

# ESTIMATE OF THE PROBABLE MAXIMUM LOSS PML IN LIMA AND CALLAO: APPLICATION TO THE PERUVIAN INSURANCE INDUSTRY

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## **ABSTRACT:**

A methodology to estimate the probable maximum loss (PML) for insurance constructions is presented. The methodology includes regional seismic hazard analysis, ground motion estimation, structural vulnerability evaluation and net losses excedance computation. Computed for the first time in Peru, an estimation of the PML for 42 districts of Lima and Callao was carried out using the proposed approach. Laboratory and field tests were performed and the geotechnical characteristics of the study zone. The structural analysis was performed for building with insurance against seismic hazards. A field work was executed to get some characteristic of the buildings needed to estimate the structural vulnerability like number of stories, lateral configuration and conservation of the building. A study of the structural vulnerability was carried out based on the inter-story drift of the buildings. Analysis of the damage and rehabilitation costs were performed, vulnerability curves for different structural configurations were proposed. Finally, the probable maximum loss (PML) is presented as a function of return period. Based on the results, an insurance company can determine the constitution of its catastrophic reserve in a reliable way.

**KEYWORDS:** Probable maximum loss, PML, seismic hazards, structural vulnerability, insurance company, Lima and Callao.

## **1. INTRODUCTION**

Since ancient times, the cities of Lima and Callao have suffered a series of earthquakes of great intensity, during which on many occasions have occurred material damage and loss of life. The main source of seismic events affecting this region is the subduction zone, as defined by the interaction of the Nazca plate and the Sudamerica plate (Dorbath et al., 1990). This source can generate large-scale events, which historically (Silgado, 1978), in the area of the central coast can overcome a magnitude of 8 on the moment scale Mw (Table 1). The effects of these earthquakes are raised by different site conditions that occur in districts that make up the study area.

Year	Magnitude <sup>1</sup>	Intensity <sup>2</sup>
1586	8.1	IX
1678	8.0	VIII
1687	8.3	VIII
1746	8.6	Х
1940	8.2	VIII
1966	8.0	VIII
1974	8.1	VIII
1996	7.7	IV
2007	8.1	VI

Table 1. Earthquakes significant subduction in the central part of Peru, near Lima.

<sup>1</sup> Moment magnitude scale, Mw

<sup>2</sup> Modified Mercalli intensity reported in Lima



The probable maximum loss (PML) is an estimator of the maximum size of losses that would be reasonable to expect such a portfolio over a given time of exposure. It depends on individual risks and geographical distribution, the PML is great if there is a significant concentration in high seismic risk, and is small if the portfolio is evenly distributed in a wide geographic area. Since the PML is the maximum loss you can expect the insurer if it did not have coverage with reinsurers, the same reserves should be equal to that of PML. Based on these calculations, a company can determine their level of exposure reliably and well established financial planning for the establishment of the reserve and catastrophic risks.

## 2. OBJECTIVE

The aim of this study is to present a model estimate of Seismic Risk for a Portfolio Insured taking into account the four key modules in the estimate of the probable maximum loss (PML): seismic hazard, structural vulnerability, distribution and conditions of portfolio insurance. The results of analyses of losses are shown in a properly loss frequency curve (LFC).

#### **3. SEISMIC HAZARD**

The seismic hazard is quantified in terms of return periods of seismic intensity in the behavior of relevant structures. The exceedance rate of a seismic intensity is defined as the average number of times per unit time, when the value of that seismic intensity is exceeded. It is possible to determine the seismic hazard counting how many times they have been exceeded in intensity values given on the site of interest. The first part of investigation is the tectonics and the seismicity in a given region.

Using a standard distribution of seismicity Poisson activity of the i-th seismogenic source is specified in terms of the exceedance rate of the magnitude,  $\lambda_i(M)$ , which are generated there. The exceedance rates of magnitudes measures how often are generated in one source, tremors with magnitude higher than a given. In these cases, the seismicity is as follows:

$$\lambda(M) = \lambda_0 \frac{e^{-\beta M} - e^{-\beta M_u}}{e^{-\beta M_0} - e^{-\beta M_u}}$$
(1)

where Mo is the relevant minimum magnitude.  $\lambda_0$ ,  $\beta_i$ , and  $M_u$  are parameters that define the exceedance rate of the seismogenic sources.

