# **Precision of Seismic Hazard Evaluations in Central and Eastern North America**

**R. K. McGuire** Lettis Consultants International, Inc., Boulder, Colorado



#### SUMMARY

For critical facilities such as nuclear power plants, multiple teams of experts are often used to provide inputs for seismic source characteristics, ground motion estimation, and site response. Alternative, weighted interpretations of these inputs leads to multiple estimates of annual frequencies of exceedance that characterize the mean, uncertainty, and range of seismic hazard. This study examines and quantifies the imprecision in past seismic hazard results from major studies in intraplate regions. Uncertainties in mean seismic hazard estimates are quantified using the statistical bootstrap technique applied to assigned weights of alternative inputs. Results are that the total coefficient of variation (COV) in mean seismic hazard is a minimum of 0.25 at a hazard of  $10^{-4}$ , 0.30 at a hazard of  $10^{-5}$ , and 0.35 at a hazard of  $10^{-6}$ . Uncertainty in site response is a small fraction of total COV, so these results apply to both rock and soil sites.

Keywords: seismic hazard, precision, bootstrap

# **1. INTRODUCTION**

This study describes the level of precision that can be associated with seismic hazard estimates, with specific application to central and eastern North America (CENA). By "level of precision" is meant how well constrained the calculated mean hazard is, with respect to epistemic uncertainty. This precision reflects how much the seismic hazard estimates might change, if the analysis were to be repeated with independent experts who have access to the same basic information (geology, tectonics, seismicity, ground motion equations, site characterization). If a dataset or interpretation were to change, and that change causes a change in the assessed seismic hazard at a site, the level of precision can be used to judge whether that change in hazard is significant or insignificant. Thus the question of significance is closely linked to the level of precision with which we can assess seismic hazard.

There are three fundamental sets of information that contribute to the precision of seismic hazard estimates, as follows:

- 1. Seismic sources and parameters, which may be derived by teams of experts or by individuals.
- 2. Ground motion equations, which are generally derived by a single expert or team using available equations, but sometimes are derived by multiple experts.
- 3. Site response estimates, which are generally derived by a single expert, but sometimes are derived by multiple experts.

A realistic assumption can be made that, for seismic hazard analysis at a site, these information inputs are separate and independent. It is understood that ground motion equations are developed for a wide range of magnitudes and distances, and that site response estimates are developed for a wide range of input motions. Additionally, it is assumed that we are interested in the precision of the *mean* seismic hazard curves, rather than any particular fractile. The mean seismic hazard curve is recommended to derive seismic design levels for facilities (McGuire, Cornell, and Toro, 2005).

Estimates of the precision in mean hazard (mean annual frequency of exceedance) associated with each of these inputs can be made by examining existing seismic hazard results from published studies. Examples are given below for peak ground acceleration (PGA) and 1 Hz spectral acceleration; results for other spectral frequencies are reported in (CEUS-HS 2012).

## 2. CONCEPT

The underlying concept in calculating precision estimates is to examine the epistemic uncertainty in hazard caused by team-to-team variations or expert-to-expert variations in hazard from documented studies. For example, if 6 teams are used to derive seismic sources for a hazard estimate, there will be a distribution of total hazard (i.e., annual frequency of exceedance) for a given ground motion amplitude. This distribution of total hazard will have a standard deviation  $\sigma_{TH}$  caused by team-to-team variability, and this standard deviation can be calculated using the conditional total hazard curves for each team. The uncertainty in *overall mean* hazard  $\sigma_{MH}$  caused by the different seismic source interpretations is  $\sigma_{MH} = \sigma_{TH}/\sqrt{6}$ , assuming the teams' hazard estimates are uncorrelated. We put aside questions of team-to-team correlation that result from common data sets, availability of published papers, and similar items, because this correlation is a condition under which we are evaluating the precision of hazard. Similar "independent" teams would have access to the same data sets and published papers.

