

GLOBAL EARTHQUAKE MODEL



# GEM's Global Seismic Risk Model

Vitor Silva, on behalf of the risk team and collaborators



December, 2018 – Pavia, Italy

#### This is how we started...





# **Exposure Modelling**

Photo by Johnny Miller

# And the journey begins...





#### South America



510



Exposed population (million)



### **'**This time for Africa"



### North and Sub-Saharan Africa









# Next stop: United States



### **United States**

California exposure (value) 80% in wood-frame structures 6% in reinforced-masonry structures 'High-Code' and 'Moderate-Code' New York exposure (value) 50% in wood-frame structures 20% in unreinforced-masonry 'Pre-Code' and 'Low-Code'

#### Sources for the building inventory

- Hazus 4.1 General Building Stock (GBS) database, Census Tract Level
- Hazus 4.2 Dasymetric Building Inventory, Census Block Level

Full a Charles and the first

- USACE National Structure Inventory (NSI), Building Level Exposure
- Federal Emergency Management Agency. (2017). FEMA P-366: Hazus® Estimated Annualized Earthquake Losses for the United States.



### Next stop: Central America and the Caribbean



# Central America and the Caribbean







## Next stop: Middle East



#### Arabic Peninsula and Middle East















### Next stop: Europe and South Asia







#### Residential construction cost (USD/m<sup>2</sup>)





# India Risk Model

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**ARITRA** 



New Delhi







#### Next stop: Eastern and South-East Asia









#### Mainland China

- Administrative Level 4 Townships
- 42,820 Exposure Locations
- 46 Building Classes

#### Japan

- Administrative Level 3 Wards
- 1,879 Exposure Locations
- 128 Building Classes

#### South Korea

• Administrative Level 2 – Municipal

Osaka 🗉

- 250 Exposure Locations
- 60 Building Classes

#### Taipei

#### Guangzhou - O - Hong Kong

#### Macau

- Administrative Level 2
- 28 Exposure Locations
- 13 Building Classes

#### Hong Kong

- Building Level Inventory
- 25,567 Locations
- 39 Building Classes

#### Taiwan

- Administrative Level 3 Townships
- 368 Exposure Locations
- 32 Building Classes


# Last stop: Partners!



## Geoscience Australia – Risk Modelling in Perth



### GNS Science – National Seismic Risk Model





### Earthquake Model Central Asia



HELMHOLTZ-ZENTRUM POTSDAM DEUTSCHES GEOFORSCHUNGSZENTRUM

M. Pittore<sup>a</sup>, K. Fleming<sup>a</sup>, D. Bindi<sup>a</sup>, G. Weatherill<sup>a</sup>, F. Cotton<sup>a</sup>, S. Parolai<sup>ab</sup>, B. Moldobekov<sup>d</sup>, V. Silva<sup>g</sup>, L. Martins<sup>g</sup>, D. Amo-Oduro<sup>g</sup> <sup>a</sup> GFZ (Germany), <sup>b</sup> OGS Trieste (Italy), <sup>d</sup> CAIAG (Kyrgyzstan), <sup>g</sup> GEM (Italy)



HELMHOLTZ

Population (1000s)

## National Society Earthquake Technology- Nepal





Bamboo/Timber



■ Nonengineeried reinforced concrete ■ Brick with mud mortar

Brick and concrete (flexible)





Adobe

Brick and concrete (rigid)

Stone with mud mortar

Robinson et at (2018)



### A Uniform Global Exposure Dataset



## How many buildings do we have and where?

Total buildings: 1,383 Million



## How much value do we have and where?





Global Seismic Hazard Map

















1.0 0.5 0.3 0.2 0.1 Number of buildings (M)



1.0 0.5 0.3 0.2 0.1 Number of buildings (M)







# Seismic Vulnerability

# Classifying building vulnerability globally



Reinforced Concrete Low Rise
Reinforced Concrete, Mid Rise
Reinforced Masonry, Low Rise
Reinforced Masonry, Mid Rise
Unreinforced Masonry, Low Rise
Steel Construction

Building classification for Italy (residential) (by Dr. Elena Speranza)

### solution for Solumic Risk and in Urban Jones.

cana doneo ENGINEERING STRUCTURE

erability functions for Eu 25 based on observational an-type RC

T. Resetto \*, A. Elnashai \*

the sainnic sisk assessment of populations of building to be carried out within a particulance or consequence





used vulnerability analysis for large-scale asses of RC buildings ura Borri<sup>a, a</sup>, Rui Pinho<sup>b</sup>, Helen Crowle

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*Companing union	buildings to be taken only account. This paper begins with a brief literature review of analytical methods available for valuenability accounted in order to



Represents: Capacity curves - Fragility curves - Hybrid methodology - Loss sessement: RC buildings - URM buildings - Volnerability

