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Molina Moreno, F.; Martí Albiñana, JV.; Yepes Piqueras, V. (2017). Carbon embodied optimization for buttressed earth-retaining walls: Implications for low-carbon conceptual designs. JOURNAL OF CLEANER PRODUCTION. 164:872-884.  
doi:10.1016/j.jclepro.2017.06.246



The final publication is available at

<http://dx.doi.org/10.1016/j.jclepro.2017.06.246>

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Additional Information

# Carbon embodied optimization for buttressed earth-retaining walls: implications for low-carbon conceptual designs

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**7787 words**

## Abstract

This paper shows the differences between the design of a reinforced concrete structure considering two objectives to minimize; economic cost and CO<sub>2</sub> emissions. Both objectives depend on the amount of two high carbon intensive materials: cement in the concrete and steel; therefore, these objectives are related. As the balance between steel and cement per m<sup>3</sup> of concrete depends on several factors such as the type of structure, this study focuses on buttressed earth-retaining walls. Another factor that determines the balance between steel and concrete is the height of the wall. Thus, the methodology considers a parametric study for optimal designs of buttressed earth-retaining walls, where one of the parameters is the wall height. One of the objectives is to show the variation in cost when CO<sub>2</sub> is minimized, respectful of minimizing the economic cost. The findings show that wall elements under bending-compressive strains (i.e. the stem of the buttressed retaining wall) perform differently depending on the target function. On one hand, the study reveals an upward trend of steel per unit volume of concrete in emission-optimized earth-retaining buttressed walls, compared to the cost-optimized. On the other hand, it is checked that unlike the cost-optimized walls, emission-optimized walls opt for a higher concrete class than the minimum class available. These findings indicate that emission-optimized walls penalize not only concrete volume, but also the cement content, to the extent that a higher concrete class outperforms in reduced emissions. Additionally, the paper outlines how and to what extent the design of this typology varies for the two analysed objectives in terms of geometry and amount of materials. Some relevant differences influencing the geometry of design strategies are found.

## Keywords

Carbon emission, CO<sub>2</sub>, earth-retaining wall, reinforced concrete, harmony search, threshold accepting.

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## 35 **1. Introduction**

36 Carbon emissions represent one of the largest contributions to global warming so the reduction  
37 of carbon-intensive products in structural engineering is of wider concern. Emissions are to be  
38 determined for every structure, so CO<sub>2</sub> is currently investigated as an optimization target. Yepes  
39 et al. (2012), analysed the implications of both optimization objectives in cantilever earth-  
40 retaining walls. Subsequent studies considered multiobjective optimization of cost and carbon-  
41 emissions. Yepes et al. (2015), considered cost and emissions in the comparative optimization  
42 of cast–prestressed concrete U-beam road bridges, concluding that the two objectives lead to  
43 slightly different solutions. Subsequent studies (García-Segura et al., 2016; Martí et al., 2016)  
44 considered the optimization towards the two objective functions in post-tensioned concrete  
45 box-girder road bridges.

46 Unlike the aforementioned studies, this research considers only passive instead of prestressed  
47 reinforcement. The efficiency of pursuing a low-carbon strategy against a reduced cost one is  
48 tested through this study. One of the objectives is to differentiate between CO<sub>2</sub> emissions and  
49 cost functions according to the mechanical behavior of structures. Traditionally, the economical  
50 factor has conventionally been the mainstream objective to minimize, so the ratio of  
51 reinforcement (kg/m<sup>3</sup>) is a classic feature used to benchmark minimum cost and carbon  
52 alternatives. One of the objectives of the present study is to quantify how much the optimization  
53 target influences on the different reinforcement rates of the wall. However, the ratio of  
54 reinforcement does not seem to be the unique indicator of environmental efficiency, given that  
55 the environmental performance of concrete is also sensitive to the best cement manufacturing  
56 technology available (Kajaste and Hurme, 2016) and the recycled steel rate, as shown in previous  
57 work for the type of structure analysed in this paper (Zastrow et al., 2017).

