

# 1 Eco-costs implementation for the optimal design of buildings with 2 better environmental performance

3 **Joan Carreras<sup>a</sup>, Dieter Boer<sup>a,\*</sup>, Luisa F. Cabeza<sup>d</sup>, Laureano Jiménez<sup>b</sup>, Gonzalo**  
4 **Guillén-Gosálbez<sup>b,c</sup>,**  
5

6 <sup>a</sup>Departament d'Enginyeria Mecànica, Universitat Rovira i Virgili, Av. Paisos Catalans 26, 43007  
7 Tarragona, Spain, Tel: +34-977 55 96 31, e-mail: dieter.boer@urv.net

8 <sup>b</sup>Departament d'Enginyeria Química, Universitat Rovira i Virgili, Av. Paisos Catalans 26, 43007  
9 Tarragona, Spain

10 <sup>c</sup>Centre for Process Integration, School of Chemical Engineering and Analytical Science, The University  
11 of Manchester, Manchester M13 9PL, UK

12 <sup>d</sup>GREA Innovació Concurrent, Edifici CREA, Universitat de Lleida, Pere de Cabrera s/n, 25001-Lleida,  
13 Spain

## 14 15 **Abstract**

16 At present, most products and processes are optimized according only to their economic  
17 performance and disregarding environmental aspects. To promote a more sustainable economy,  
18 however, the environmental performance should be accounted for in the analysis. Here we  
19 present a methodology based on the use of eco-costs to translate the environmental impact of a  
20 building into monetary units that are incorporated explicitly into its economic performance  
21 assessment. The capabilities of the methodology presented are illustrated through a case study  
22 where the objective is to optimize the thermal insulation of a building envelope in different  
23 climate zones. Our approach identifies building solutions that significantly improve the  
24 environmental performance at a marginal increase in cost.

25  
26 **Keywords:** Eco-costs, Optimization, Life cycle assessment (LCA), Modelling, Buildings,  
27 Insulation

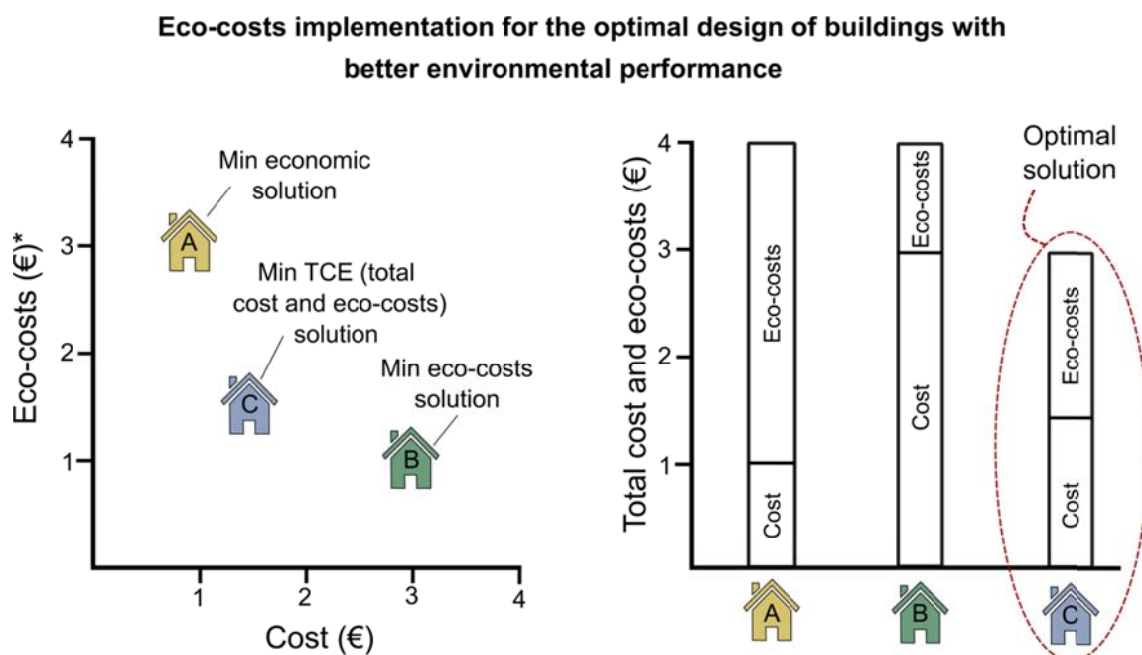
29 **Highlights**

30

- 31 • A methodology to determine the optimal building insulation thickness is proposed.
- 32 • Optimal designs simultaneously reduce the cost and associated environmental impact.
- 33 • Eco-costs is used to translate the environmental impact into monetary units.
- 34 • A unique optimum is reached avoiding having to decide among different solutions.

35

36 **Graphical abstract**



37 \*Eco-costs is implemented to translate the environmental impact into monetary units

38 **Nomenclature**

39 Abbreviations

- 40 LCA Life Cycle Assessment
- 41 MOO Multi-Objective Optimization
- 42 SOO Single-Objective Optimization
- 43 LCIA Life Cycle Impact Assessment
- 44 EVR Eco-costs / Value Ratio

44	NSGA-II	Non-dominated sorting genetic algorithm-II
45	LCI	Life Cycle Inventory
46	ECN	Energy research Centre of the Netherlands
47	ILCD	Life Cycle Data System
48	JRC	European Commission Joint Research Centre
49	TCE	Total conventional cost and eco-costs
50	PU	Polyurethane
51	MW	Mineral wool
52	ITeC	Instituto de Tecnología de la Construcción (Institute of Construction
53		Technology)
54	GLO	Average global impact
55	EI99	Eco-indicator 99
56	ACH	Air changes per hour
57	COP	Coefficient of performance
58		
59	Variables	
60	<i>COST</i>	Cost [€]
61	<i>UCOST</i>	Unitary Cost [€/kg]
62	<i>M</i>	Quantity [kg]
63	<i>CONS</i>	Consumption [kWh]
64	<i>ECO_COSTS</i>	Total Eco_costs [€]
65	<i>UECO_COSTS</i>	Unitary Eco_costs [€/kg]
66		
67	Indices	
68	<i>TOT</i>	Total
69	<i>MAT</i>	Materials

70	<i>EN</i>	Energy
71		
72	Sets	
73	<i>k</i>	Construction materials
74	<i>n</i>	Years
75		
76	Symbols	
77	<i>ir</i>	Electricity inflation rate (%)
78	<i>z</i>	Objective functions
79	<i>x</i>	Decision variables
80	<i>X</i>	Space of feasible solutions

81

## 82 **1. Introduction**

83 Environmental issues are gaining wider interest in engineering, which strives to develop more  
84 sustainable products and processes. Specifically, the building and construction sector offers  
85 many opportunities for environmental improvements. This sector represents 40% of the total  
86 annual energy consumption worldwide [1]. Improving the energy efficiency in new and existing  
87 buildings is therefore becoming a priority objective in the EU and US [2,3]. One of the most  
88 promising energy efficiency strategies in this context is the application of a proper thermal  
89 insulation in the building envelope [4,5].

90 At present, the trend in the construction sector is to promote high insulation thicknesses in order  
91 to reduce energy consumption for heating and cooling. This strategy may lead to sub-optimal  
92 solutions when one seeks to optimize the economic and environmental performance  
93 simultaneously. This is because the environmental impact embodied in the insulation material  
94 can be significant, to the point that it may not eventually compensate for the associated energy  
95 savings. In the European and North American market, the most widely used insulation materials  
96 are inorganic fibrous materials, glass wool and stone wool, followed by organic foamy  
97 materials, and expanded and extruded polystyrene [6,7]. Some studies showed that the impact

98 embodied in these construction materials can indeed contribute very significantly to the total  
99 environmental impact of a building [8,9].

100 To properly assess the impact of buildings it is needed to adopt a life cycle approach. Life cycle  
101 assessment (LCA) is an objective methodology to quantify the environmental burdens of a  
102 product considering all the stages in its life cycle [10,11]. Environmental indicators based on  
103 LCA enable us to quantify a wide variety of environmental problems related to human health,  
104 ecosystem quality and resources depletion.

105 Economic and environmental objectives tend to be conflicting targets. Hence, to optimize both  
106 criteria simultaneously, we need to resort to multi-objective optimization (MOO) techniques  
107 [12–16]. Usually the final result of a MOO consists of a set of Pareto optimal solutions, each  
108 achieving a unique combination of objective function values. When different players take part in  
109 the decision-making process and particularly when the problem covers many conflicting criteria,  
110 it might be difficult to generate the Pareto points and identify a final alternative to be  
111 implemented in practice. As an example, some decision-makers might prefer the solution  
112 showing the maximum economic performance, whereas others may chose an intermediate trade-  
113 off solution (or even the least impact one).

