# Implications of masonry infill-related uncertainty on the optimal seismic retrofitting of existing buildings

Gianrocco Mucedero PhD Candidate, University School for Advanced Studies IUSS Pavia, Pavia, Italy

Rita Couto PhD Student, University School for Advanced Studies IUSS Pavia, Pavia, Italy

# Nicholas Clemett

Postgraduate Researcher, University School for Advanced Studies IUSS Pavia, Pavia, Italy; PhD Student, Helmut-Schmidt Universität/Universität der Bundeswehr, Hamburg, Germany

# Giammaria Gabbianelli

Research Associate, Department of Civil Engineering and Architecture, University of Pavia, Pavia, Italy

## Ricardo Monteiro

Associate Professor, University School for Advanced Studies IUSS Pavia, Pavia, Italy

ABSTRACT: Many research efforts have focused on developing multi-criteria decision-making (MCDM) processes for selecting the optimal seismic retrofit alternative when several important decision variables (DVs) need to be considered. Those DVs can include, amongst others, economic, social, technical, or even environmental aspects. For what concerns the technical DVs related to the structural response of poorly-detailed existing buildings, investigation of the uncertainties involved in the process is still needed to understand whether and how they can affect the identification of the optimal retrofitting alternative. In this sense, this paper addresses the impact of the uncertainty related to the variability in the mechanical properties and modelling of masonry infills on the results obtained with the aforementioned MCDM processes to identify risk-based optimal combined seismic-energy retrofitting strategies for a case-study building, representative of typical school buildings in Italy. Following a preliminary structural and energy assessment, different retrofit alternatives are evaluated through a MCDM framework to select the optimal solution. Finally, the MCDM results are presented, highlighting the effects of the variability in the infill properties, a source of uncertainty that is commonly discarded.

## 1. INTRODUCTION

The occurrence of past earthquakes highlighted the vulnerability of masonry-infilled reinforced concrete (RC) buildings, which represent a large part of the overall building stock in Mediterranean countries. Most of these buildings were built before the introduction of modern codes; hence they lack appropriate seismic resistance. Moreover, the energy performance of this type of buildings is highly unsatisfactory, resulting high in energy

consumption, significant costs, and increased CO<sub>2</sub> emissions (Gkatzogias et al. 2022).

Recently, significant focus has been given to the development and evaluation of combined seismic and energy retrofitting schemes, with a view to minimise the economic losses and environmental impacts and promote building renovation (e.g., Marini et al., 2017; Menna et al., 2021; Caruso et al., 2022, Clemett et al. 2023). Given the wide range of possible structural and energy retrofitting schemes to couple in an integrated scheme, it is essential to proceed with methodologies that aim to identify an optimal integrated retrofit solution. Some of those methods, such as seismic resilience-based assessments, index-based methods, cost-benefit analyses and multi-criteria decision-making (MCDM) approaches, scrutinised and compared by Carofilis et al. (2022a), often consider a range of economic, social and technical decision variables (DVs) that are typically of interest to decision-makers. Different weights are usually given to the DVs, following the intuition of the decision maker or determined through more rigorous criteria. Technical DVs related to the structural response of existing buildings are of paramount importance due to their influence on the identification of the optimal retrofit alternative and are usually characterised by a higher weight when compared to other DVs. Accordingly, the effects of both aleatory and epistemic uncertainty on the seismic response parameters could have a relevant impact on the identification of the optimal retrofit alternative.

This paper addresses the impact of the epistemic uncertainty related to the variability in the mechanical properties of masonry infills on the results obtained with an MCDM procedure employed for selecting the optimal integrated retrofitting scheme of a school building located in Italy.

#### 2. OPTIMAL COMBINED SEISMIC AND ENERGY EFFICIENCY RETROFITTING

## 2.1. Multi-criteria decision-making framework

One of the most appealing frameworks for the identification of the optimal combined seismic and energy efficiency retrofitting intervention is based on an MCDM approach, which considers the performance of different retrofit alternatives across a broad range of decision variables (DVs) and uses a weighted average method to identify the optimal solution. This methodology, employed in the present study, has been described extensively in Caterino et al. (2008) and Carofilis et al. (2022a).