Because the absolute value of hazard varies over several orders of magnitude, we use as a measure of precision the coefficient of variation (COV) of the mean hazard. The COV is the calculated standard deviation of mean hazard ( $\sigma_{MH}$ ) divided by the mean hazard. When used in this sense, the coefficient of variation is designated COV<sub>MH</sub>.

## **3. UNCERTAINTIES FROM AREAL SEISMIC SOURCES**

Figure 1 shows the calculated  $\text{COV}_{\text{MH}}$  as a function of mean hazard for PGA at 7 test sites studied in (CEUS 2012), using seismic sources documented in (EPRI 1989). These  $\text{COV}_{\text{MH}}$  were calculated at the 7 test sites using only hazard from the six team interpretations of seismic sources and do not including hazard from the New Madrid and Charleston sources of large earthquakes. At some sites (e.g. Manchester), area sources dominate the hazard. At other sites (e.g. Savannah), the hazard is dominated by the potential of large, nearby earthquakes, because the site lies very close to one of these zones (the Charleston seismic zone, in the case of Savannah) and the area sources contribute relatively less hazard.  $\text{COV}_{\text{MH}}$  tends to increase with decreasing annual frequency; between  $10^{-4}$  and  $10^{-6}$  (the mean hazard range of interest) it ranges from about 0.15 to 0.4.



**Figure 1.**  $COV_{MH}$  from EPRI-1989 team sources vs. mean seismic hazard (i.e., mean annual frequency of exceedance) for seven test sites, for PGA.

Figure 2 shows COV<sub>MH</sub> vs. mean hazard for PGA and 1 Hz spectral acceleration at four Swiss sites (i.e., Beznau, Goesgen, Liebstadt, and Muehlberg) studied during the PEGASOS project (NAGRA 2004). In this project, four experts developed areal seismic source interpretations, and Figure 2 plots COV<sub>MH</sub>, calculated from the standard deviation of hazard  $\sigma_{MH}$  at each amplitude, as  $\sigma_{MH} = \sigma_{TH}/\sqrt{4}$  because there were four experts who provided seismic source interpretations. For mean annual frequencies in the range  $10^{-4}$  to  $10^{-6}$ , COV<sub>MH</sub> ranges from about 0.13 to 0.3, with one set of results (PGA for Goesgen) falling as low as 0.05 (see the solid blue curve in Figure 2).

The conclusion from Figures 1 and 2 regarding imprecision in seismic hazard estimates for area seismic sources is that typical  $COV_{MH}$  values will range from about 0.15 at a mean annual frequency of  $10^{-4}$  to perhaps 0.3 at a mean annual frequency of  $10^{-6}$ , with some sites (e.g. Chattanooga in Figure 1 and Goesgen PGA in Figure 2) falling outside that range.



**Figure 2.**  $COV_{MH}$  from seismic source experts (PEGASOS project) vs. mean hazard for PGA and 1 Hz spectral acceleration.

## 4. UNCERTAINTIES FROM SOURCES OF LARGE EARTHQUAKES

For seismic hazard calculations in CENA, two sources of repeated large (**M** 7-7.5) earthquakes are the Charleston seismic zone and the New Madrid seismic zone. Herein this type of source is designated a "large EQ source." Nuclear plant seismic hazard studies have relied on two interpretations for these large EQ sources: The WLA model (Southern Nuclear Co, 2008) for the Charleston seismic zone and the Geomatrix model (Exelon Generation Co, 2003) for the New Madrid seismic zone. As an example, a general representation of the logic tree representing uncertainties in the Charleston seismic zone model is given in Table 4.1. For many sites in the southeastern US, seismic hazard is dominated by this source, rather than by local area sources. It is reasonable that there is uncertainty in the mean hazard coming from the source of large earthquakes, even though there is only one interpretation of epistemic uncertainty (e.g. Table 4.1).

Interpretation	Alternatives	Weight on alternatives	Designation*
Geometry of source	4 geometries	0.7, 0.1, 0.1, 0.1	GEOM
Maximum magnitude	5 values	0.1, 0.25, 0.3, 0.25, 0.1	Mmax
Paleoseismic record length	2 periods	0.8, 0.2	SEIS
Activity rate given record	5 rates	0.1, 0.2, 0.4, 0.2, 0.1	RATE

Table 4.1. Summary of logic tree representing uncertainties for the Charleston seismic zone

\*Designation of curves in Figures 3 and 4.