114 This work explores the use of monetization techniques to incorporate environmental aspects in  
115 the design of buildings. The advantage of this approach is that it avoids the use of multi-  
116 objective optimization models, which might be difficult to handle when several environmental  
117 impacts need to be incorporated into the model. In essence, we aim to develop a model for  
118 building design where everything is expressed in monetary terms, and in which the trade-offs  
119 between economic and environmental objectives are explicitly considered via economic  
120 penalties that lead to a single-objective optimization (SOO) with a unique optimal solution.

121 Different approaches exist to convert environmental impacts into cost. They can be classified  
122 into two main methods [17–19]. The first is the damage-based approach, in which the monetary  
123 cost is assigned at the end of the life cycle impact assessment (LCIA). This value expresses  
124 monetarily the amount of wellness losses due to the impacts of a product or activity. The

125 quantification is based on the people's willingness to pay to avoid an impact, which reflects  
126 individual preferences [20,21]. The second is the prevention based approach (also known as  
127 Marginal Abatement Cost); in this case the damage cost depends on the policy targets fixed by  
128 each government regarding each specific environmental problem. In this context society fixes  
129 indirectly the environmental policies through their vote to one or another political proposal.  
130 These costs are based on the cost of additional impacts reduction measures. These political  
131 targets, theoretically, reflect the collective preferences of society [22,23].

132 Eco-costs is a prevention based approach. However, this approach differs from other prevention  
133 methods in that the goal is not based on policy targets, but rather established by "the earth's  
134 estimated carrying capacity". This capacity is established according to the definition of eco-  
135 efficiency made by the World Business Council for Sustainable Development [24]. Eco-costs  
136 translates the environmental impact into economic cost by measuring the cost of preventing a  
137 given amount of environmental burden [23]. The eco-costs indicator has found applications in  
138 the assessment of different products. Vogtländer et al. [25] used eco-costs to compare the  
139 environmental impact of bamboo materials, shipped to Western Europe, with commonly used  
140 materials such as timber. Morales-Mora et al. [26] evaluated the marginal prevention cost for an  
141 increment in the production capacity of an acrylonitrile plant in Mexico. Baeza-Brotons et al.  
142 [27] used eco-costs to compare the environmental impact of concrete with and without addition  
143 of waste. Kravanja and Čuček [28] presented a novel indicator called eco-profit which is based  
144 on the concept of eco-costs. Eco-profit considers not only the environmental burden of a  
145 product or activity but also its environmental credits (i.e. unburden on the environment). These  
146 credits consider that some products or activities can have benefits on the environment (e.g.,  
147 when waste is used). Vogtländer et al. [23] introduced also a new indicator based on the eco-  
148 costs concept called eco-costs / value ratio (EVR). As stated by the authors, the design with the  
149 lowest eco-costs might not be always the best choice because product quality plays as well a  
150 key role. The EVR overcomes this problem by adding the "value" to the eco-costs indicator.

151 This is the perception of the consumer towards the product and it is related with its overall  
152 quality, service quality and image.

153 Here we explore the capabilities of eco-costs in the context of finding the optimal thermal  
154 insulation for building envelopes in 5 European locations. This approach leads to solutions  
155 attaining significant environmental improvements at a marginal increase in cost.

156 The article is organized as follows. Section 2 formally states the problem of interest. Section 3  
157 defines the methodology and the eco-costs approach. In Section 4, the case study is introduced.  
158 In Section 5, the results are presented and discussed. The conclusions of the study are finally  
159 provided in Section 6.

## 160 **2. Problem statement**

161 We consider a cubicle type building (specifications about the cubicle can be found in Sections  
162 4.1 and 4.2), where a set of different insulation materials and different thicknesses can be  
163 established to improve the building performance. The goal of the analysis is to find the building  
164 design that minimizes the total cost, considering the design, operation and associated  
165 environmental impact.

## 166 **3. Methodology**

### 167 **3.1. Mathematical model**

168 The building is modelled with EnergyPlus v.8 [29–31] a building energy simulation program  
169 that quantifies the energy loads of the system. In mathematical terms, the building can be  
170 modelled as a system of partial differential equations describing the energy balances involved.  
171 The variables optimized are the insulation materials and their thicknesses, and the objectives to  
172 minimize are the economic cost and the environmental impact. Note, however, that this general  
173 methodology can work with different decision variables and objective functions.

174 Without loss of generality, in this work the model of the building is optimized with a genetic  
175 algorithm-II (NSGA-II): JEPlus+EA [32], which is combined with EnergyPlus following an  
176 approach similar to the one used in a previous work [33]. Other optimization algorithms could

177 be used at this point, but we found from numerical examples that genetic algorithms work well  
 178 in this case, mainly because of the nonconvex nature of the system of equations that need to be  
 179 optimized.

## 180 **3.2. Objective functions**

### 181 **3.2.1. Economic indicators**

182 One of the pursued objectives is to minimize the economic cost [34–36]. The total cost (  
 183  $COST^{TOT}$ ) includes the cost of the construction materials ( $COST^{MAT}$ ) and the cost of the  
 184 energy required for heating and cooling over the life-time of the cubicle ( $COST^{EN}$ ).

$$185 \quad COST^{TOT} = COST^{MAT} + COST^{EN} \quad (1)$$

186 The total price of the materials for the construction of the cubicle is quantified as shown in  
 187 equation 2.

$$188 \quad COST^{MAT} = \sum_{k \in K} UCOST_k^{MAT} \cdot M_k \quad (2)$$

189 Where  $UCOST_k^{MAT}$  is the unitary cost per kilogram of raw material  $k$  and  $M_k$  is the  
 190 correspondent quantity in kilograms of raw material  $k$  (*i.e.*, kg of concrete).

191 The energy used for covering the cooling and heating requirements over the operational life of  
 192 the building was obtained via the following equation:

$$193 \quad COST^{EN} = \sum_{n \in N} CONS_n \cdot UCOST^{EN} \cdot (1+ir)^n \quad (3)$$

194 where  $CONS_n$  is the energy consumed (expressed in kWh) for heating and cooling in year  $n$ ,  
 195  $UCOST^{EN}$  is the current cost of the kWh of electricity, and  $ir$  is the yearly interest rate of the  
 196 electricity cost.



197 **3.2.2. Environmental indicators (eco-costs)**

198 As already mentioned, the environmental impact is expressed in economic terms using the eco-  
199 costs indicator [37]. Specifically, this indicator quantifies the cost of preventing a certain  
200 amount of environmental burden related to a product or activity. Eco-costs considers the cradle  
201 to grave environmental impact of a material, including all the phases in the life cycle of the  
202 product. These are regarded as virtual costs, since they are not yet integrated into the real costs  
203 of the product under study.

204 The eco-costs account for the following 5 elements (see [38] for further details):

- 205 • The virtual pollution prevention costs '99.
- 206 • The eco-costs of energy.
- 207 • The material depletion costs.
- 208 • The eco-costs of depreciation.
- 209 • The eco-costs of labour.

210 These elements are calculated following LCA principles, as established in the ISO 14041.

211 The virtual pollution prevention costs '99 are calculated from the life cycle inventory (LCI) of  
212 emissions associated with a specific activity, in the case of this study the building design and  
213 operation. The LCI emissions (expressed in equivalent kilograms) are quantified first and then  
214 multiplied with the corresponding “prevention cost” which is the marginal costs (per kilogram  
215 of emission) related to bringing back the pollution to a level which is considered “in line with  
216 earth's carrying capacity” [38,39].

217 The eco-costs of energy correspond to the cost of replacing conventional systems (i.e. fossil  
218 fuels or nuclear) by sustainable energy sources. Data from the database MARKAL developed by  
219 ECN (Energy research Centre of the Netherlands) are used to this end [40]. These eco-costs  
220 might change, declining over time as renewable energy sources replace gradually nonrenewable  
221 ones.

222 The eco-costs of material depletion is assumed to be the same as the market cost of the virgin  
 223 material (when the materials are not recycled). When a fraction “fr” of the used material is  
 224 recycled, then a correction factor is applied (eco-costs of material depletion = ' virgin material  
 225 market cost ' x (1 - fr)) [38].

226 The eco-costs of labour are those indirect costs associated to the environmental impacts of i.e.  
 227 the energy consumed for heating or lighting a building. In our case study we consider those  
 228 costs related to the heating and cooling requirements.