The process initiates with the identification of a set of DVs, with which the performance of each retrofitting alternative will be assessed, and to each of which a weight is assigned as a function of its importance. The Analytical Hierarchy Procedure (AHP) (Saaty 1980) or decision-maker expertise can be used to define the weight values. Once the values for each DV are obtained, a decision matrix (DM) can be assembled. containing the associated values for each retrofit intervention. The values of the DM are then normalised and the ideal and least ideal solutions for each decision variable are determined, allowing a comparison with each of the proposed design alternatives. To do so, the n-space Euclidean distance between the DM values for the design alternative and the ideal and least ideal alternatives is used. Finally, the relative closeness of each alternative to the least ideal solution is calculated, and the alternative with the highest relative closeness (i.e., the furthest alternative from the least ideal) is chosen as the preferred solution.

# 2.2. Decision Matrix and Weight Vectors

The DVs and corresponding weights applied in this study are depicted in Figure 1, following the study by Clemett et al. (2023). The weight vector was defined employing the AHP and the professional judgment of the authors. DVs like C1, C2, and C3 are considered more relevant, demonstrated by the value of their corresponding weights, while C6 and C7 are considered less relevant. The choice of the weight vector was found to be the most significant source of uncertainty in the MCDM procedure and, consequently, in their results, as reported by Carofilis et al. (2022b). Interested readers are referred to Clemett et al. (2023) for more details on the MCDM framework used herein, as well as on the definition of both decision matrix and weight vectors.

14<sup>th</sup> International Conference on Applications of Statistics and Probability in Civil Engineering, ICASP14 Dublin, Ireland, July 9-13, 2023



Figure 1 Decision Matrix and Weight Vectors (according to Clemett et al. 2023)

# 3. INFILL VARIABILITY AND EPISTEMIC UNCERTAINTY

Despite the high-level of uncertainty surrounding the masonry infill properties, constant mechanical and geometrical properties are typically assumed in seismic risk assessment studies both at single-building and regional scale. Furthermore, a proper identification and propagation of uncertainty in the collapse assessment of existing structures are of paramount importance when detailed nonlinear structural analysis methodologies are adopted; hence an explicit consideration of the variability in the masonry infill characteristics should be considered for a refined collapse and loss estimation. Recently, to overcome the lack of insitu test results on masonry infills, a macrodistinction approach of different masonry infill typologies was proposed by Mucedero et al (2020), based on masonry infill strength. Five masonry infill typologies were selected as representative of the existing masonry infill typologies used in RC residential buildings, and their representativeness was proved with respect to the ranges of masonry infill properties provided in an experimental tests database available in the literature. Several studies investigated the impact of different sources of

epistemic and aleatory uncertainty on the seismic assessment of RC buildings, although little attention was paid to the impact of the uncertainty related to the variability of masonry infill properties, in a thorough manner. Recently, O'Reilly and Sullivan (2018), using the Correlated Latin Hypercube Sampling method, proposed by Olsson et al. (2003), have investigated and quantified the uncertainty associated with different modelling parameters for existing RC frames in Italy, with and without masonry infills. More recently, Mucedero et al. (2022) further integrated the estimation of modelling uncertainty in existing buildings, using a case-study masonry-infilled RC frame from an extensive building stock (Mucedero et al., 2021), representative of existing RC frames built in Italy between 1970 and 1980, and covering some important aspects that were unaddressed by previous research studies. More details are provided in (Mucedero et al., 2022). With such considerations in mind, this study investigates the implications of masonry infillrelated uncertainty on the seismic retrofitting of existing buildings, combined, in an optimal manner, with energy retrofitting. The overall impact of a more robust characterisation and propagation of uncertainty is therefore evaluated.

#### 4. CASE-STUDY SCHOOL BUILDING

The case-study school building is a RC building with unreinforced masonry infills (URM) infills located in Isola del Gran Sasso d'Italia (Italy) and built between the 1960s and 1970s (Prota et al. 2020). The school is a two-storey building, with a floor area of approximately 630m2 and interstorey heights of 3.75m and 4.25m for the first and second floor, respectively. The structural system consists of two-way RC moment resisting frames in the longitudinal and transverse directions, and URM infills are present along the building façade with large openings to accommodate windows and doors.