An independent evaluation by another investigator might assign somewhat different weights than those shown in Table 4.1. To determine what might be the effect of alternative weights, an adaptation of the statistical bootstrap technique (e. g. Efron, 1982) was used. This application has the underlying assumption that the weights given to alternative interpretations (e.g. in Table 4.1) are variables with distributions. It is reasonable that, to estimate a *minimum* variation on the weights given in Table 4.1, we should pick a  $COV_{WT}$  for the weights that corresponds to a change of 0.1 in the highest weight among the alternatives for each interpretation, because this is the precision with which weights were assigned. Designating this coefficient of variation  $COV_{WT}$ , we calculate the following values:

Source Geometry:	$COV_{WT} = 0.1/0.7 = 0.143$
Maximum magnitudes:	$COV_{WT} = 0.1/0.3 = 0.333$
Paleoseismic record length:	$COV_{WT} = 0.1/0.8 = 0.125$
Activity rate given record:	$COV_{WT} = 0.1/0.4 = 0.25$

The statistical bootstrap method consisted of generating random weights for the alternative interpretations given in Table 4.1, using the listed values as mean values and using the  $COV_{WT}$  given above to calculate standard deviations for the weights. A normal distribution for weights was assumed, truncated at 0 and 1. For each interpretation, the random weight for the alternative with the highest mean weight was generated first, and weights for the other alternatives followed. The values of these other weights are not independent, but depend on previously generated weights. In particular, they must sum to unity. Other dependencies are indicated in (CEUS-HS 2012).

The total mean hazard (annual frequency of exceedance) is the sum of weighted hazards from the available alternatives. For example, for the alternative geometries with 4 alternatives,

$$mean (H) = W_1 H_1 + W_2 H_2 + W_3 H_3 + W_4 H_4$$
(1)

where the  $H_i$ 's are the mean hazard conditional on geometry i. In the current context, the  $H_i$ 's are constant and the  $W_i$ 's are random variables, so that,

$$mean (H) = \Sigma_i E[W_i]H_i$$
(2)

(where E[.] indicates expectation) and

$$\sigma_k^2(\mathbf{H}) = \Sigma \sigma_i^2 \mathbf{H}_i^2 + 2 \Sigma_i \ \Sigma_{j>i} \mathbf{H}_i \mathbf{H}_j \operatorname{cov}(\mathbf{W}_i, \mathbf{W}_j)$$
(3)

where  $\sigma$  is standard deviation, *cov* is covariance, k indicates a specific interpretation from Table 4.1, and the  $\sigma_i$ 's,  $H_i$ 's, and  $W_i$ 's are with respect to alternatives for that interpretation. The  $W_i$ 's are correlated because, for example, a higher-than-mean value of  $W_1$  will generally be associated with lower-than-mean values of the other  $W_i$ 's, since they must sum to unity. The covariance of the  $W_i$ 's can be estimated from samples generated using the bootstrap technique.

To calculate the total variance of the mean hazard (designated here as  $\sigma_{MH}^2$ ), we assume that the contributions from the 4 alternatives in Table 4.1 are independent. This is an explicit assumption in the logic tree summarized in Table 4.1, e.g. the maximum magnitude alternatives and weights apply to all geometries. Under this independence assumption,  $COV_{MH}$  can be estimated as:

$$\operatorname{COV}_{\mathrm{MH}}^{2} \simeq \operatorname{COV}_{\mathrm{GEOM}}^{2} + \operatorname{COV}_{\mathrm{Mmax}}^{2} + \operatorname{COV}_{\mathrm{SEIS}}^{2} + \operatorname{COV}_{\mathrm{RATE}}^{2}$$
(4)

where Eq. (4) neglects cross-product terms involving the COVs that are small.