229 The eco-costs of depreciation of product facilities are those indirect costs that consider the  
 230 reduction in the value of a product arising from its use or the passage of time. In this study no  
 231 depreciation is considered because the cost of the building is agreed to pay the first year.

232 The data used in our analysis was taken from the database developed by the Delft University of  
 233 Technology, which is based on LCIs retrieved from ecoinvent. The eco-costs (expressed in €/kg  
 234 or €/MJ) of a wide variety of materials are available, including the ones widely used in the  
 235 construction of buildings [37].

236 The total cost of the environmental impact ( $ECO\_COSTS^{TOT}$ ) accounts for the cost of the  
 237 impact of the construction materials ( $ECO\_COSTS^{MAT}$ ), and the cost of the impact of the  
 238 energy consumed for heating and cooling over the operational phase of the building (  
 239  $ECO\_COSTS^{EN}$ ):

$$240 \quad ECO\_COSTS^{TOT} = ECO\_COSTS^{MAT} + ECO\_COSTS^{EN} \quad (4)$$

241 The total eco-costs of the materials for the construction of the cubicle ( $ECO\_COSTS^{MAT}$ ) is  
 242 calculated as follows:

$$243 \quad ECO\_COSTS^{MAT} = \sum_{k \in K} UECO\_COSTS_k^{MAT} \cdot M_k \quad (5)$$

244 Where  $UECO\_COSTS_k^{MAT}$  is the marginal prevention cost per kilogram of raw material  $k$  (an  
 245 information that is available in the eco-costs database [37], and  $M_k$  is the corresponding  
 246 quantity (expressed in kilograms) of raw material  $k$ .

247 To translate the energy consumed to eco-costs, the data of the energy production system of each  
 248 country is used. The impact of energy production depends on the country where the energy is  
 249 consumed, while the impact of the materials is assumed to be the same for all the countries. The  
 250 total eco-costs of the consumed energy ( $ECO\_COSTS^{EN}$ ) is calculated as follows:

$$251 \quad ECO\_COSTS^{EN} = \sum_{n \in N} CONS_n \cdot UECO\_COSTS^{EN} \quad (6)$$

252 Where  $UECO\_COSTS^{EN}$  is the eco-costs per kWh of energy in each country and  $CONS_n$  is  
 253 the yearly consumed energy in period  $n$ .

### 254 3.2.3. Enviro-economic indicator

255 Converting the environmental impact to monetary terms enables us to reformulate the multi-  
 256 objective problem into a single-objective one with a unique objective function. The total cost is  
 257 therefore calculated as follows:

$$258 \quad TCE = COST^{TOT} + ECO\_COSTS^{TOT} \quad (7)$$

259 Where TCE is the total cost, which includes both, the conventional cost ( $COST^{TOT}$ ) and the eco-  
 260 costs ( $ECO\_COSTS^{TOT}$ ). Thus, we seek to minimize the value of  $TCE$ .

### 261 3.3. Solution procedure

262 The EnergyPlus simulation model can be expressed in mathematical terms as an explicit  
 263 function as follows:

$$264 \quad z = \{z_1, \dots, z_p\} = f^{MOD}(x) \quad (8)$$

265 Where vector  $z$  is the objective function that combines the real cost with the virtual eco-costs.

266 The value of the objective function is determined from the outcome of the simulation model

267 after specifying the insulation material and the thickness values. These decision variables are  
268 represented by vector  $x$ . The single-objective problem can be expressed in a compact form as  
269 follows:

$$270 \quad \min_{x \in X} (z) = \min_{x \in X} f^{MOD}(x) \quad (9)$$

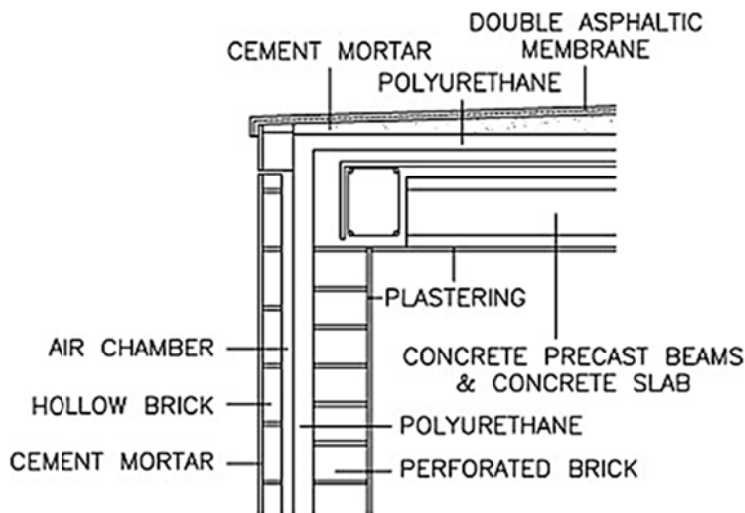
271 where  $X$  denotes the feasible space of possible solutions,  $z$  is the objective function and  $x$  is  
272 the vector of decision variables. The constraints of the model, which are solved implicitly in the  
273 simulation package, are given by equations based on first principles (*e.g.*, mass and energy  
274 balances). The only explicit constraint handled externally (by the optimization algorithms  
275 instead of the simulation package) imposes lower and upper bounds on the insulation thickness.

## 276 **4. Case study**

### 277 **4.1. Cubicle description**

278 Real cubicles located in an experimental installation in Puigverd de Lleida (Lleida, North-East  
279 Spain) are modelled in our work. All cubicles consist of five plane walls of  $2.4 \times 2.4$  m. They  
280 show the same structure and differ only in the insulation materials implemented. The cubicles  
281 present four mortar pillars frames with reinforcing bars. The base consists of a concrete  
282 foundation of  $3 \times 3$  m. The roof frame is made of concrete precast beams and 5 cm of concrete  
283 slab. The external layer is a double asphaltic membrane which covers a cement mortar coating  
284 with a slope of 3%. The insulation material is located under the cement mortar and is connected  
285 with the insulation of the walls avoiding possible thermal bridges. The internal finish is a  
286 plastering layer. The walls consist of 6 material layers. The external one is a cement mortar  
287 coating covering a layer of hollow bricks. There is an air chamber of 5 cm between the hollow  
288 bricks and the insulation material (PU or MW depending on the model). The internal face of the  
289 wall is made of a perforated bricks structure and a plaster plastering layer [41,42].

290 The real cubicles are located in Lleida, but in the present study we consider as well other  
291 potential locations (specifications in 4.3).



293

294 Fig.1. Construction profile of the experimental cubicles in Puigverd de Lleida (Spain).

297 To quantify the cost of the materials we use the data provided in [33]. Table 1 presents the  
 298 specific cost and the thermo-physical properties of the insulation materials considered. These  
 299 data were obtained from the LIDER [43] and ITeC [44] databases.

298 Table 1.

299 Properties of the insulation materials.

Insulation material	Density ( $\text{kg/m}^3$ )	Thermal conductivity ( $\text{W}/(\text{m}\cdot\text{K})$ )	Specific heat ( $\text{J}/(\text{kg}\cdot\text{K})$ )	Cost ( $\text{€}/\text{m}^3$ )
Polyurethane	45	0.027	1,000	175
Mineral Wool	40	0.04	1,000	122

300

305 The electricity used for covering the cooling and heating requirements over the operational life  
 306 of the building was obtained by dividing the useful thermal energy by the COP (coefficient of  
 307 performance) of the heat pump (which is assumed to be equal to 3). The electricity consumed is  
 308 then multiplied by the electricity cost in the domestic sector of each country, considering a  
 309 yearly increasing cost of 5% per year [34].

308 The eco-costs parameters are presented in Table 2. As in the economic case, Table 2 also  
 309 presents an indicative example of the eco-costs of a cubicle with 1 cm of insulation thickness in  
 310 all of their surfaces.