In this study, the masonry infills were assumed to have the same geometry and material properties as the medium-strong masonry infill typology in the macro-level classification proposed by Mucedero et al. (2020). A more detailed description of the building, along with its architectural plans and elevations, can be found in Prota et al. (2020).

The building is assumed to be located in three different locations in Italy in order to investigate the influence of different combinations of climatic conditions and seismic hazard levels on the choice of the optimal retrofit alternative. The three locations, namely Città di Castello, Isola del Gran Sasso d'Italia and Catania, are characterised by cold (C), moderate (M) and warm (W) climates, respectively, and similar moderate to high levels of seismicity.

# 4.1. Selected seismic and energy retrofitting schemes

Following a preliminary seismic and energy assessment, where the main deficiencies of the case-study structure were identified, different seismic and energy retrofit measures (SRMs and ERMs, respectively) were applied to the casestudy building. A summary of the SRMs and ERMs is given in Figure 2.

The four SRMs schemes are: S1 - local strengthening with carbon CFRP; S2 - global strengthening with additional concentric steel braces; S3 - CFRP strengthening combined with

additional concentric steel braces; and S4 – CFRP strengthening combined with additional viscous dampers. Additionally, for all SRMs, a seismic gap between the URM infills and the RC frame was introduced, reducing both the column-infill interaction and the shear forces acting on the columns.

Regarding the improvement of the energy performance of the building, three different combinations of ERMs, foreseen by the Italian Ministerial Decree (2015), were considered aiming to reduce heat losses to the external environment and increase the energy efficiency of systems operating within the given building. The modelling assumptions for each EMRs can be found in Clemett et al. (2023).

Finally, the four seismic interventions were coupled with each energy intervention, leading to twelve possible retrofit alternatives. Each coupled intervention is designated by SiEi, where Si and Ei correspond, respectively, to the reference number of the considered seismic and energy retrofit schemes.



Figure 2 Selected seismic and energy retrofitting schemes.

#### 4.2. Seismic and Energy Performance Assessment

A comprehensive performance-based seismic assessment and loss analysis of the casestudy building was carried out, following the PEER-PBEE methodology (FEMA 2018a). The seismic hazard at each of the three selected sites was characterised, and twenty pairs of ground motions were selected for each using the average spectral acceleration (AvgSa)-based selection. Using these records, the quantification of the structural response through multiple-stripe analysis (MSA) for each site was performed and, subsequently, the collapse fragility parameters were derived.

The median AvgSa ( $\theta$ ) and dispersion ( $\beta$ ) values were modified to account for modelling uncertainties. Two sets of dispersion values were considered: the first set refers to an approach that does not include infill variability and premature RC shear failure (O'Reilly and Sullivan (2018)), named herein as MDL-1, whereas the second one corresponds to the recent integrated values proposed by Mucedero et al. (2022), named herein as MDL-2. Due to the gap between the URM infill and the RC frame introduced in all retrofitting schemes, the MDL-1  $\beta$  values were used in the assessment of the retrofitting conditions.

Finally, a detailed loss assessment for the as-built and the twelve retrofit alternatives at each site was performed, using the PACT software (FEMA 2018b), and considering the component inventory of damageable components in the building and assumptions provided in Clemett et al. (2022).

The collapse fragility curves, considering the two dispersion sets for the as-built condition, are provided in Figure 3a. As also pointed out in Mucedero et al. (2022), a much lower median intensity of collapse is obtained when considering MDL-2, with respect to MDL-1. Nevertheless, for higher probability of collapse, the differences in terms of collapse fragility curves between the two dispersion sets diminish, and the curves almost coincide.

The collapse fragility curves for the four seismic retrofitting schemes, as a function of the three locations investigated, are provided in Figure 3b. The results provide a preliminary ranking of the seismic retrofitting schemes, based only on structural response, and regardless of the locations investigated (similar seismic hazard level): the best intervention is S4, followed by S3 and S1, which are almost similar, and finally S2. The global retrofit intervention, such as S2, without local retrofit, has the worst structural performance, since it is not able alone to overcome the high demand/capacity ratio of poorly-detailed structural members.



Figure 3 Fragility curves for each location investigated: (a) as-built condition considering MDL-1 and MDL.2; (b) retrofitted condition.