INAL RESEARCH PAPER

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Vol. 8, Special Issue 1 (2004) 95-113 7) Inspecial College Pro-

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ent of an earthquake loss model for Turkish catastroph

ulian Bommeri, Robin Spence<sup>2</sup>, Mastafa Ezdik<sup>1</sup>, Shipoko Tabachi<sup>1</sup>, Naray Aplinoglu<sup>1</sup> idmund Boodi<sup>1</sup>, Domenico del Re<sup>4</sup> & Oliver Devolues<sup>1</sup>

mber 2005 / Accepted: 20-no i Chitaber 2006 e-Basiness Media R.V. 2006

hybrid method for the vulnerability assessment of R/C nd URM buildings

Imperial Carllege Pres Engineering Structures DD-HEIGHT RELATIONSHIP FOR EXISTING EUROPEAN REINFORCED CONCRETE BUILDINGS



Fragility analysis of mid-rise R/C frame buildings

Marat Serdar Kinçil\*, Zakeriya Polat picering. Nilly Xolniad University. JAMP Insult feed in revised form. 12 December 2005, accepted 5 Available online 20 March 2008.





stock for loss assessment models İ. Engin Bal\*, Helen Crowley<sup>b</sup>, Rui Pinho\*\*, F. Gilten Gilay





uces.

DRIGINAL RESEARCH PAPER

Servio La comarcino - Sonia Giovinazz

vulnerability and damage assessmen of current building eismic and mechanical models for the

Keywords Ordinary buildings - Valuerability assessment - Fragility curve

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nent of damage

Vitor Silva<sup>2,3</sup>, Mirio Marques<sup>1</sup>, Heler and Raimundo Deleado<sup>3</sup>

oring Department Faculty of Engineering, University of Porto, Partic, Port Col Engineering Department, University of Active, Assive, Portugal 2015/EXTRE: Partia Indv

1. INTRODUCTION

Journal of Endpoint Engineering, Vol. 8, No. 4 (2004) 497-522

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to performed with the highest possible level of accuracy, is missible information that can be used for risk mitigation leming risk analysis still involves a number of steps, with eets, mainly in the definition of the relationship between do

or from developments, minimic codes have began to explicitly location of ascesses of inaliativity in structural response, together size of their energy absorption capacity. Hossily, not perfor-ind the structural systems arabients to cartispasks loading about be true history analysis. Hierever, the initiation complexity and the utilizad differ required by the hoters (expectably 2 a three-base dry modeling hoteloarge in a shortpeth do not justify to are in

The definited types of utilatinal intervention schemes. models should, ideally, include all of the possible houseds from earth-parket inter handlides Examplefries marking field reasters and tensorie Mesorchiles

Due to its location alongside the Pacific Ring of Fire and the subductio rized by a high seismic hazard. Recent hazar h (PGA) of 0.2 g at the 475-year rotarn perio

Published online: 11 Outsher 2018

sity bounds for assessing the se structures: Does it matter?

iula Lazar and Marjal Doliel

EIY WIEDS: performance-based surfaquite registering sciencis risk; proval-motion hazard; proval-motion resolution model; unwer based excent sectors intensity. Invert Institute atomic

Development of Fragility Curves for Confined

Holger Lovon," Nicola Tarque", Vitor Silva," and Catalina Yepe

This paper aims at investigating the seismic fingility of confined m

athan scale. A database describing the geometric properties (walls densi uilding area, height) of this type of structures was developed using data from field surveys. This information was complemented with results from experiment

ists to compute a large set of capacity curves using a mechanical procedu These models were tested against a set of ground motion records using th nt (DBILA) pro actural responses were used to derive fragility functions for four building sees. The resulting figurility curves were convoluted with sciencic hazard curve to evaluate the annualized expected less ratio and annual collarse probability

(CM) has been one of the most com uruvian coast. In the capital Lima, with a population of almost 10 million people, con asonry buildings represent about 56% of the total building stock (Yenes-Estrada et ei

017). The majority of these structures are built without following adecuate consti weiderstein of modern science codes), monthy due to the low ri-

s and an inefficient legal ent streness of the linkbuists and an intercent togic effectivents. According to ensemble and 50%, this trund in the informal construction is associated with Linux's rapid popular strength, opecularly in the sub-afram arrass. Given the expected poer stantic performance immally built structures (Blondat *et al.*, 2004), their popularity, and the high soins and in the rapions (og. Monosy & Bashidos, 2004), its is fundamental to understand the sub-aframe structures expected by the fundamental structures of the structure of t