308 Table 2. Inventory list of the materials used for the cubicle construction and their corresponding eco-costs.

Component	Name in the data base Ecoinvent corresponding to the component	Used mass (kg)	Eco-costs (Euro/kg)	Total eco-costs (Euro)
Brick	market for brick, GLO [kg]	5,456	$6 \cdot 10^{-2}$	345.39
Base plaster	market for base plaster, GLO [kg]	518	$6 \cdot 10^{-2}$	31.57
Cement mortar	market for cement mortar, GLO [kg]	608	$6 \cdot 10^{-2}$	39.10
Steel bars	market for section bar rolling, steel, GLO [kg]	262	$1 \cdot 10^{-1}$	25.50
Concrete	market for concrete, normal, GLO [m3]	1,240	$4 \cdot 10^{-2}$	49.23
In-floor bricks	market for concrete roof tile, GLO [kg]	1,770	$1 \cdot 10^{-1}$	183.68
Asphalt	market for mastic asphalt, GLO [kg]	153	$7 \cdot 10^{-2}$	10.51
Disposal bricks	market for waste brick, GLO [kg]	5,456	$-4 \cdot 10^{-3}$	-26.93
Disposal plaster	market for waste mineral plaster, GLO [kg]	518	$-5 \cdot 10^{-3}$	-2.96
Disposal mortar	market for waste cement in concrete and mortar, GLO [kg]	608	$-7 \cdot 10^{-3}$	-4.28
Disposal concrete + steel bars	market for waste reinforced concrete, GLO [kg]	1,492	$-5 \cdot 10^{-3}$	-8.65
Disposal in-floor bricks	market for waste concrete, not reinforced, GLO [kg]	1,770	$-5 \cdot 10^{-3}$	-9.07
Disposal asphalt	market for waste asphalt, GLO [kg]	153	$-4 \cdot 10^{-3}$	-0.71
PU	market for polyurethane, rigid foam, GLO [kg]	20	1.03	20.57
MW	market for rock wool, GLO [kg]	18	$4 \cdot 10^{-1}$	7.29
Disposal PU	market for waste polyurethane foam, GLO [kg]	20	$2 \cdot 10^{-1}$	3.06
Disposal MW	market for waste mineral wool, GLO [kg]	18	$3 \cdot 10^{-3}$	0.07

309

#### 310 4.2. Model specifications

311 Some simplifications were considered in the simulations of the cubicles in order to fit more  
312 closely the predictions with the experimental observations. According to former studies, an  
313 internal temperature of 24°C is taken as set point for the whole year [41,45]. A heat pump with  
314 a COP of 3 is considered to supply the heating and cooling demands. No openings are taken into  
315 account. No natural or mechanical ventilations are considered, but a fixed infiltration rate of  
316 0.12 ACH (air changes per hour) [46] is assumed. No internal mass and no human occupancy

317 are included in the model. We assume a building lifespan of 20 years [36,47]. The cost of the  
 318 implemented materials for the construction of the building is assumed the first year. As for the  
 319 electricity, the specific price per kWh in each country is considered [48,49].

320 The insulation thickness range is varied from 1 to 30 cm of insulation, this choice was based on  
 321 practical aspects, since no thicker insulation is usually applied in real projects [7]. The materials  
 322 considered are PU and MW. In our case studies, we do not combine different insulation  
 323 materials in the same design.

### 324 4.3. Considered locations

325 Five different locations have been considered, as shown in Table 4. The Köppen–Geiger  
 326 Climate Classification [50] was used to select representative locations of different climates in  
 327 Europe. This classification defines the climatic conditions with a single metric composed of  
 328 three characters. The first one defines the main climate: A: equatorial, B: arid, C: warm  
 329 temperate, D: snow and E: polar. The second character defines the level of precipitation: W:  
 330 desert, S: steppe, f: fully humid, s: summer dry, w: winter dry, m: monsoonal. And finally, the  
 331 third character provides details about the temperature: h: hot arid, k: cold arid, a: hot summer, b:  
 332 warm summer, c: cool summer, d: extremely continental, F: polar frost, T: polar tundra. The  
 333 electricity cost of the different locations was obtained from [51], the electricity impact from  
 334 [52], and the electricity eco-costs from [37].

335 Table 3. Climate condition and electricity cost, impact and eco-costs for the considered locations.

Locations	Climate type	Electricity cost (€/kWh)	Electricity impact (EI99 points/kWh)	Electricity eco-costs (€/kWh)
Lleida (Spain)	BSk	0.223	0.034	0.008
Dublin (Ireland)	Cfb	0.203	0.043	0.011
Athens (Greece)	Csa	0.156	0.089	0.018
Stockholm (Sweden)	Dfb	0.21	0.010	0.002
Berlin (Germany)	Dfb	0.292	0.030	0.009

336

337

338

## 339        **5. Results and discussions**

340    In a preliminar analysis (Section 5.1.), we present the results of considering cubicles with  
341    homogeneous insulation thickness in all their external surfaces (from 1 to 30 cm) in the location  
342    of Lleida. This analysis provides insight into the influence of the insulation thickness on the cost  
343    and environmental impact. We first present the results of the costs, then the eco-costs and  
344    finally the TCE results.

345    In a second analysis (Section 5.2.), we consider cubicles with heterogeneous insulation  
346    thickness; that is, different insulation thicknesses for the roof and the walls (the four walls have  
347    the same insulation thickness). In this case study we present results for 5 different European  
348    locations (Section 4.3.). As in the first analysis, we start by analysing each single objective  
349    separately (cost and eco-costs), and then look for the final optimal solution considering both  
350    economic concepts (TCE).

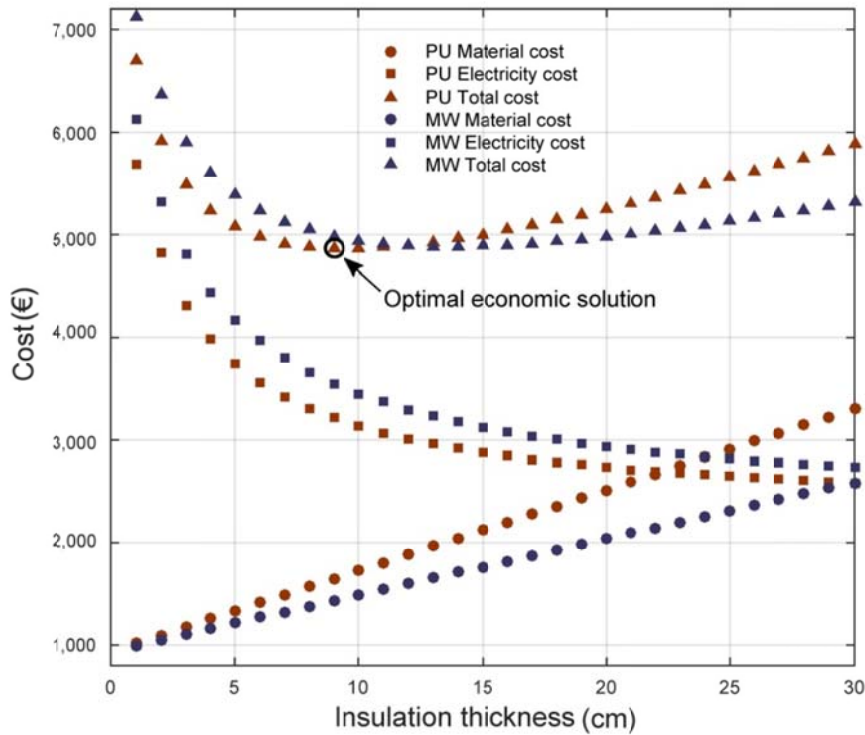
351    Finally (Section 5.3), we will compare the optimal solution of each case with those obtained by  
352    performing a MOO considering the economic cost (€) and the environmental impact as different  
353    objective functions and assessing the environmental impact with the Eco-Indicator 99 (EI99)  
354    [11,53], a metric calculated following LCA principles.

### 355    **5.1. Preliminar analysis: Cubicles with homogeneous insulation thickness**

#### 356    **5.1.1. Economic cost analysis for the case of cubicles with homogeneous insulation** 357    **thickness**

358    Figure 2 presents the results of the analysis that evaluates the variation of the cost and  
359    environmental impact with an increasing insulation thickness of a cubicle located in Lleida,  
360    Spain. As seen, the material cost increases linearly when the insulation thickness increases,  
361    whereas the energy cost decreases. Note that the total cost includes two terms: materials and  
362    energy cost. In the case of Lleida, and considering the same insulation thickness in all the  
363    surfaces, the cubicle solution presenting a better economic performance is the one with 9 cm of  
364    PU.