The obtained fragility curves were then used to perform a detailed component-based loss assessment (FEMA P-58) of the two as-built conditions (MDL-1 and MDL-2) and the twelve retrofit alternatives at each site. The results obtained in terms of expected annual losses (EAL) and expected annual environmental impacts (EAEI) for both the as-built condition and for each retrofit combination are provided in Figure 4, per investigated location.

The more recent dispersion values (MDL-2) confirmed higher EAL and EAEI losses with respect to those taken from previous studies (MDL-1). Also, the annual probability of failure (C4), is strongly affected by the dispersion sets considered, with a median increment of 45% when MDL-2 is employed. As such, the increments in EAL, EAEI and the annual probability of failure (APF) clearly affect the final ranking of the MCDM procedure, since the weights associated with these DVs are higher than the other ones.

The energy performance of the as-built and retrofitted configurations at each site was performed by Clemett et al. (2023), using EDILCLIMA (2021), and those results are used herein. The parameters considered to evaluate the energy performance were the primary energy performance (PEC), equivalent CO<sub>2</sub> emissions, annual energy costs (AEC), and Italian energy class ratings. The energy performance assessment performed by Clemett et al. (2023) showed a progressive improvement, from E1 to E3, in the energy performance of the case-study building, in line with the severity of the intervention.



Figure 4 EAL and EAEI for the as-built condition (with MDL-1 and MDL-2) and each of the 12alternatives, for each location investigated.

#### 4.3. MCDM results and discussion

Once the results of the seismic and energy assessment were obtained, the decision matrices were assembled. Some DVs, such as C2, C3 and C4, were normalised with respect to the results obtained from the as-built condition. The weight vectors are defined according to Figure 1. The preferential ranking obtained from each analysis is presented in Table 1, in which the alternative in position one is considered the most preferred option, and the alternative in position 12 is the least preferred. Since two different sets of dispersion values for the as-built condition are considered, two sets of rankings for each site are presented, while their differences, in terms of ranking, are highlighted in grey. Moreover, the relative closeness values (Table 1) lie in the range (0,1), with 1 corresponding to the ideal solution, and can be used to understand how strongly one solution is preferred over another.

The MCDM results for MDL-1 show that the seismic retrofit scheme had a more significant effect on the overall ranking of an alternative than the energy retrofit scheme, at least for the warmer sites, M and W. The S4 scheme is the most preferred option, followed by S3, S2, and finally, S1. For C site, S3 is preferred, integrated with the E3 energy scheme.

Considering the ranking obtained with MDL-2, some changes are noticed, with respect to MDL-1. For site M, a reversal of the ranking intervention in positions 6 and 7 is observed. For site W, the changes are more important; indeed, MDL-2 seems to play a more significant role under warmer climate. Although the S4 retrofitting scheme remains the optimal one, the corresponding integrated energy schemes are different. Conversely, no changes in the ranking are noticed for the colder site, C.

In general terms, for sites M and W, the more recent dispersion values led to a ranking in descending order, with schemes S4 and E3 on the top, whilst S1 and E1 rank last. The relative closeness values are practically unaffected by the two different sets of epistemic uncertainty. These results show that, as heating demands increase, the impact of the energy retrofit alternatives on the ranking order becomes more important and consequently, more energyefficient retrofit alternatives are the preferred solutions. It is interesting to note that, in case of MDL-1, the first-ranked alternative is different for each of the sites, whereas, in case of MDL-2 the first-ranked alternative is only different for the colder site, which denotes a preponderant role of the significant epistemic uncertainty in buildings of this sort. Given that a seismic gap was introduced for all retrofitting schemes, the impact of the infill variability is limited to the asbuilt condition. Therefore, considering retrofit schemes without the seismic gap, could lead to further implications on the optimal seismic retrofitting of existing buildings.

## 5. CONCLUSIONS

This study dealt with the implications of masonry infill–related uncertainty on the optimal seismic retrofitting of existing buildings. A case-study school building was investigated, considering two different estimates

uncertainty of epistemic and different combinations of climatic conditions and seismic More complete hazard levels. (higher) dispersion sets of epistemic uncertainty led to a median increment of about 45% on the expected annual losses, expected annual environmental impact and annual probability of failures for each site. Given the relative importance of these decision variables in the adopted multi-criteria decision-making procedure, and how their values are affected by the selected set of epistemic uncertainty, the importance of carefully defining the epistemic uncertainty for collapse assessment is high when choosing optimal retrofit interventions. The preference rankings obtained herein are affected by the adopted epistemic uncertainty mostly for moderate and warm climates.