58 Another point of interest lies in the fact that embodied emissions of concrete are conditioned  
59 to the content of clinker in the concrete dosages. Conversely, mixes are not uniform along the  
60 concrete classes, and so do the necessary volumes in reinforced structural wall elements.  
61 Furthermore, as the mechanical behavior of reinforced concrete bending-compressive  
62 structural elements is dependent on both concrete and steel reinforcement together, little  
63 relationship is possible among design variables and the concrete class  $f_{ck}$ , exclusively. These  
64 reasons, together with the non-linear structural behavior do not allow for a possible  
65 straightforward relationship between emissions and the use of a specified compressive strength  
66 in a concrete structure. It is studied whether there is some range for minimizing emissions by  
67 using higher concrete classes. A research need was identified when it comes to evaluate the  
68 convenience of using a greater compressive strength, whenever it procures fewer emissions. In  
69 this sense, the studies of Habert and Roussel (2009), proved that greater strength allows for a  
70 reduction in concrete volume in structures that carry only their own weight. Habert et al. (2012),  
71 studied whether an improvement in concrete strength would produce a significant difference  
72 on the bridge of study. It pointed out the life cycle impact results of a traditional and high  
73 performance concrete in two bridge solutions. García-Segura et al. (2014), compared four  
74 different compressive strength classes in their studies of precast prestressed bridges. Next,  
75 García-Segura et al. (2015), also analysed the influence of the objective function in the amount  
76 of concrete and steel in the beams and slab of the bridge. Their conclusions about the influence  
77 of the emission objective on the volume of concrete led us to undertake the comparison of  
78 objective functions in other structural typologies.

79 The methodology for the optimization is the use of a heuristic procedure, Harmony Search (HS).  
80 HS was also built upon life cycle cost and embodied emissions of buildings (Fesanghary et al.,  
81 2012) and columns (Kripka and de Medeiros, 2012) in the definition of conceptual design  
82 guidelines. In alignment with our work, the CO<sub>2</sub> optimization in reinforced concrete structures,  
83 like building frames, was previously analyzed by Paya-Zaforteza et al. (2009) with Simulated  
84 Annealing algorithm and later Camp and Assadollahi (2013) performed a multiobjective  
85 optimization considering not only CO<sub>2</sub> but also economic costs. The comparison of CO<sub>2</sub> and cost  
86 optimizations has not been performed yet in with the purpose of obtaining design implications  
87 of either target functions. Therefore, our work undertakes this task.

88 Previous studies analyzed the influence of the type of fill and maximum bearing capacity on the  
89 variables of cost optimized solutions of earth retaining cantilever (Yepes et al., 2008) and  
90 buttressed walls (Molina-Moreno et al., 2017). The carbon embodied target is narrowly linked  
91 to economical designs in cantilever walls (Yepes et al., 2012) and is presumed a potentially  
92 suitable target in other types of wall.

93 The constraint-based design definition is described in Section 2 and the optimization algorithm  
94 is described in Section 3. The analyses of cost and emission-optimized results are shown in  
95 Section 4, for each design variable. Since variations in steel content and concrete might hinder  
96 economic and environmental differences, Section 4 includes a comparative analysis of results of  
97 a carbon-embodied optimization by fixing  $f_{ck}$  as one of the influential parameters on global  
98 warming potential. Finally, Section 5 summarizes the main outcomes.

## 99 **2. Design problem definition**

100 Two objective functions  $f(\mathbf{x})$  are considered: embodied emissions and construction cost of the  
101 wall. The functions consider the unit CO<sub>2</sub> equivalent emissions  $e_i$  and prices  $p_i$  and the  
102 measurements of the corresponding units for each part of the wall. These construction units  
103 correspond to materials, formwork and works of excavation and earth-fill. The emission and cost  
104 functions are based on a 1 meter wide strip. Unit prices and emissions are given in Table 1 and  
105 correspond to the values considered in a previous study on earth-retaining walls (Yepes et al.,  
106 2008). The ultimate (ULS) and service (SLS) state limits determine the constraints to satisfy,  
107 according to Eq. (1).

$$\begin{aligned} 108 & \text{Minimize } f(\mathbf{x}) \\ 109 & \text{Subject to } x_i \in X_i, \quad i=1,2,\dots, N \end{aligned} \quad (1)$$

110 where  $f(\mathbf{x})$  is an objective function where  $\mathbf{x}$  is the set of each decision variable  $x_i$ ;  $X_i$  is the set of  
111 range of possible values for each variable and  $N$  the number of variables. No penalty functions  
112 are used, as the problem is restricted to feasible solutions. Therefore, the foremost  
113 computational effort lies in the evaluation of the ULS and SLS. Both constraints become possibly  
114 critical in selecting the dimensions of the foundations, since the design process does not follow  
115 the traditional approach of structural predimensioning and dimensioning.