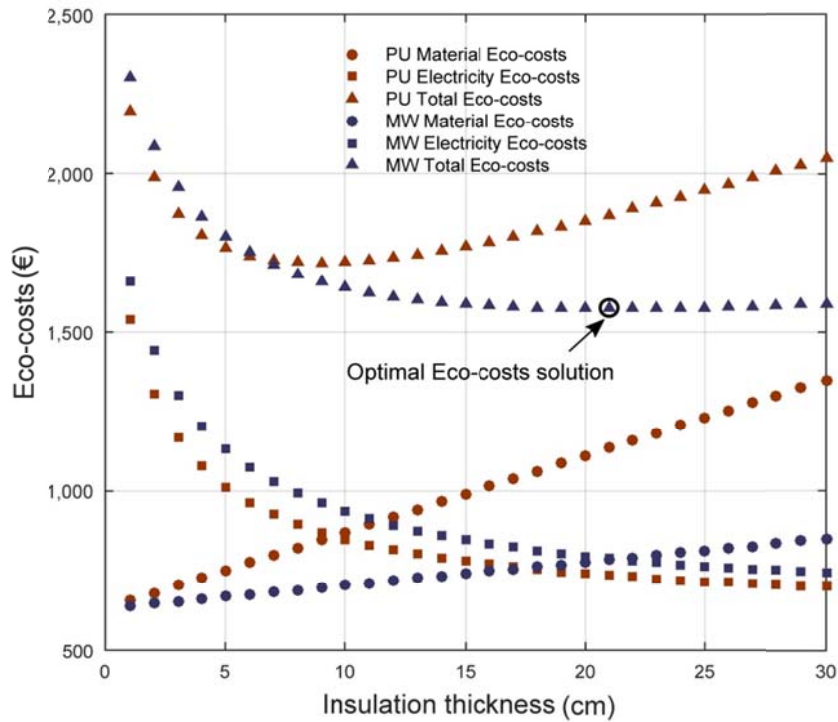


366

368 Fig. 2. Variation of the cubicle cost with the insulation thickness for PU and MW considering a cubicle with  
 369 homogeneous insulation thickness in roof and walls. Results for Lleida, Spain

370 **5.1.2. Environmental analysis (eco-costs) for the case of cubicles with homogeneous**  
 371 **insulation thickness**

373 Figure 3 shows that as the insulation thickness increases, the eco-costs of the materials increases  
 374 linearly while the eco-costs of the electricity decreases. In the case of Lleida, and considering  
 375 the same insulation thickness in all the surfaces, the best cubicle has 21 cm of MW.

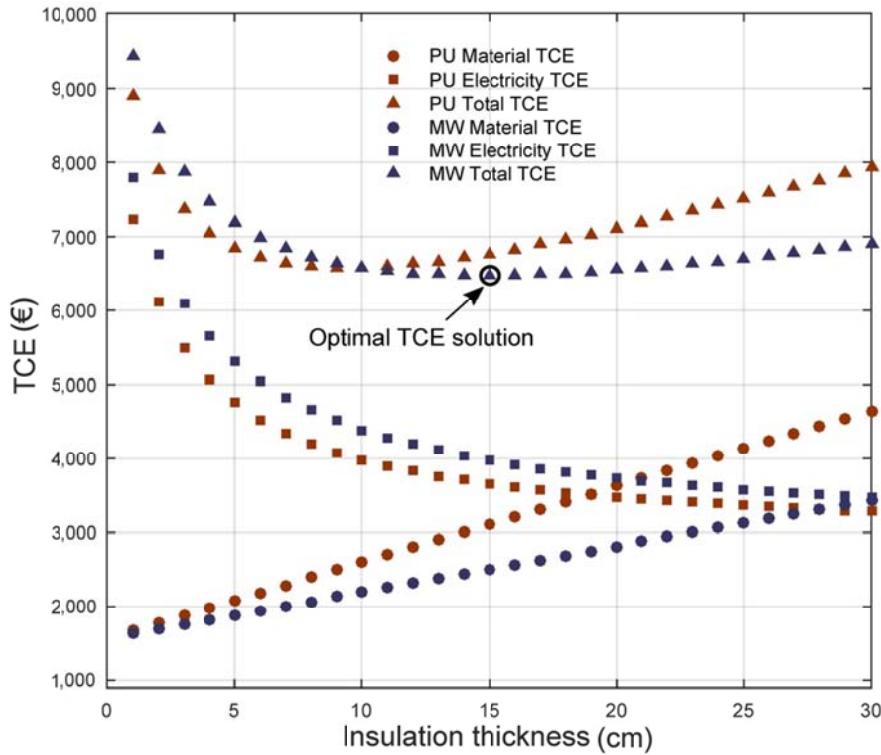


374

376 Fig. 3. Variation of the cubicle eco-costs with the insulation thickness for PU and MW considering a cubicle with  
 377 homogeneous insulation thickness in roof and walls. Results for Lleida, Spain.

378 **5.1.3. Total cost and eco-costs (TCE) analysis for the case of cubicles with homogeneous**  
 379 **insulation thickness**

384 In this section the total cost, considering the current cost and the eco-costs of materials and  
 385 electricity, is analysed. The TCE of the material increases as the insulation thickness increases,  
 386 whereas the TCE of the electricity decreases. In this case, the goal is to find the cubicle solution  
 387 that minimizes the TCE (conventional cost and eco-costs). For the particular case of Lleida, the  
 388 solution presenting a minimum TCE is attained with an insulation thickness of 15 cm of MW  
 389 (Figure 4).



385

387 Fig. 4. Variation of the cubicle TCE with the insulation thickness for PU and MW considering a cubicle with  
 388 homogeneous insulation thickness in roof and walls. Results for Lleida, Spain.

388 **5.2. Optimization results using the proposed approach**

389 **5.2.1. Minimization of the cost using the optimization algorithm**

391 In this section we present the optimal economic solutions considering different insulation  
 392 thicknesses for the roof and the walls for the five locations (Table 4).

393 Table 4. Optimal economic results for cubicles presenting different insulation thicknesses in roof and walls. In this  
 394 case all the solutions use PU.

	Walls insulation thickness (cm)	Roof insulation thickness (cm)	Economic cost (€)
Athens (Greece)	6	9	3,493
Lleida (Spain)	9	11	4,852
Dublin (Ireland)	11	13	6,190
Stockholm (Sweden)	13	15	7,060
Berlin (Germany)	14	16	8,028

394

396 PU turns out to be the most competitive material from the economic standpoint in all of the  
 397 locations. PU is more expensive than MW, but its thermal conductivity is lower, so its energy

396 savings compensate for the extra cost. In all locations, the insulation thickness of the walls is  
 397 slightly thinner than the one in the roof (2 or 3 cm of difference). The difference between the  
 398 economic costs of the solutions depends on the climate conditions and on the electricity cost of  
 399 the location. Athens is the location with the lowest cost and Berlin the one with the highest cost.

400 **5.2.2. Minimization of the eco-costs using the optimization algorithm**

401 The optimal environmental solutions considering different thicknesses in the walls and roof are  
 402 presented in Table 5.

403 Table 5. Optimal eco-costs results for cubicles presenting different insulation thicknesses in roof and walls. In this  
 404 case all the solutions use MW.

	Walls insulation thickness (cm)	Roof insulation thickness (cm)	Eco-costs (€)
Stockholm (Sweden)	12	14	1,055
Lleida (Spain)	21	24	1,572
Berlin (Germany)	29	30	2,156
Dublin (Ireland)	29	30	2,453
Athens (Greece)	30	30	2,292

405  
 406 For all locations, the solution with minimum environmental impact uses MW as insulation  
 407 material. This occurs because the environmental impact of MW is much lower than the impact  
 408 of PU. Specifically, the fossil fuels depletion impact of MW is ten times lower than the impact  
 409 of PU. In this case, the insulation thickness of the walls is also thinner than that implemented in  
 410 the roof, except in Athens, where the thickness is the same. Athens, despite showing mild  
 411 weather conditions, is the location leading to the largest insulation thickness due the high impact  
 412 of its electricity mix. On the other hand, in Stockholm a thicker insulation could be expected  
 413 because of the harsh climate conditions. However, Stockholm shows the smallest thickness  
 414 because of the low impact of its electricity mix (9 times lower than in Athens).

415

416

417 **5.2.3. Minimization of the total cost, including the eco-costs (TCE), using the optimization**  
 418 **algorithm**

419 Table 6 shows the optimal TCE solutions for the five locations.

420 Table 6. Optimal TCE results for cubicles presenting different insulation thicknesses in roof and walls. In this case all  
 421 the solutions use MW.