Further investigation considering different case-study buildings, climatic conditions and seismic hazard levels is however essential to draw general conclusions on the role of masonry infill–related uncertainty in the optimal seismic retrofitting of existing buildings.

	С				Μ				W			
Ranking	MDL-1		MDL-2		MDL-1		MDL-2		MDL-1		MDL-2	
	Alt.	Rel.	Alt.	Rel.	Alt.	Rel.	Alt.	Rel.	Alt.	Rel.	Alt.	Rel.
		Clos.		Clos.		Clos.		Clos.		Clos.		Clos.
1	S <sub>3</sub> E <sub>3</sub>	0.641	S <sub>3</sub> E <sub>3</sub>	0.641	S4E3	0.650	S4E3	0.632	$S_4E_2$	0.650	S4E3	0.649
2	S4E3	0.618	S4E3	0.618	S4E2	0.612	S4E2	0.617	$S_4E_1$	0.644	S <sub>4</sub> E <sub>2</sub>	0.636
3	$S_3E_2$	0.610	$S_3E_2$	0.610	$S_4E_1$	0.591	$S_4E_1$	0.595	$S_4E_3$	0.633	$S_4E_1$	0.624
4	S4E2	0.608	$S_4E_2$	0.608	S <sub>3</sub> E <sub>3</sub>	0.564	S <sub>3</sub> E <sub>3</sub>	0.592	$S_3E_2$	0.583	S <sub>3</sub> E <sub>3</sub>	0.609
5	$S_3E_1$	0.590	$S_3E_1$	0.590	$S_3E_2$	0.546	$S_3E_2$	0.570	$S_3E_3$	0.581	$S_3E_2$	0.608
6	$S_4E_1$	0.584	$S_4E_1$	0.584	$S_2E_3$	0.538	$S_3E_1$	0.561	$S_3E_1$	0.569	$S_3E_1$	0.592
7	$S_2E_3$	0.544	$S_2E_3$	0.544	$S_3E_1$	0.528	$S_2E_3$	0.558	$S_2E_2$	0.523	$S_2E_2$	0.553
8	$S_2E_2$	0.524	$S_2E_2$	0.524	$S_2E_2$	0.496	$S_2E_2$	0.523	$S_2E_1$	0.523	$S_2E_1$	0.550
9	$S_2E_1$	0.515	$S_2E_1$	0.515	$S_2E_1$	0.494	$S_2E_1$	0.517	$S_2E_3$	0.490	$S_2E_3$	0.519
10	$S_1E_3$	0.399	$S_1E_3$	0.399	$S_1E_3$	0.447	$S_1E_3$	0.455	$S_1E_2$	0.443	$S_1E_1$	0.449
11	$S_1E_1$	0.357	$S_1E_1$	0.357	$S_1E_1$	0.413	$S_1E_1$	0.420	$S_1E_1$	0.443	$S_1E_2$	0.449
12	$S_1E_2$	0.355	$S_1E_2$	0.355	$S_1E_2$	0.411	$S_1E_2$	0.419	$S_1E_3$	0.441	$S_1E_3$	0.447

Table 1 Rankings of the retrofit alternatives at each location obtained using MCDM procedure.

Alt.: Alternatives

Rel. Clos.= relative closeness values

## 6. ACKNOWLEDGEMENTS

This research was supported by the projects ReLUIS 2022-2024 (funded by the Italian Civil

Protection Department) and SERENE - 2022.08138.PTDC (funded by the Portuguese Foundation for Science and Technology).