Figure 3 shows  $\text{COV}_{K}$  (where K represents GEOM, Mmax, SEIS, and RATE from Table 4.1) and  $\text{COV}_{MH}$  for PGA for the Charleston source, calculated for a site located at Columbia, South Carolina. It is evident that the alternative Mmax distribution dominates the uncertainty in mean hazard, except at low amplitudes (i.e., at high annual frequencies of exceedance).



**Figure 3.**  $COV_K$  and  $COV_{MH}$  from Charleston alternatives for PGA, plotted vs. mean seismic hazard, for PGA at the Savannah site.  $COV_{MH}$  is the total COV of mean hazard, other labels for curves are given in Table 4.1.

Figure 4 shows a similar comparison of hazard sensitivity at the Jackson site to alternatives for the New Madrid seismic zone, which include Mmax, seismicity rate SEIS, and alternative geometries (indicated as "RFgeom," "NNgeom," and "NSgeom"). The latter are alternative geometries on the three faults in the New Madrid region, and a cluster model is used to calculate hazard.



**Figure 4.**  $COV_K$  and  $COV_{MH}$  of total hazard from New Madrid for 1 Hz, plotted vs. mean hazard.  $COV_{MH}$  is the COV of mean hazard, see the text for other labels for curves.

Unlike the results for Charleston, the New Madrid model indicates that uncertainty in the rate of seismicity is the dominant contributor to uncertainty in hazard. The sensitivity to Mmax is low because, when one fault produces a high characteristic magnitude, other faults may produce a low characteristic magnitude during the cluster of earthquakes.  $COV_{MH}$  is about 0.25 for all amplitudes,

and this result will be consistent across spectral frequencies because seismicity rate affects hazard equally across spectral frequencies.

## 5. UNCERTAINTIES FROM GROUND MOTION EQUATIONS

Several studies have results that can be used to estimate  $COV_{MH}$  that results from uncertainties in ground motion equations. EPRI (2005) and EPRI (2008) used ground motion equations published by EPRI (2004) for CENA, which consist of alternative equations with weights. The precision of hazard implied by these alternative models with weights was analyzed in a fashion similar to the Charleston seismic source, i.e. using an application of the statistical bootstrap technique. Weights given in EPRI (2004) for the various ground motion equations depend on whether ground motions come from an earthquake in an areal source or a large EQ source. Details of the bootstrap results are presented in (CEUS-HS 2012). Figure 5 summarizes a typical result from the Columbia site showing  $COV_{MH}$  vs. annual frequency of exceedance for PGA, for 3 values of the coefficient of variation on weights ( $COV_{WT}$ , with values of 0.3, 0.5, and 0.7) used in the bootstrap technique.  $COV_{WT}=0.5$  is thought to be most representative, indicating  $COV_{MH}$  in the range of 0.15 to 0.3 for mean hazards in the range  $10^{-4}$  to  $10^{-6}$ .



Figure 5.  $COV_{MH}$  vs. annual frequency of exceedance for the Columbia site from uncertainty in ground motion equation, for 3 values of  $COV_{WT}$ .

Hazard results that indicate hazard uncertainty from ground motion equations are also available from the PEGASOS study (NAGRA, 2004). In this study, five ground motion experts provided recommendations on sets of ground motion equations with weights, and hazard results are available at four Swiss nuclear power plant sites for PGA and 1 Hz SA conditional on each ground motion expert. The standard deviation of hazard  $\sigma_{MH}$  can be calculated for this set of conditional hazards, and COV<sub>MH</sub> is taken as  $\sigma_{MH}/\sqrt{5}$  divided by the overall mean hazard. Figure 6 shows COV<sub>MH</sub> at the four sites, plotted vs. annual frequency of exceedance. For PGA the COV<sub>MH</sub> exceeds 0.2, and for 1 Hz SA the COV<sub>MH</sub> exceeds 0.3, for mean hazards in the range 10<sup>-4</sup> to 10<sup>-6</sup>. Note that these results do not include within-expert uncertainty, only uncertainty from expert-to-expert.