	Walls insulation thickness (cm)	Roof insulation thickness (cm)	TCE €
Athens (Greece)	13	17	5,988
Lleida (Spain)	14	17	6,468
Stockholm (Sweden)	18	22	8,167
Dublin (Ireland)	19	21	8,739
Berlin (Germany)	22	25	10,238

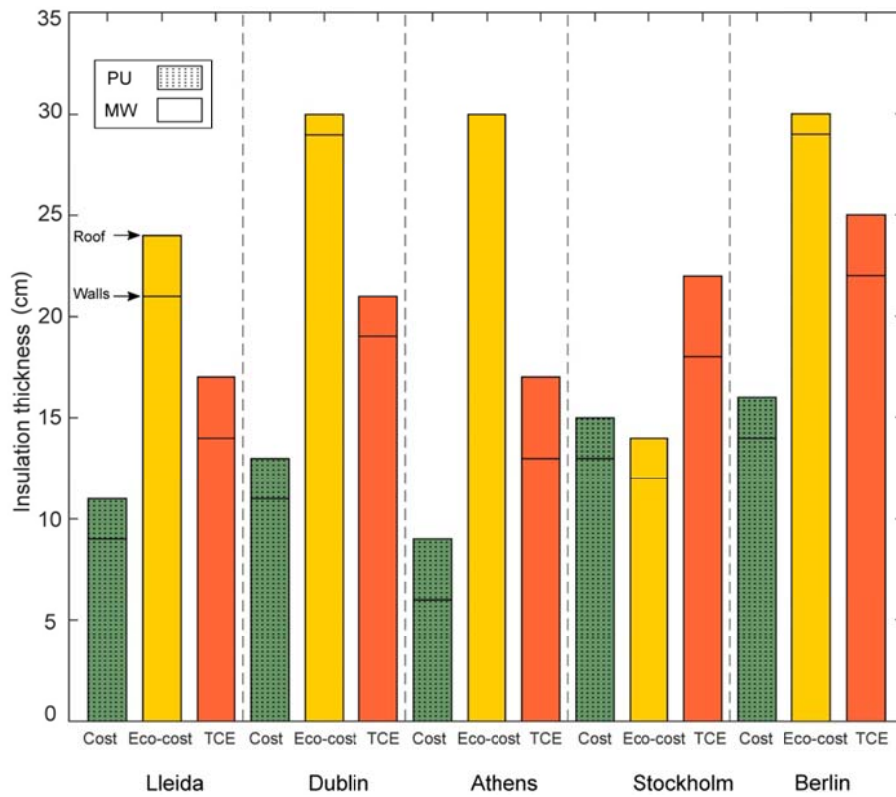
422

423 In all locations, the insulation material implemented is MW. In all scenarios, the optimal  
 424 solutions show thicker insulation layers than in the optimal economic case, but lower than in the  
 425 environmental one (except in Stockholm, where the optimal environmental solution presents a  
 426 lower thickness than the TCE one, due to the lower impact of electricity production). Therefore,  
 427 to move from the conventional economic optimal solution to a solution that also integrates the  
 428 environmental impact in the final cost, it is necessary to resort to a more environmentally  
 429 friendly material (i.e. to replace PU by MW) and to increase the insulation thickness (between 5  
 430 and 11 cm, depending on the case).

431 **5.2.4. Summary results**

432 Figure 5 shows the economic, environmental and TCE optimal solutions for each location. PU  
 433 is the material achieving better economic results, while MW leads to better environmental  
 434 performance in all locations. When resorting to the optimal TCE solutions, in all locations the  
 435 building designs with better performance use MW. In all optimal scenarios, the roof shows  
 436 thicker insulation than the walls, except for the optimal environmental solution of Athens  
 437 (where all surfaces present the same thickness). This is due to the high environmental impact  
 438 associated to the generation of electricity in this country. All optimal TCE solutions show larger

441 thicknesses than the optimal economic solution, and lower than the best environmental ones,  
 442 except for the case of Stockholm (due to the lower impact of electricity production).



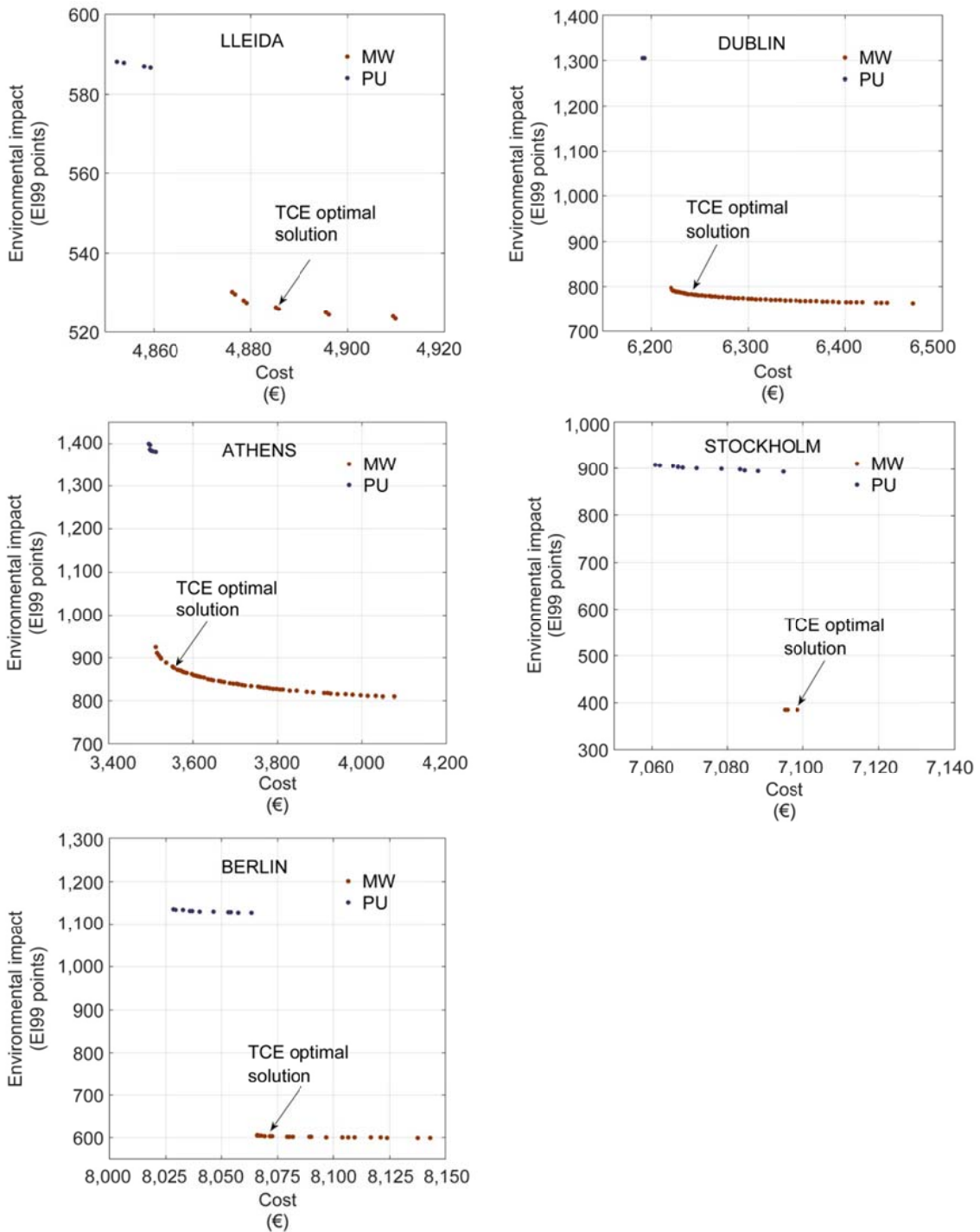
442  
 444 Fig. 5. Optimal economic, environmental and TCE cubicle solutions for the five locations considering different  
 445 insulation thicknesses in walls and roof.

### 445 5.3. Comparative analysis: MOO vs SOO

452 In this section we study the implications of designing buildings following a multi-objective  
 453 approach that optimizes the cost against an aggregated environmental metric, such as the Eco-  
 454 indicator 99 (EI99 from now on) [53]. The EI99 is a LCA based method that considers 11  
 455 impacts aggregated into 3 damage categories: human health, ecosystems quality and depletion  
 456 of resources, which are further translated into a single aggregated metric using normalization  
 457 and weighting factors. This metric has been extensively used in the optimization of sustainable  
 458 processes [54,55].

454 The results of the problem when the environmental impact is not expressed in monetary terms  
 455 but in impact points are expressed in terms of a set of Pareto optimal points. There are two

456 extreme optimal solutions, the optimal economic and minimum environmental impact  
 457 alternatives, and a set of intermediate optimal solutions lying between them (Figures 6).