The identification of seismogenic sources is based on the distribution map of epicenters, as well as the characteristics of tectonic area of influence (Castillo, 1993). This allows us to bring together sources in subduction sources (interaction plate) and continental sources (surface seismic activity).



Figure 1. Distribution of tectonics for the study area (Dorbath et al., 1990)



# 3.1 Statistical Analysis of Recurrence

The recurrence of earthquakes is determined according to the Richter expression (1958):

$$Log N = a - b M$$
 (2)

where:

N=number of earthquakes of magnitude M or more per unit of time.

a, b=parameter dependent on the region.

The previous expression can also be written as:

$$N = \Gamma_0 e^{-\beta M} \tag{3}$$

where:  $\Gamma_0 = 10^a$  is the number of earthquakes per unit of time with M > 0.

$$\beta = b \times \ln 10$$

The recurrence of statistical parameters for each seismic source have been calculated using the magnitude  $M_s$ . We calculated the following relationship between the magnitudes  $m_b y M_s$ :

$$m_b = 3.30 + 0.40 M_s \tag{4}$$

In the statistical analysis of the parameters of recurrence, the method of least squares, considering data from 1963 to 1992.

#### 3.2 Attenuation of seismic waves

For purposes of this study, using two laws of attenuation depending on the paths that travel on the waves on its way from the source to the site.

#### 3.3 Attenuation of subduction accelerations

Clearly, there is a lack of records data of accelerations in Peru. The data are taken from Lima. The attenuation law of accelerations (Casaverde and Vargas, 1980) is:

$$a = 68.7 e^{0.8Ms} (R + 25)^{-1.0}$$
(5)

where:  $a = acceleration cm/seg^2$ .

M<sub>s</sub>=magnitude of the surface waves. R=hipocentral distance in km.

#### 3.4 Attenuation of continental accelerations

For surface continental sources have been used by attenuation law of accelerations proposed by McGuire (1974). This law was applied for attenuations West Coast of the United States, which is associated with continental fault and its expression is:

$$a = 472 \times 10^{0.28 \text{ Ms}} (\text{R}+25)^{-1.3}$$
(6)

that is expressed in logarithmic form:

$$\ln a = 6.156 + 0.64 \text{Ms} - 1.30 \ln (\text{R}+25)$$
(7)



## 3.5 Local Site Effects

It is widely known that a local site effects is a major factor responsible for damage to buildings during earthquakes severe. The seismic amplification is an effect of the local site condition and is strongly dependent on the geological and geotechnical conditions.

To determine the dynamic characteristics of the soil, have been made both microtremors and amplification of seismic evaluations in the areas most critical. This information has been incorporated into a geographic information system (GIS) and processed to produce a seismic microzonation based on geotechnical parameters of the 42 districts analyzed. Figure 2 shows the seismic microzonation in Lima and Callao considered in this study.



Figure 2. Seismic microzonation of 42 districts of Lima and Callao (CISMID, 2004)

## 4. SEISMIC HAZARD

Once known the seismic source, attenuation laws of waves generated in each of them, and the local site effects, seismic hazard can be calculated by considering the sum of the effects of all the seismogenic sources and the distance between each source and the structure site. The seismic hazard, expressed in terms of exceedance rates of intensities is:

$$\upsilon(a \mid R_{o}, p) = \sum_{n=1}^{n=N} \int_{Mo}^{Mu} - \frac{\partial \lambda}{\partial M} P_{r}(A > a \mid M, R_{i}) dM$$
(8)

where the sum of all the seismogenic sources N, y  $P_r(A > a | M, R_i)$  is the probability that the intensity exceeds a certain value, given the magnitude of the earthquake M, and the distance between the i-th source and site  $R_i$ . The functions  $\lambda$  i(M) rates are sources of seismic activity (Ordaz et al, 1998; Ordaz, 1999). Since it is assumed that, given the magnitude and distance, the intensity has lognormal distribution, the

Since it is assumed that, given the magnitude and distance, the intensity has lognormal distribution, the probability  $Pr(A > a | M, R_i)$  is calculated as follows:

$$Pr(A > a \mid M, R_i) = \phi\left(\frac{1}{\sigma_{Lna}} ln \frac{E(A \mid M, R_i)}{a}\right)$$
(9)

being  $\phi(.)$  standard normal distribution,  $E(A|M,R_i)$  the average value of the logarithm of intensity (given by law corresponding attenuation) and  $\sigma_{Lna}$  its corresponding standard deviation.