<sup>9</sup> Postificia Universidad Católica del Paris, 1881 Universitaria Are., Lima, Par <sup>9</sup> GEM Foundation, Via Fornita 1, Paria, Roby

ete Building

Displacement-Based Fragility Fu for Low- and Mid-rise Ordinary

Akkar," Haluk Sucuogla," MATER, and Abmet Yakut

Masonry Buildings in Lima, Peru

Advanced inelastic static (pushover) analysis for earthquake application

A.S. Ehanhalf Exploring Secondary and Earthquake Exploring Sector Over and Environmental Regimenting Department, Imparial Calego, London SWF 2001, UK

### Preemble

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Tiriana Rossetto\*\*, Amr Elnashai<sup>b</sup>

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X Mon (52) - H. Yaram Civil Explorating Department, University of Arstin, Arstin, Portog e-mail: view.elf-m.pl Y. Silva: H. Crewley: R. Pisler GBM Presidente, Paris, Bely

Evaluation of the seismic risk of the unreinforce valuation of analytical methodologies used to derive functions

<sup>1,1</sup>, H. Crowley<sup>2</sup>, H. Varam<sup>1</sup>, R. Pinho<sup>1</sup> <sup>1</sup>Enterently of Academ, Persong VEXXENTRE, Persin, Buly <sup>1</sup>Enterently of Persin, Buly <sup>1</sup>Enterently, of Persin, Bully <sup>1</sup>Enterently, and Person, Bully

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by Ting Lin, Stephen C. Harmsen, Jack W. Baker, and Nicolas Luco

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ORIGINAL RESEARCH PAPER

of a vulnerability model

Vitor Sžva - Holen Crowley - Hamberts Varus Pol Piebe - Luis Sceres

Rearised: 13 April 2013 / Assepted: 31 August 2014

tigation of the characteristics of Port ent-frame RC buildings and develops

asonry building stock in Antioquia, Colombia

Ana B. Acevedo<sup>1</sup> )<sup>\*</sup> Juan D. Jaramillo<sup>1 -</sup> Catalina Yepes<sup>2</sup> Vitor Silva<sup>2</sup> - Fernando A. Osorio<sup>1</sup> - Mabé Villar<sup>2</sup>

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Kerwords Exposure - Saismic risk - Fratility functions - Masoury building

### 1 Introduction

blided online: 02 Neverther 2010

Over the last four decades, to nitude 6.2 (M<sub>a</sub>) Armonia ex earthquake of 1983. Both evo ain soismic events have affected Colombia: the map also of 1999 and the magnitude  $5.0~(M_{\rm A})$  Popuya

Taylor & Franck

### Companismer to Y. Silva, University of Aroise, Portand Longity visus all self-rangements Chapter 4 Epistemic Uncertainty in Fragility Functions for European RC Buildings

 $P_{ii} = PD \ge d/S = n$ 





## Development of a uniform approach

- Employment of nonlinear time-history analysis
- Consideration of single degree of freedom (SDOF) oscillators
- Consideration of a large set of ground motion records
- Avoid scaling factors below 0.5 or above 2
- Employment of four damage states (similar to HAZUS)
- Consideration of structural and non-structural components
- Consideration of building contents

### From MDOF to SDOF – structural modelling



Multi-degree of freedom (MDOF) system Single-degree of freedom (SDOF) system

### Collection ground motion records globally



Over 3500 ground motion records collected.

## Derivation of fragility functions



## Derivation of vulnerability functions



### Current database of vulnerability functions





### Seismic Risk

### Generation of Stochastic Event Sets



Simulation of 1 year of seismic events

### Generation of Stochastic Event Sets



Stochastic event set equivalent to 50 years

### Nicaragua

# **Costa Rica**

### Modelling geometry of earthquake ruptures


### Propagating ground shaking variability (M8.1)



### **Exposure dataset for Costa Rica**



### **Estimated economic losses for Costa Rica (M8.1)**



# Offshore earthquake rupture (M7.0)



### Median ground shaking distribution (M7.0)



### **Estimated economic losses for Costa Rica (M7.0)**



# Earthquake rupture in the Central Valley (M6.5)



### Median ground shaking distribution (M6.5)



### **Estimated economic losses for Costa Rica (M6.5)**



## Global average annual losses



Presented on a hexagonal grid, with a spacing of 0.30 x 0.34 decimal degrees (approximately 1,000 km2 at the equator).

## Variation of construction costs globally



Construction costs can vary more than one order of magnitude between the developed and underdeveloped countries.

## Global average normalized annual losses



Presented on a hexagonal grid, with a spacing of 0.30 x 0.34 decimal degrees (approximately 1,000 km2 at the equator).

## Global average annual human losses



Presented on a hexagonal grid, with a spacing of 0.30 x 0.34 decimal degrees (approximately 1,000 km2 at the equator).