### 116 **2.1. Design variables and parameters**

117 The design variables and parameters define the constructive solution. The geometric variables  
118 of the buttressed earth-retaining wall under study are depicted in Fig. 1 and Fig. 2. The retaining  
119 wall is defined by 20 design variables summarized in Table 2. Design parameters are described  
120 in Table 3. A standard type of fill ( $F_2$ ) is considered, corresponding to granular soils with more  
121 than 12% of fines (GW, GS, SM, SL) and fine soils with more than 25% of coarse grained soil (size

122 of 45 mm or less) Yepes et al. (2012). Soil is determined by its density  $\gamma$  (20 kN/m<sup>3</sup>) and 30°  
123 internal friction angle. The maximum bearing capacity considered is 0.3 MPa. Generally, the  
124 relative amount of steel and concrete increases the higher the wall is, the less cohesive the  
125 ground is and the lower bearing capacity it presents. The set of combinations of the values of  
126 the variables constitutes a space of solutions. These variables correspond to geometry, concrete  
127 grades and passive reinforcement of the wall. The variables of dimensions and quantities are  
128 discrete, to adapt to real cases. The geometric variables are the thickness of the stem ( $em$ ), the  
129 thickness of the buttresses ( $ec$ ), the thickness of the footing ( $cz$ ), the length of the toe ( $lp$ ), the  
130 length of the heel ( $lt$ ), and the distance between buttresses ( $dc$ ). The steel type and concrete  
131 class are the variables considered for the materials. Steel classes B500S and B400S are  
132 considered. Concrete classes between HA-25 to HA-50 are included by discrete intervals of 5  
133 MPa. The remaining variables consider the set-up of reinforcement ( $A_{1-10}$ ), shown in Fig. 2 and  
134 Fig. 3. The diameter and the number of bars define the reinforcement. Three reinforcement  
135 flexural bars defined as  $A_1$ ,  $A_2$  and  $A_3$  contribute to the main bending of the stem. The vertical  
136 reinforcement of foundation in the rear side of the stem is given by  $A_4$ . The secondary  
137 longitudinal reinforcement is given by  $A_5$  for shrinkage and thermal effects in the stem. The  
138 longitudinal reinforcement of the buttress is given by  $A_6$ . The area of the reinforcement bracket  
139 from the bottom of the buttress is given by  $A_7$  and  $A_8$ . The upper and bottom heel reinforcements  
140 are defined by  $A_9$  and  $A_{11}$  and the shear reinforcement in the footing by  $A_{12}$ . The longitudinal  
141 effects in the toe are defined by  $A_{10}$ .

## 142 **2.2. Structural evaluation module**

143 The stem of the wall resists the earth pressure working as a continuous slab supported by  
144 columns. The buttresses are generally placed in the rear wall side. This provides the joint system  
145 plate-buttress the required bending stiffness, acting as the top of a T-shaped cross-section. The  
146 wall acts as a cantilever with a varying section, whose size is maximum in the union of the stem  
147 to the foundation (Fig. 1). The union of the stem fitted to the buttresses and to the base-slab  
148 turns the wall into a hyperstatic structure due to the coercion of the buttresses in the lower side  
149 of the stem. The calculation of the buttress is essentially made as a cantilever with varying depth.  
150 The cross-section in the top of the stem is quite small, so the horizontal bending is similar to a  
151 continuous slab between supports. The buttress acts as the web of a concrete T-beam cross  
152 section, whose size varies with the slope of the buttress (Fig. 2).

153 The structure is checked according to Spanish specifications (Ministerio de Fomento, 2008) and  
154 recommendations (Ministerio de Fomento, 2007). Flexural and shear state limits as well as the  
155 cracking state limit are considered. The hyperstatic structure is checked according to the method  
156 of Huntington (1957). The limit states of the structure are verified for uniform surface loading  
157 on top of the fill (Calavera, 2001). Calculation of the active earth pressure depends on the fill  
158 and surface loads. The key forces considered in the wall analysis are the weight of the wall, the  
159 fill loading on the heel, the earth pressure, the surface load, the weight on the front toe, and the  
160 passive resistance in front of the toe. The load on the buttresses is obtained from the pressure  
161 distribution over the stem multiplied by the distance between buttresses.