#### 7. REFERENCES

- Calvi, G.M., Sousa, L., Ruggeri, C. (2016) Energy Efficiency and Seismic Resilience: A Common Approach. In Multi-hazard Approaches to Civil Infrastructure Engineering, pp. 165-208.
- Carofilis, W., Gabbianelli, G., Monteiro, R. (2022a) Assessment of Multi-Criteria Evaluation Procedures for Identification of Optimal Seismic Retrofitting Strategies for Existing RC Buildings, Journal of Earthquake Engineering, 26:11, 5539-5572.
- Carofilis, W., Clemett, N., Gabbianelli, G., O'Reilly,
  G. J., Monteiro, R. (2022b): Influence of Parameter Uncertainty in Multi-Criteria Decision-Making When Identifying Optimal Retrofitting Strategies for RC Buildings, Journal of Earthquake Engineering.
- Caruso, M., Pinho, R., Bianchi, F., Cavalieri, F., Lemmo, M.T. (2021) Integrated economic and environmental building classification and optimal seismic vulnerability/energy efficiency retrofitting, Bulletin of Earthquake Engineering, 19, 3627–3670.
- Caterino, N., Iervolino, I., Manfredi, G., Cosenza, E. (2008) Multi-Criteria Decision Making for Seismic Retrofitting of RC Structures. J Earthq Eng, 12:555–83.
- Clemett, N., Carofilis, W., O'Reilly, G.J., Gabbianelli, G., Monteiro, R. (2022) Optimal seismic retrofitting of existing buildings considering environmental impact, Eng Struct, 250, 113391.
- Clemett, N., Carofilis, W., Gabbianelli, G., O'Reilly, G. J., Monteiro, R. (2023) Optimal Combined Seismic and Energy Efficiency Retrofitting for Existing Buildings in Italy. Journal of Structural Engineering, 149(1), 04022207.
- EDILCLIMA. 2021. EC700 energy performance of buildings. EDILCLIMA Software and Engineering.
- FEMA (Federal Emergency Management Agency). 2018a. Seismic performance assessment of buildings, volume 1—Methodology. 2nd ed. Washington, DC: FEMA.
- FEMA (Federal Emergency Management Agency). 2018b. Seismic performance assessment of buildings, volume 3: Supporting electronic mate rials and background documentation. 3rd ed.Washington, DC: FEMA.
- Gkatzogias, K., Tsionis, G., Romano, E., Negro, P., Pohoryles, D., Bournas, D. and Sousa, L.,

Integrated techniques for the seismic strengthening and energy efficiency of existing buildings: Pilot Project Workshop 16-19 November 2020.

- Il Ministro Dello Sviluppo Economico. 2015. Decreto interministeriale 26 Giugno 2015, Applicazione delle metodologie di calcolo delle prestazioni energetiche e definizione delle prescrizioni e dei requisiti minimi degli edifici.
- Marini, A., Passoni, C., Belleri, A., Feroldi, F., Preti, M., Metelli, G., Giuriani, E., Riva, P., Plizzari, G. (2017) Combining seismic retrofit with energy refurbishment for the sustainable renovation of RC buildings: A proof of concept. Eur. J. Environ. Civ. Eng., 26, 2475–2495.
- Menna, C., Del Vecchio, C., Di Ludovico, M., Mauro, G.M., Ascione, F., Prota, A. (2021) Conceptual design of integrated seismic and energy retrofit interventions. J. Build. Eng., 38, 102190.
- Mucedero G, Perrone D, Brunesi E, Monteiro R. Numerical modelling and validation of the response of masonry infilled rc frames using experimental testing results. Buildings. 2020;10(10):1-30.
- Mucedero G, Perrone D, Monteiro R. Nonlinear static characterisation of masonry infilled RC building portfolios accounting for variability of infill properties. Bull Earthquake Eng. 2021;19(6):2597-2641.
- Mucedero, G.; Perrone, D.; Monteiro, R. Epistemic Uncertainty in Poorly Detailed Existing Frames Accounting for Masonry Infill Variability and RC Shear Failure. Earthq. Eng. Struct. Dyn. 2022, 51, 3755–3778.
- O'Reilly, G.J.; Sullivan, T.J. Quantification of Modelling Uncertainty in Existing Italian RC Frames. Earthq. Eng. Struct. Dyn. 2018, 47, 1054–1074.
- Olsson, A.; Sandberg, G.; Dahlblom, O. On Latin Hypercube Sampling for Structural Reliability Analysis. Struct. Saf. 2003, 25, 47–68.
- Prota, A., M. Di Ludovico, C. Del Vecchio, and C. Menna. 2020. "Progetto DPC-ReLUIS 2019-2021 WP5: Interventi di rapida esecuzione a basso impatto ed integrati." RELUIS 72.
- Saaty, T. L. 1980. The analytic hierarchy process. New York:McGraw-Hill.