457  
 459 Fig. 6. MOO optimal cubicle solutions and TCE optimal solution for the five considered locations considering  
 460 different insulation thicknesses in walls and roof.

461 Figure 6 shows that the TCE optimal solutions are intermediate solutions of the MOO problem  
 462 for all locations. In all the cases, the solutions implement MW and are close to the extreme

461 economic optimal solution (but with a clear improvement in environmental performance).  
462 Hence, the use of eco-costs leads to solutions that belong to the Pareto front cost vs Eco-  
463 indicator 99, but avoids the need to conduct any post-optimal analysis of the Pareto solutions (as  
464 the weights to be assigned to every objective are explicitly established beforehand).

## 465 **6. Conclusions**

466 Nowadays the prevalent method to quantify the cost of a product is through its economic cost.  
467 However, the society is becoming more environmental conscious. As a result, many companies  
468 and consumers seek for products that are cost efficient but also environmentally friendly.

469 This work presents a methodology to design buildings considering their economic and  
470 environmental performance simultaneously using eco-costs. Eco-costs is an indicator that  
471 quantifies the cost related to the environmental burden of an activity or a product on basis of the  
472 prevention of that burden. The use of eco-costs in the design of buildings avoids the formulation  
473 and solution of complex multi-objective problems accounting for the simultaneous optimization  
474 of a wide range of environmental objectives.

475 The capabilities of the proposed method are illustrated through a case study, where the main  
476 goal is to optimize the insulation thickness of the envelope of a building minimizing its cost and  
477 environmental impact simultaneously. For the economic and environmental analysis, we  
478 consider the cost and impact of the materials used in the construction of the building and the  
479 cost and impact of the energy consumed for cooling and heating during its operational life.

480 Different European locations were considered in the analysis to compare the effect of different  
481 weather conditions and the importance of the cost and the impact of the energy consumed.

482 Results show that to move from the conventional economic optimal solution to a solution that  
483 also considers the environmental impact, it is necessary to: i) resort to a more environmentally  
484 friendly material (replace PU by MW), and ii) increase the insulation thickness (since MW  
485 presents a higher thermal conductivity than the PU).



486 The monetization of the environmental impact through the eco-costs overcomes the problem of  
487 deciding among different optimal solutions, attaining one unique alternative and facilitating the  
488 decision-making process.

489 In all the scenarios analysed, the minimum TCE solution is a Pareto point of the MOO problem  
490 cost vs Eco-indicator 99. Specifically, the single-objective approach produces solutions that  
491 implement MW and are close to the Pareto points lying near the extreme economic optimal  
492 solution (yet they show a clear improvement in environmental impact with respect to the  
493 minimum cost alternative of the Pareto set).

## 494 **7. Acknowledgements**

495 The authors would like to acknowledge financial support from the Spanish Government  
496 (DPI2012-37154-C02-02, CTQ2012-37039-C02) and to thank the Catalan Government for the  
497 quality accreditation given to their research groups GREA (2014 SGR 123). The research  
498 leading to these results has received funding from the European Commission Seventh  
499 Framework Programme (FP/2007-2013) under grant agreement no. PIRSES-GA-2013-610692  
500 (INNOSTORAGE).

## 501 **References**

- 502 [1] IEA, Promoting Energy efficiency investments. Case studies in the residential  
503 sector., (2008).
- 504 [2] European directive 2010/31/EU, Directive 2010/31/EU of the European  
505 Parliament and of the Council of 19 May 2010 on the energy performance of  
506 buildings., (2010).
- 507 [3] DOE, US - Residential Provisions of the 2012 International Energy Conservation  
508 Code, (2012).
- 509 [4] F. Nemry, A. Uihlein, C.M. Colodel, C. Wetzel, A. Braune, B. Wittstock, et al.,  
510 Options to reduce the environmental impacts of residential buildings in the  
511 European Union-Potential and costs, Energy and Buildings. 42 (2010) 976–984.  
512 doi:10.1016/j.enbuild.2010.01.009.
- 513 [5] E. Cuerda, M. Pérez, J. Neila, Facade typologies as a tool for selecting  
514 refurbishment measures for the Spanish residential building stock, Energy and  
515 Buildings. 76 (2014) 119–129. doi:10.1016/j.enbuild.2014.02.054.

- 516 [6] NAIMA, <http://www.naima.org/index.php> (North American Insulation  
517 Manufacturers Association) [Accessed: March 2015], (2014).
- 518 [7] EURIMA, <http://www.eurima.org/> [Accessed: April 2015], (2014).
- 519 [8] G.A. Blengini, T. Di Carlo, The changing role of life cycle phases, subsystems  
520 and materials in the LCA of low energy buildings, *Energy and Buildings*. 42  
521 (2010) 869–880. doi:10.1016/j.enbuild.2009.12.009.
- 522 [9] A. Stephan, R.H. Crawford, K. de Myttenaere, A comprehensive assessment of  
523 the life cycle energy demand of passive houses, *Applied Energy*. 112 (2013) 23–  
524 34. doi:10.1016/j.apenergy.2013.05.076.
- 525 [10] A. Azapagic, Life cycle assessment and its application to process selection,  
526 design and optimisation, *Chemical Engineering Journal*. 73 (1999) 1–21.  
527 doi:10.1016/S1385-8947(99)00042-X.
- 528 [11] ISO 14044, ISO 14044: Environmental Management - Life Cycle Assessment -  
529 Requirements and Guidelines, ISO, 2006.
- 530 [12] I.E. Grossmann, G. Guillén-Gosálbez, Scope for the application of mathematical  
531 programming techniques in the synthesis and planning of sustainable processes,  
532 *Computers & Chemical Engineering*. 34 (2010) 1365–1376.  
533 doi:10.1016/j.compchemeng.2009.11.012.
- 534 [13] G. Guillén-Gosálbez, I.E. Grossmann, Optimal design and planning of  
535 sustainable chemical supply chains under uncertainty, *AIChE Journal*. 55 (2009)  
536 99–121. doi:10.1002/aic.11662.
- 537 [14] E. Antipova, D. Boer, G. Guillén-Gosálbez, L.F. Cabeza, L. Jiménez, Multi-  
538 objective optimization coupled with life cycle assessment for retrofitting  
539 buildings, *Energy and Buildings*. 82 (2014) 92–99.  
540 doi:10.1016/j.enbuild.2014.07.001.
- 541 [15] C. Diakaki, E. Grigoroudis, D. Kolokotsa, Towards a multi-objective  
542 optimization approach for improving energy efficiency in buildings, *Energy and*  
543 *Buildings*. 40 (2008) 1747–1754. doi:10.1016/j.enbuild.2008.03.002.
- 544 [16] S. Carlucci, G. Cattarin, F. Causone, L. Pagliano, Multi-objective optimization of  
545 a nearly zero-energy building based on thermal and visual discomfort  
546 minimization using a non-dominated sorting genetic algorithm (NSGA-II),  
547 *Energy and Buildings*. 104 (2015) 378–394. doi:10.1016/j.enbuild.2015.06.064.
- 548 [17] and M.S. S. de Bruyn, M. Korteland, A. Markowska, M. Davidson, F. de Jong,  
549 M. Bles, *Shadow prices handbook—Valuation and weighting of emissions and*  
550 *environmental impacts*. Delft, the Netherlands : CE Delft., 2010.
- 551 [18] G. Huppes, M.D. Davidson, J. Kuyper, L. van Oers, H. a. Udo de Haes, G.  
552 Warringa, *Eco-efficient environmental policy in oil and gas production in The*