162 The stem is subject to both bending and shear efforts diminished by the effect of every buttress  
163 that is placed at a distance  $dc$  (Fig. 2). Unlike the top of the stem that acts as a cantilever, the  
164 bottom of the stem is subject to considerable coercion from the footing and the bottom of the  
165 buttress, situated in the rear side of the stem. The bending moments in the half section between  
166 the buttresses are given by  $M_1$  and  $M_2$ :

167 
$$M_1 = -0.03p_1dc(H - cz) \quad (2)$$

168 
$$M_2 = -0.0075p_1dc(H - cz) \quad (3)$$

169 where  $p_1$  is the pressure over the slab on the upper side of the footing,  $M_1$  is the bending  
 170 moment in the connection of the stem to the footing, and  $M_2$  the maximum bending moment  
 171 in the stem (Fig. 4). Provided that the distance between buttresses is lower than half the height,  
 172 the shear strength ( $v$ ) in the connection of the plate to the footing is defined as:

173 
$$v = 0.4p_1dc \quad (4)$$

174 The moments in every span of the stem due to vertical bending stress in the stem must be  
 175 accurately estimated according to a trapezoidal pressure distribution (Huntington, 1957) where  
 176 the maximum value is half the maximum pressure in the upper side of the foundation. The  
 177 bending moment in the stem can be determined as one of the limiting restrictions that yields  
 178 slenderness to cross sections (Fig. 4). The vertical bending moment in the upper quarter part of  
 179 the stem can be negligible by the simplification of Huntington.

180 Checking of the bending stress in any horizontal T-shape cross-section is obtained by the  
 181 effective width, as indicated in the Model Code (CEB-FIB, 1990). The equations to evaluate the  
 182 mechanical capacity to flexure and shear are provided by Calavera (2001) who considers the  
 183 construction limits of the Spanish EHE Structural Concrete Code (Ministerio de Fomento, 2008).  
 184 The basic expressions against overturning, sliding and soil stresses, checked considering the  
 185 effect of the buttresses, are given in Eqs. (5–7). Regarding the overturning condition, Eq. (5)  
 186 indicates that the favorable overturning moments should be high enough compared to  
 187 unfavorable overturning moments.  $M_{of}$  is the total favorable overturning moment given by Eq.  
 188 (6);  $M_{ou}$  is the total unfavorable overturning moment defined by Eq. (7), and  $\gamma_{to}$  is the overturning  
 189 safety factor that is considered as 1.8 for frequent events.

190 
$$M_{of} - \gamma_{to}M_{ou} \geq 0 \quad (5)$$

191 
$$M_{of} = N' \left( \frac{B}{2} - e_p \right) - E_p(H_t - h') \quad (6)$$

192 
$$M_{ou} = E_h * h_e - E_v \left( \frac{B}{2} - f \right) \quad (7)$$

193 
$$R = N' \mu + E_p \quad (8)$$

194 
$$E_p = \frac{1}{2\gamma(H_t^2 - (H_t - c)^2)} (1 + \sin\varphi) / (s - \sin\varphi) \quad (9)$$

195 Eq. (8) defines the reaction against sliding, where  $N'$  is the total sum of weights of the wall and  
 196 ground located over the toe and the heel;  $\mu$  is the base-friction coefficient, and  $E_p$  is the passive  
 197 resistance in front of the toe, obtained by Eq. (9). The sliding moment is produced by the  
 198 horizontal component of the earth pressure because of the negligible effect of the vertical  
 199 component.

200 As general remarks concerning the calculations, the checking module is performed for a 1 meter  
 201 wide strip, including ultimate flexure and ultimate shear, being the acting shear compared to  
 202 the ultimate values. Both bending and shear minimum steel bars, and the geometrical minimum,  
 203 are examined according to Calavera (2001), verifying not to originate a ground reaction force  
 204 twice as high as the maximum bearing capacity  $\sigma_g$ .

### 205 3. Proposed Harmony Search strategy

206 The Harmony Search (HS), proposed by Geem et al. (2001), establishes an analogy to the process  
 207 in which musicians try to polish their melody, so as to attain the best musical harmony.  
 208 Variations over HS were proposed in lasts years to increase the performance of the basic HS (Alia  
 209 and Mandava, 2011). HS stands out among a variety of metaheuristics. A number of applications  
 210 of HS were reviewed by Manjarres et al. (2013). Lee and Geem (2004) proved its robustness  
 211 compared to gradient-based search. The hybrid HS together with a Threshold Acceptance (TA)  
 212 strategy is applied here in a comparative study of optimization targets. First, HS confers  
 213 diversification of the variable space by including randomness, which allows escaping from local  
 214 optima. TA intensifies the search by converging to a finer solution. TA was combined with other  
 215 algorithms to study reinforced concrete road box frames with a set of 50 discrete variables  
 216 (Perea et al., 2008, 2010) and bridge abutments (Luz et al., 2015).