**Figure 6.**  $COV_{MH}$  vs. annual frequency of exceedance for 4 sites from uncertainty in ground motion equation, from the PEGASOS study (NAGRA, 2004).

## 6. UNCERTAINTY IN SITE RESPONSE

Most sites in CENA are not classified as hard rock sites, and at these sites, uncertainty in site response plays a role in the uncertainty in site hazard calculations. Results from the PEGASOS project allow a direct estimate of the hazard uncertainty caused by uncertainty in site response calculations, because four site response experts provided recommendations on site response models, and hazard results are available at the 4 Swiss plant sites conditional on these 4 experts. The standard deviation of mean hazard  $\sigma_{MH}$  can be calculated for this set of conditional hazards, and COV<sub>MH</sub> is taken as  $\sigma_{MH}/\sqrt{4}$  divided by the overall mean hazard. This analysis indicates that COV<sub>MH</sub> at the 4 sites for PGA and 1 Hz spectral acceleration (which are the only results available in this format) range from 0.05 for mean hazards of  $10^{-4}$  to 0.4 for mean hazards of  $10^{-6}$ . COV<sub>MH</sub> is generally lower for 1 Hz spectral acceleration than for PGA. The low estimate of COV<sub>MH</sub> for site response was also observed in the results of two EPRI-funded projects (2005, 2008) that calculated seismic hazard (including site response) at a group of nuclear power plants in CENA. Details are included in (CEUS-HS 2012).

#### 7. CONCLUSIONS

Results are summarized in Table 7.1 as the minimum  $COV_{MH}$  values observed in these sensitivity results. Some results were not used because they are not typical cases, or were down-weighted because the original source did not include within-expert variability.  $COV_{MH}$  values are summarized by spectral frequency and annual frequency of exceedance, and results are given separately for area sources and large EQ sources. The last two columns represent the Total  $COV_{MH}$ , calculated as the square root of the sum of squares of the individual COV's for sites affected primarily by area sources and by large EQ sources.

						Total	Total
				Ground		COV <sub>MH</sub> ,	COV <sub>MH</sub> ,
			Ground	motion		site	site
			motion	(large		dominated	dominated
	Area	Large EQ	(area	EQ	Site	by area	by large
	sources	sources	sources)	sources)	response	sources	EQs
PGA, 1E-4	0.15	0.27	0.2	0.15	0.05	~0.25	~0.31
PGA, 1E-5	0.18	0.31	0.25	0.22	0.05	~0.31	~0.38
PGA, 1E-6	0.2	0.4	0.3	0.28	0.05	~0.36	~0.49
10 Hz, 1E-4	0.15	0.27	0.17	0.1	0.05	~0.23	~0.29
10 Hz, 1E-5	0.18	0.31	0.25	0.13	0.05	~0.31	~0.34
10 Hz, 1E-6	0.21	0.4	0.37	0.16	0.05	~0.43	~0.43
1 Hz, 1E-4	0.1	0.25	0.3	0.12	0.05	~0.32	~0.28
1 Hz, 1E-5	0.1	0.3	0.4	0.18	0.05	~0.42	~0.35
1 Hz, 1E-6	0.1	0.35	0.5	0.23	0.05	~0.51	~0.42

Table 7.1. Minimum  $COV_{MH}$  values observed in seismic hazard from studies relevant to CENA

In general, Table 7.1 shows that minimum hazard uncertainties resulting from area source characteristics are smaller than minimum hazard uncertainties resulting from large EQ source characteristics. However, the reverse is true of uncertainties resulting from ground motion models, where minimum hazard uncertainties from area source ground motion models are larger than from large EQ ground motion models. These two effects compensate somewhat, so that total minimum uncertainties in hazard are comparable for the two types of sources. Uncertainty in site response contributes relatively little, at least for the example sites presented here from two major studies. As an overall conclusion, the minimum COV representing uncertainty in mean hazard over all spectral frequencies, and for annual mean hazards in the range  $10^{-4}$  to  $10^{-6}$ , can be taken to be about 0.25 for  $10^{-4}$ , 0.3 for  $10^{-5}$ , and 0.35 for  $10^{-6}$ . Because the contribution of site response uncertainty is a small part of this total, this conclusion applies to both rock and soil sites.