# Average annual economic losses



# Average normalized annual economic losses

Total normalized annual loss: 93.7 M (m2)



# Average annualized human losses





#### Social Indicators

Population (Million):	35.740
Population Growth Rate (%/Year):	1.303
GDP (Billion USD):	109.139
Gross Savings (Billion USD):	30.508
Life Expectancy (Years):	75.82
GINI Index:	40.9
Human Development Index	0.667
GDP per Capita (USD):	3,007



Return Period (Years)

https://downloads.openquake.org/countryprofiles/

0.25

0.00

1	Social Indicators	
	Population (Million):	17.133
	Population Growth Rate (%/Year):	0.600
	GDP (Billion USD):	826.200
	Gross Savings (Billion USD):	249.761
	Life Expectancy (Years):	81.51
	GIN Index	30.3
	Human Development Index:	0.931
	GDP per Capita (USD):	48,223

Seismic Hazard

MOROCCO



### NFTHERI ANDS



Social Indicators			
Bernard Street			
Population (Million):	4.475		
Population Growth Rate (1/Tear):	1.9		
GDP (Billion USD):	2.608		
Gross Savings (Billion USD):	0.032		
Life Expectancy (Years):	65.09		
GINI Index:	-		

Human Development Index:

GDP per Capita (USD):

1.9

0.44

1,093

Seismic Hazard





Asset Replacement Cost (Billion USD)

3,131.0

434.8

230.7





Loss (Million USD)

5,400.0

1,070.0

640.0

#### Social Indicators

Population	(Million):
Population	Growth Rate (%/Year)
GDP (Billio	n USD):
Gross Savi	ngs (Billion USD):
Life Expect	tancy (Years):
GINI Index	
Human De	velopment Index
GDP per C	apita (USD):

O) GEM

#### 82.30 Major Earthquakes 32.1

**Risk Indicators** 

Occupancy

Desidentia

Commercial

Industrial

36,708

1,215

1,653.043

Seismic Hazard

329.370

0.926	2012 M 7.7 - Queen Charlotte Islands	O fatalitie
45,032	1946 M 7.3 - British Columbia	O fatalitie
	1929 M 7.3 - Grand Banks	0 fatalitie



Average Annual Loss Ratios

**Regions of Highest Earthquake Risk** 

Loss (Million USD) Loss Ratio (%)

59.8

11.5

6.9

Average Annual Average Annual 200-Years Return Period

0.02

0.03

0.03

Average Annual Losses



#### Loss Exceedance Curve



Average Annual Los





https://downloads.openquake.org/countryprofiles/

Average Annual Los



https://downloads.openquake.org/countryprofiles/



Loss Exceedance Cu





30 20 30 Average Annual Loss (M USD)

British Columbia

Outite

Aberta New Brunswick #

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Generated: 2018-12-04

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## Documentation and release of models



## Verification of the Global Risk Model



## Verification of the Global Risk Model









### PAGER Version 6

### M 7.0, 13km N of Anchorage, Alaska

Origin Time: 2018-11-30 17:29:29 UTC (Fri 08:29:29 local) Location: 61.3234° N 149.9234° W Depth: 44.1 km FOR TSUNAMI INFORMATION, SEE: tsunami.gov

### Created: 6 hours, 2 minutes after earthquake

### **Estimated Fatalities**



Orange alert for economic losses. Significant damage is likely and the disaster is potentially widespread. Estimated economic losses are less than 1% of GDP of the United States. Past events with this alert level have required a regional or national level response.

Green alert for shaking-related fatalities. There is a low likelihood of casualties.



### **Population Exposure**

### population per 1 sq. km from Landscan 10000 50 500 5000 0 5 100 1000 151.2°W 149.5°W 147.8°W IV 62.5 ° N IV IV IV 61.5°N hchorage

### Structures

Overall, the population in this region resides in structures that are resistant to earthquake shaking, though vulnerable structures exist. The predominant vulnerable building types are unreinforced brick masonry and reinforced masonry construction.

### Historical Earthquakes

Date	Dist.	Mag.	Max	Shaking
(UTC)	(km)		MMI(#)	Deaths
2002-11-03	271	7.9	V(36k)	0
1964-03-28	127	9.2	VIII(24k)	_
1964-03-28	127	9.2	VIII(24k)	0

### **Collaboration with USGS on a continuous validation framework**

liquefaction that might have contributed to losses.

Colootod City Exposure

### Where we are

### Next Steps:

- Improvement of datasets in high risk regions.
- Further engagement of the scientific community and risk managers.
- Release of models and datasets (Q1-Q4)
- Calibration of existing model against empirical data.
- Investment in capacity building and training.
- Inclusion of model and tools in universities curricula.
- Involvement of committees responsible for the draft of design regulations.
- Extension of the current model to infrastructure risk assessment and secondary hazards.

# Thank you