217 Manjarres et al. (2013) summarized the main characteristics and reviewed the successful  
 218 applications of HS in engineering structures. However, since there are no stable control  
 219 parameters that fit various practical optimization applications (Guo et al., 2016), new search  
 220 strategies are desirable. The HSTA algorithm proposed by García-Segura et al. (2015) combines  
 221 the effectiveness of HS in the search of a large variable space with the local search through  
 222 Threshold Accepting (TA) proposed by Dueck and Scheuer (1990). HSTA provides then a  
 223 diversification and intensification balance to global search and converges to still good solutions.  
 224 HSTA improved the quality of solution in García-Segura et al. (2015) about 8% compared to HS.  
 225 Besides, the greater the number of initial improvised solutions, the greater probability for  
 226 escaping from local optima, so, an increased number of random feasible solutions is used ( $n_{HMS}^*$   
 227 HMS). The steps of the algorithm structure are following summarized.

- 228 • **Step 1.** Assignment of the algorithm parameters: harmony memory size (HMS),  
 229 harmony memory considering rate (HMCR), harmony memory probability (HMP), pitch  
 230 adjusting rate (PAR), maximum number of improvisations without improvement (IWI)  
 231 and threshold iterations (TI). A design variable pool is built for each design variable.
- 232 • **Step 2.** Harmony memory matrix (HM) is initialized with random values of the design  
 233 pool. First, the algorithm creates  $n_{HMS}^*$  HMS random feasible solutions. Then, HM is  
 234 filled with the best HMS solution vectors.
- 235 • **Step 3.** A new harmony vector is improvised. The values of the other decision variables  
 236 are eligible from a set of possible values in the design variable pools with a probability  
 237 of equal to  $(1-HMCR)$  (Eq. (10)). Otherwise, each value of the new solution has a  
 238 probability of HMCR to be chosen from the HM. For the final case, the value is selected  
 239 from a solution vector according to its probability (Eq. (11)). The probability of a solution  
 240 depends on its position in the ranking ( $j$ ), the first solution being the best one. HMP is a  
 241 parameter between 0 (matching with a deterministic choice) and 1 (matching simple  
 242 random sampling). The pitch adjusting determines next whether the value is modified  
 243 one position up or down with a probability PAR (Eq. (12)).

$$244 \quad X'_i \ll \begin{cases} X'_i \in \{x_i^1, x_i^2, \dots, x_i^{HMS}\} \text{ with probability } HMCR \\ X'_i \in X_i \text{ with probability } (1 - HMCR) \end{cases} \quad (10)$$

$$245 \quad p(j) = \frac{HMP^{j-1} * (1-HMP)}{1-HMP^{HMS}} \quad (11)$$

$$246 \quad X'_i \in x_i^j \pm 1 \text{ with probability } PAR \quad (12)$$

- 247 • **Step 4.** Harmony memory matrix is updated. The new solution replaces the worst  
248 harmony if its function value improves upon the worst one. Steps 3 and 4 are repeated  
249 until the iterations without improving the best harmony reach a previously calibrated  
250 maximum number of iterations (IWI), and mimics, finding a nice harmony.
- 251 • **Step 5.** The intensification stage consists of the local search around the best solution  
252 through Threshold Accepting (TA). In each iteration a percentage of the variables is  
253 modified ( $P_{var}$ ). TA accepts worse solutions when the increment of the target is lower  
254 than a threshold value ( $\Delta T$ ). Initially, a 1% increment in the function value is accepted.  
255 This threshold value is reduced gradually to zero during half of the TI, as seen in the  
256 convergence of Fig. 5. Next, only better solutions are accepted. TA performs a number  
257 of TI. Generations of new vectors are iteratively performed, until the termination criteria  
258 are satisfied.