For decisions regarding the significance of changes in seismic hazard, the above results should be interpreted as follows. If an alternative assumption or parameter is used in a seismic hazard study, and it potentially changes the calculated mean hazard (mean annual frequency of exceedance) by less than  $\pm 25\%$  for ground motions corresponding to  $10^{-4}$  annual frequency of exceedance, and potentially changes the calculated hazard by less than  $\pm 35\%$  for ground motions corresponding to  $10^{-6}$  annual frequency of exceedance, that potential change is less than the best (highest) level of precision with which we can calculate mean seismic hazard. Under these circumstances, the potential change could be deemed not significant. For many sites we cannot be this precise, and the uncertainty in mean hazard will be higher than this, but the above interpretation gives a reasonable lower-bound guideline with which to evaluate the significance of potential changes in mean hazard.

#### ACKNOWLEDGEMENT

This study was supported by a project funded by the U.S. Nuclear Regulatory Commission, the U.S. Department of Energy, and the Electric Power Research Institute. This support is gratefully acknowledged. No endorsement of these results is implied herein by these agencies, the conclusions are solely those of the author.

#### REFERENCES

CEUS (2012). Central and Eastern United States Seismic Source Characterization for Nuclear Facilities, Report published by NRC Report NUREG-2115, DOE Report NE-0140, EPRI Report 1021097, 6 Volumes.

- CEUS-HS (2012). *Hazard Significance*, Section 9.4 of *Central and Eastern United States Seismic Source Characterization for Nuclear Facilities*, Report published by NRC Report **NUREG-2115**, DOE Report **NE-0140**, EPRI Report **1021097**, Vol. 3, pp. 9-10 to 9-20.
- Efron, Bradley (1982). *The jackknife, the bootstrap, and other resampling plans*, Soc. for Industrial and Applied Mathematics, Phil, PA, 92p.
- EPRI (1989). Probabilistic Seismic Hazard Evaluations at Nuclear Plant Sites in the Central and Eastern United States: Resolution of the Charleston Earthquake Issue, *Elec. Power Res. Inst.*, **Rept. NP-6395-D**, Palo Alto, CA, Apr.
- EPRI (2004). CEUS Ground Motion Project Final Report, *Elec. Power Res. Inst.*, **Rept. 1009684**, Palo Alto, CA, Dec.
- EPRI (2005). Program on Technology Innovation: Assessment of a Performance-Based Approach for Determining Seismic Ground Motions for New Plant Sites, V1 and V2, *Elec. Power Res. Inst.*, Rept. 1012044 and 1012045, August.
- EPRI (2008). Assessment of Seismic Hazard at 34 U.S. Nuclear Plant Sites, *Elec. Power Res. Inst.*, Rept. 1016736, August.
- Exelon (2003). Submittal of Exelon Generation Company (EGC) application for an early site permit (ESP) for property co-located with existing Clinton Power Station (CPS) facility in Illinois, US Nuc. Reg. Comm. document accession no. ML032721596, Sept. 25.
- McGuire, R.K., Cornell, C.A., and Toro, G.R. (2005), The Case for Using Mean Seismic Hazard, *Earthquake Spectra*, **21:3**, 879–886.
- NAGRA (2004). Probabilistic Seismic Hazard Analysis for Swiss Nuclear Power Plant Sites (PEGASOS Project), Final Report to Unterausschuss Kernenergie (UAK) der Ueberlandwerke (UeW), July 31.
- Southern Nuclear Co (2008). Vogtle Early Site Permit Application, Revision 4, Part 2 Site Safety Analysis Report, Chapter 2, "Site Characteristics," see Updated Charleston Seismic Source (UCSS) model in Section 2.5.2.2.2.4, US Nuc. Reg. Comm. document accession no. ML081020220, March 28.