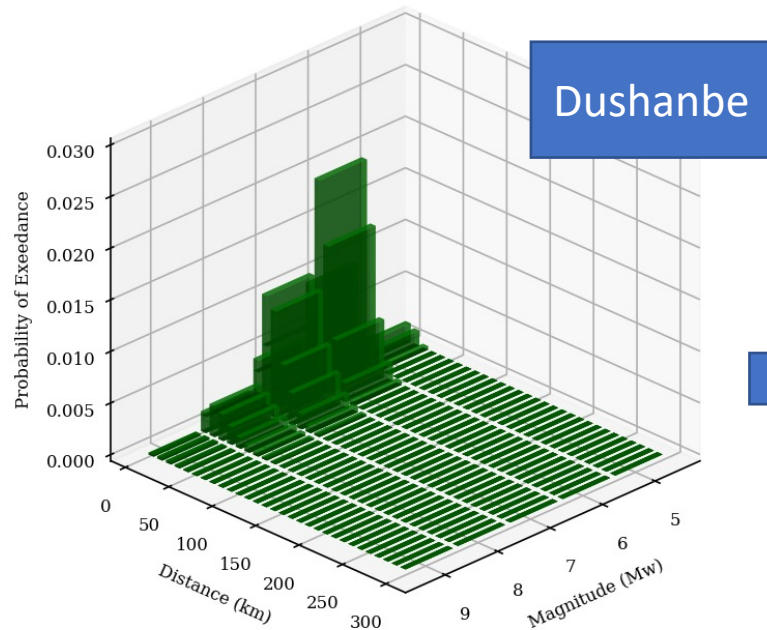
# Conversion to Intensity

To facilitate the comparison with previous hazard studies, hazard maps at the different return periods have been converted to intensity using the relation of Faenza and Michelini (2011) for MCS and Aptikaev (2012) for MSK.



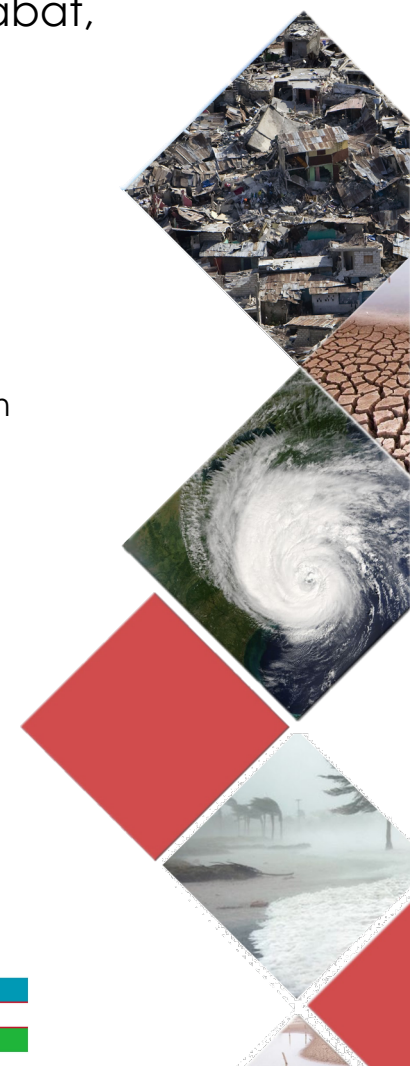
# Disaggregation of Hazard

To identify the controlling scenario for the stochastic event set calculation, **magnitude-distance disaggregation** was performed for all considered intensity measure types and return periods at six selected target sites, corresponding to the capitals of the five Central Asian countries (Ashgabat, Bishkek, Dushanbe, Nur-Sultan and Tashkent) plus the city of Almaty.



Controlling earthquake scenarios from magnitude-distance disaggregation

IMT	Dist. (Km)	Mag. (Mw)
PGA	15.0	5.5
SA(0.1)	25.0	5.5
SA(0.2)	15.0	5.5
SA(0.5)	15.0	5.5
SA(1.0)	25.0	6.5
SA(2.0)	15.0	6.5
SA(3.0)	15.0	6.5



# Key Aspects of the Central Asia PSHA Model

With respect to previous regional models, the proposed model is innovative in the following aspects:

- An new regional earthquake catalogue was assembled, harmonized between countries, and homogenized in moment magnitude ( $M_w$ ).
- A new seismogenic source zonation was developed, based on a rate-preserving smoothing kernel.
- A finite fault source model was derived from regional datasets and slip rate information.
- A new regionalized selection of ground motion models was defined in a new logic tree structure.

Moreover, the hazard model is meant to be a collaborative, open and transparent product, which is expected to be further extended and improved with the support of the local scientific community.

Source: <https://www.ebrd.com>



**Thank you very much for your attention!**