- 553 Netherlands, *Ecological Economics*. 61 (2007) 43–51.  
554 doi:10.1016/j.ecolecon.2006.06.011.
- 555 [19] K. Allacker, L. De Nocker, An Approach for Calculating the Environmental  
556 External Costs of the Belgian Building Sector, *Journal of Industrial Ecology*. 16  
557 (2012) 710–721. doi:10.1111/j.1530-9290.2011.00456.x.
- 558 [20] ExternE, European Commission. 2012. ExternE—Externalities of energy. A  
559 research project of the European Commission [Accessed April 2015], (2012).
- 560 [21] B. 1999. Steen, A systematic approach to environmental strategies in product  
561 developments (EPS), version 2000—General system characteristics . CPM report  
562 1999:4. Gothenburg , Sweden : Chalmers University of Technology, Centre for  
563 Environmental Assessment of Products and , 1999.
- 564 [22] T. Oka, M. Ishikawa, Y. Fujii, G. Huppel, Calculating Cost-effectiveness for  
565 Activities with Multiple Environmental Effects Using the Maximum Abatement  
566 Cost Method, *Journal of Industrial Ecology*. 9 (2005) 97–103.  
567 doi:10.1162/108819805775248007.
- 568 [23] J.G. Vogtländer, A. Bijma, H.C. Brezet, Communicating the eco-efficiency of  
569 products and services by means of the eco-costs/value model, *Journal of Cleaner  
570 Production*. 10 (2002) 57–67. doi:10.1016/S0959-6526(01)00013-0.
- 571 [24] R. Holme, L & Watts, WBCSD - World Business Council for Sustainable  
572 Development, *Making Good Business Sense*. (1999) 3.
- 573 [25] J. Vogtländer, P. van der Lugt, H. Brezet, The sustainability of bamboo products  
574 for local and Western European applications. LCAs and land-use, *Journal of  
575 Cleaner Production*. 18 (2010) 1260–1269. doi:10.1016/j.jclepro.2010.04.015.
- 576 [26] M.A. Morales-Mora, E. Rosa-Dominguez, N. Suppen-Reynaga, S.A. Martinez-  
577 Delgadillo, Environmental and eco-costs life cycle assessment of an acrylonitrile  
578 process by capacity enlargement in Mexico, *Process Safety and Environmental  
579 Protection*. 90 (2012) 27–37. doi:10.1016/j.psep.2011.10.002.
- 580 [27] F. Baeza-Brotons, P. Garcés, J. Payá, J.M. Saval, Portland cement systems with  
581 addition of sewage sludge ash. Application in concretes for the manufacture of  
582 blocks, *Journal of Cleaner Production*. 82 (2014) 112–124.  
583 doi:10.1016/j.jclepro.2014.06.072.
- 584 [28] Z. Kravanja, L. Čuček, Multi-objective optimisation for generating sustainable  
585 solutions considering total effects on the environment, *Applied Energy*. 101  
586 (2013) 67–80. doi:10.1016/j.apenergy.2012.04.025.
- 587 [29] EnergyPlus, EnergyPlus, Energy Simulation Software [Accessed: March 2015],  
588 (2015).
- 589 [30] D.B. Crawley, L.K. Lawrie, F.C. Winkelmann, W.F. Buhl, Y.J. Huang, C.O.  
590 Pedersen, et al., EnergyPlus: Creating a new-generation building energy

- 591 simulation program, *Energy and Buildings*. 33 (2001) 319–331.  
592 doi:10.1016/S0378-7788(00)00114-6.
- 593 [31] DOE, “EnergyPlus Engineering Reference.” The Reference to EnergyPlus  
594 Calculations, (2010).
- 595 [32] JEPlus+EA, JEPlus+EA, an EnergyPlus simulation manager for optimization  
596 studies-<http://www.jeplus.org/> [Accessed: May 2015], (2015).
- 597 [33] J. Carreras, D. Boer, G. Guillén-Gosálbez, L.F. Cabeza, M. Medrano, L. Jiménez,  
598 Multi-objective optimization of thermal modelled cubicles considering the total  
599 cost and life cycle environmental impact, *Energy and Buildings*. 88 (2014) 335–  
600 346. doi:10.1016/j.enbuild.2014.12.007.
- 601 [34] O. Kaynakli, A review of the economical and optimum thermal insulation  
602 thickness for building applications, *Renewable and Sustainable Energy Reviews*.  
603 16 (2012) 415–425. doi:10.1016/j.rser.2011.08.006.
- 604 [35] J. Yu, C. Yang, L. Tian, D. Liao, A study on optimum insulation thicknesses of  
605 external walls in hot summer and cold winter zone of China, *Applied Energy*. 86  
606 (2009) 2520–2529. doi:10.1016/j.apenergy.2009.03.010.
- 607 [36] M. Ozel, Effect of Insulation Location on Dynamic Heat-Transfer Characteristics  
608 of Building External Walls and Optimization of Insulation Thickness, *Energy and  
609 Buildings*. (2014). doi:10.1016/j.enbuild.2013.11.015.
- 610 [37] Ecocostsvalue, Ecocostsvalue [Accessed: May 2015], (2014).
- 611 [38] J.G. Vogtländer, H.C. Brezet, C.F. Hendriks, The virtual Eco-costs '99: A single  
612 LCA-based indicator for sustainability and the Eco-costs - Value ratio (EVR)  
613 model for economic allocation: A new LCA-based calculation model to  
614 determine the sustainability of products and services, in: *International Journal of  
615 Life Cycle Assessment*, 2001: pp. 157–166.
- 616 [39] J.G. Vogtländer, A. Bijma, The ‘Virtual Pollution Prevention Costs ‘99,’ The  
617 *International Journal of Life Cycle Assessment*. 5 (2000) 113–120.  
618 doi:10.1007/BF02979733.
- 619 [40] D. Gielen, P. Lako, L. Dinkelbach, V.R. Ree, Prospects for bioenergy in the  
620 Netherlands, a MARKAL analysis of the long term impact of energy and CO2  
621 policies, *Managing Quality*. (1998).
- 622 [41] L.F. Cabeza, A. Castell, M. Medrano, I. Martorell, G. Pérez, I. Fernández,  
623 Experimental study on the performance of insulation materials in Mediterranean  
624 construction, *Energy and Buildings*. 42 (2010) 630–636.  
625 doi:10.1016/j.enbuild.2009.10.033.
- 626 [42] K. Menoufi, A. Castell, L. Navarro, G. Pérez, D. Boer, L.F. Cabeza, Evaluation  
627 of the environmental impact of experimental cubicles using Life Cycle

- 628 Assessment: A highlight on the manufacturing phase, *Applied Energy*. 92 (2012)  
629 534–544. doi:10.1016/j.apenergy.2011.11.020.
- 630 [43] LIDER, Ministerio de Fomento, Government of Spain - LIDER, V. 1.0  
631 [Accessed: May 2015], (2009).
- 632 [44] BEDEC, BEDEC Database - <http://www.itec.es/nouBedec.e/bedec.aspx>  
633 [Accessed: March 2015], (2011).
- 634 [45] A. Castell, K. Menoufi, A. de Gracia, L. Rincón, D. Boer, L.F. Cabeza, Life  
635 Cycle Assessment of alveolar brick construction system incorporating phase  
636 change materials ({PCMs}), *Applied Energy*. 101 (2013) 600–608.  
637 doi:10.1016/j.apenergy.2012.06.066.
- 638 [46] DOE, Residential Prototype Building Models. U.S. Department of Energy  
639 [Accessed: May 2015], (2013).
- 640 [47] P.A. Fokaides, A.M. Papadopoulos, Cost-optimal insulation thickness in dry and  
641 mesothermal climates: Existing models and their improvement, *Energy and  
642 Buildings*. 68, Part A (2014) 203–212. doi:10.1016/j.enbuild.2013.09.006.
- 643 [48] ANEEL, Agencia Nacional de Energia Electrica - Brasil  
644 <http://www.aneel.gov.br/> [Accessed: March 2015], (2014).
- 645 [49] EUROSTAT, EUROSTAT - <http://epp.eurostat.ec.europa.eu/> [Accessed: May  
646 2015], (2014).
- 647 [50] M. Kottek, J. Grieser, C. Beck, B. Rudolf, F. Rubel, World map of the Köppen-  
648 Geiger climate classification updated, *Meteorologische Zeitschrift*. 15 (2006)  
649 259–263. doi:10.1127/0941-2948/2006/0130.
- 650 [51] EUROSTAT, Eurostat Database, (2013).
- 651 [52] Ecoinvent, The Ecoinvent Center. A competence centre of ETH; PSI; Empa &  
652 ART [Accessed: April 2015], (2015).
- 653 [53] Eco-Indicator 99, PRé Consultants. The Eco-indicator 99A damage oriented  
654 method for life cycle impact assessment. Methodology report and manual for  
655 designers., Technical Report, PRé Consultants, Amersfoort, The Netherlands.  
656 (2000).
- 657 [54] R. Brunet, K.S. Kumar, G. Guillen-Gosalbez, L. Jimenez, Integrating process  
658 simulation, multi-objective optimization and LCA for the development of  
659 sustainable processes. application to biotechnological plants, 2011.  
660 doi:10.1016/B978-0-444-54298-4.50033-7.
- 661 [55] A. Audenaert, S.H. De Cleyn, M. Buyle, LCA of low-energy flats using the Eco-  
662 indicator 99 method: Impact of insulation materials, *Energy and Buildings*. 47  
663 (2012) 68–73. doi:10.1016/j.enbuild.2011.11.028.