The seismic hazard is expressed, then in terms of the exceedance rate of values given of seismic intensity (Figure 3). As indicated, in this case the seismic intensity a, is measure with the spectrum response seudoaccelerations for 5% of critical damping and natural vibration period of building interest T.



Figure 3. Exceedance rates for peak ground acceleration of Lima (CISMID, 2003)

# 5. STRUCTURAL VULNERABILITY

The structural vulnerability (Figure 4) is the relationship between seismic intensity and level of damage. In this approach seismic intensity is measured with the spectrum acceleration. The level of damage can be estimated by taking the drift, which is calculated as the relative movement between two contiguous levels, divided by the height of the story. There are a significant number of studies that conclude that this parameter of the structural response presents the best correlation with structural damage reported (Bertero et al., 1991; 1992; Moehle, 1996; Miranda, 1997; Priestley, 1997; Sozen, 1997; Miranda, 2005). Contrary to the majority of systems based the estimate of damage in the Modified Mercalli intensity, the method is based on a parameter that presents an excellent correlation with the damage caused by the action of strong earthquakes. From the spectrum acceleration, it is possible to determine the maximum drift with the following:

$$\gamma_{i} = \frac{\beta_{1}\beta_{2}\beta_{3}\beta_{4}(\eta N^{\rho})^{2}}{4\pi^{2}Nh}S_{a}(T)$$
(10)

- where:  $\beta_1$ =Is the relationship between the maximum lateral displacement at the top level of the structure and spectrum displacement, considering a model of linear elastic behavior. This factor depends on the type and number of story of the structure.
  - $\beta_2$ =Describes the relationship between the maximum drift and distortion of the complete structure, which is defined as the maximum lateral displacement on the roof divided by the total height.  $\beta_2$ depend on the degree of participation of shear and flexural deformations, and structural typology.
  - $\beta_3$ =Expresses the relationship between the maximum lateral displacement of the inelastic model, and the maximum displacement of elastic linear model. This factor depends on the displacement ductility demand, the fundamental period of vibration of the structure and soil condition that supports them.
  - $\beta_4$ =Is the relationship between factors  $\beta_2$  elastic and inelastic. This factor takes into account that lateral strength distribution with the height is different in the elastic and the inelastic model. In the case of inelastic behavior is a large concentration of strength.



$$\beta_4 = 1 + \frac{\mu}{30} + \frac{N}{200} \tag{11}$$

where: N = is the number of story.

 $\mu$  = is the ductility demand of the structure.

h = is the height of each story of the structure.

 $S_a(T)$  = is the spectrum acceleration, which depends on the fundamental period of vibration, damping of structures and seismic hazard in the site.



Figure 4. Model of Behavior the Structural Vulnerability (Miranda, 2005)

These factors depend on the location of the structure, the typology structure, local soil condition and year of construction. They take into account the fact that the lateral stiffness of the structures located in areas of high seismic activity is higher than for structures located in areas of low seismicity. We also believe that the structures on soft soil are more flexible than those built on rigid soil due to the flexibility of the foundation. These parameters have been calibrated with analytical models, experimental laboratory and different considerations following the seismic codes.

Once it determines the maximum drift of structure, their vulnerability can be increased by several factors such as vertical and plant irregularities, pounding, soft story, poor conditions, torsion, short columns, etc.

The expected value of damage to the structure, given a maximum value of drift, is calculated as follows:

$$E(\beta|\gamma_{i}) = 1 - \exp\left[\ln 0.5 \left(\frac{\gamma_{i}}{\gamma_{o}}\right)^{\epsilon}\right]$$
(12)

where  $\beta$  is the total losses,  $\gamma_0$  and  $\varepsilon$  are parameters of structural vulnerability that depends on structural system and the date of construction, and E(.) is the expected value. Note that by definition,  $\beta$  is the ratio between the cost of repair and the total cost, and its value is between 0 and 1.

#### 6. PROBABLE MAXIMUM LOSS (PML)

The probable maximum loss (PML) of a portfolio is an estimator of the maximum size of losses that would be reasonable to expect such a portfolio over a period of seismic exposure. It is used as a fundamental data to determine the size of the reserves that the insurance company should maintain. In this model is defined as the estimated loss would occur for a given return period. Therefore, it is necessary to calculate exceedance rates of net losses of the portfolio,  $\beta$  (P<sub>N</sub>). If the j-th source is generated an earthquake, the net loss for the portfolio will be:

$$\mathbf{P}_{\mathrm{Nj}} = \sum_{i} \mathbf{V}_{i} \boldsymbol{\beta}_{\mathrm{Nji}} \tag{13}$$

where Vi is the value of the i-th structure,  $\beta_{\text{Nij}}$  is the net loss in the structure i, if an earthquake occurs with



certain characteristics in the source j, and the sum is to include all buildings of the portfolio. In this model assumes that the amount  $P_{Nj}/\sum_i V_i$  is also distributed as a random variable Beta. So the expected value of  $P_{Nj}$  can be easily calculated as follows:

$$E(P_{Ni}) = \sum_{i} V_{i} E(\beta_{Nii} | \gamma_{ii})$$
(14)

where  $\gamma_{ij}$  is the maximum drift experienced by the structure I, if an earthquake of magnitude known is generated at source j. However, to calculate the variance of  $P_{Nj}$ , be taken into account the correlation between different types of losses that can be generated in the building, contents and business interruption combined. Once you know the expected value and variance of  $P_{Nj}$ , the exceedance rates of  $P_N$  can be calculated as follows (Ordaz et al, 1998; Ordaz, 1999):

$$\mu(P_{N}) = \sum_{j} \int_{M_{0}}^{M_{u}} - \frac{d\lambda_{j}(M)}{dM} Pr(P_{Nj} > P_{N} | M, fuente_{i}) dM$$
(15)

where  $\lambda_j$  (M) is the exceedance rate of magnitude M at source j, and sum takes into account the effects of all seismic sources. Once these calculations can be performed to determine the PML for each case. Figure 5 shows the flow chart for estimating the frequency curve of losses (Swiss Re, 2003). Finally, Figure 6 shows the integrated methodology for estimating the probable maximum loss for a specific portfolio.



Figure 5. Flowchart for estimating the frequency curve of losses (Swiss Re, 2003)



Figure 6. Flowchart to calculate the probable maximum loss (PML, basic information of a specific portfolio)



# 7. VALUE DISTRIBUTION AND INSURANCE CONDITIONS

To process the distribution of risks exposed throughout the portfolio has been necessary to centralize information in a geographic information system (GIS) in order to incorporate all the necessary parameters for estimating the probable maximum loss (PML). In way of illustration, shows the location of the risks insured within the Department of Lima and the Constitutional Province of Callao for a specific portfolio (Figure 7).



Figure 7. Location of risks insured in the Department of Lima and Callao province

To characterize the soil condition in each risk analysis is necessary geo-referencing values exhibited according to their geographic location.

Figure 8 shows the geo-referencing of risks in the district of Chorrillos. Finally, Figure 9 shows the soil condition according to the seismic zoning geotechnical produced by CISMID (2004). It is important to note that in Chorrillos you can appreciate the 4 different soil conditions assigned according to the Peruvian Seismic Design Code (E030-RNC, 2003).



Figure 8. Location of risks insured of Chorrillos district





Figure 9. Location of risks insured of Chorrillos district

The conditions of insurance vary according to the market, natural hazards and policies of the Insurance Company. The deductibles may be a percentage of the sum insured a percentage of the loss or fixed amount. Limits may be a percentage of the sum insured or fixed amount. The conditions are applied to insurance losses and the result is the net loss.

Finally, we obtained a representative PML with a value about 6.1% for a return period of 1000 years, of all the risks insured of Lima and Callao, which is representative of the average from all the Insurance Companies.

# 8. CONCLUSIONS AND RECOMMENDATIONS

You can make the following conclusions and recommendations:

We propose a framework for assessing the seismic risk in which it has established the curve of the PML considering modules seismic hazard, structural vulnerability, value distribution and insurance conditions of portfolio. The procedure followed in estimating the PML is shown with a methodology internationally accepted by the scientific community to estimate insured losses of portfolios.

There has been a curve PML with different return periods. In general, there are no standard criteria to measure the PML; however, it is advisable to refer to a period of return between 500 and 2000 years.

Hopefully, those insurance companies reserved an amount equal to the PML or else must reinsure such amount. Finally, the estimated losses due to earthquake are essential for the government to implement strategic for earthquakes disasters and management plans.

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