259 The validation modules of the structure and the optimization algorithm are programmed in  
260 MATLAB® and run with an Intel® Core™ i5 CPU with 2.80 GHZ. The HS parameters setting is  
261 performed by an experiment process considering the parameters of Table 4. The parameters  
262 tested are based on the best performing results in 10 m-high walls from previous work (Molina-  
263 Moreno et al., 2017). In the attempt to minimize the objective function but also to reach  
264 reasonable processing times, the calibration was performed with the highest wall in order to  
265 build upon the most demanding computational effort. The parameters were obtained as a result  
266 of nine test runs, from which the five most satisfactory targets and processing times are shown  
267 in Table 5. Every case was performed nine times to obtain the mean, standard deviation and  
268 minimum values of the results. This ensures the quality of the results for each objective  
269 according to the methodology proposed by Payá-Zaforteza et al. (2010), based on the extreme  
270 value theory.

#### 271 **4. Results of the Design Parametric Analysis**

272 The results of the parametric study reveal that the emissions of optimized earth-retaining walls  
273 exhibit an overall good performance. The parametric study was performed on a set of different  
274 wall heights from 4–16 m with increments of 1 m. This section describes the performance of the  
275 two objective functions: emissions  $E$  and costs  $C$ . The results of the cost and emission  
276 optimizations are compared between each other. We also analyzed the influence of the  
277 reinforced concrete design variables on the geometrical variables and on steel and concrete  
278 amounts. As regards the design constraints, the findings confirm that the flexural constraint of  
279 the buttress is relevant for minimum carbon walls, as well as the shear constraint both in the  
280 buttress and the base slab. The influence of concrete characteristic strength and the wall height  
281 are also described. Note that all the values depicted are based on the average values of nine  
282 runs.

283 Fig. 6 shows the parabolic trends for the emissions obtained with a carbon embodied  
284 optimization with an economic optimization. It also illustrates the equivalent costs of the  
285 emission optimization and the equivalent emissions to a cost optimization. It can be seen that  
286 the emissions' optimized solutions are just as expected, i.e. lower values of emissions than the  
287 cost-optimized ones. The values of embodied carbon adjust to a curve  $E_c = 57.122x^2 - 457.86x +$   
288  $1564.8$  with a correlation  $R^2 = 0.9985$ . Similarly, the cost adjusts to the curve  $C = 51.705x^2 -$   
289  $294.55x + 869.2$  with  $R^2 = 0.9966$ . Note that the parabolic tendency indicates that the taller the  
290 wall, the lower the efficiency in terms of carbon intensity.



291 Fig. 7 shows the relationship between cost and emissions when the objective function is either  
292 the cost or the CO<sub>2</sub> equivalent emissions on the 1.0 meter wide strip. The trend exhibits a linear  
293 progression with respect to cost, equal to  $2.9352x - 656.69$ , with a correlation  $R^2 = 0.9968$ . As a  
294 rule of thumb, this means 1 Euro reduced in cost would save 2.93 kg of CO<sub>2</sub> equivalent. Similarly,  
295 the cost respect to emissions adjusts to  $2.6714x - 625.19$  with  $R^2 = 0.9961$ . The unit of kg CO<sub>2</sub>  
296 equivalent per linear meter reduced would increase by 0.38 Euros, based on mean values.

297 Table 6 outlines the amount of CO<sub>2</sub> emissions produced by the work units for every wall height.  
298 Concrete exhibits a greater contribution as expected, but steel and backfill cannot be  
299 underestimated. The emissions from concrete drop from 65% in 4 m walls to 55 % in 16 m walls,  
300 whereas the steel contribution increases from 17% to 36% for 16 m heights. Representing on  
301 average 59.6 % of the emissions, concrete outweighs the steel emissions by 32.4%. However,  
302 concrete rates fall with the height of the wall, so only a particular analysis of each part of the  
303 wall would be of relevance as regards the contribution of each material.

304 Regarding design rules and objective functions, a more precise analysis of the results for either  
305 of the emission objective functions is needed. Fig. 8 shows the parabolic curves of emissions of  
306 the stem and base slab due to the concrete  $E_c$  and steel  $E_s$  necessary in the emission-optimized  
307 walls. The foundation presents fewer emissions of steel than of concrete. Unlike in the case of  
308 the foundation, it is worth noting that the stem presents an almost parallel trend of concrete  
309 and steel emissions, which are closer to one another with the height. This is indicative of the  
310 variables defining the stem (thickness and reinforcement), which are key variables for the CO<sub>2</sub>  
311 equivalent objective. Emissions of concrete in the stem adjust to  $E_c = 5.4662x^2 - 16.639x + 207.39$   
312 with  $R^2 = 0.9815$ . Emissions from the steel in the stem are equal to  $E_s = 6.0225x^2 - 18.523x + 35.91$   
313 with  $R^2 = 0.9989$ . In agreement with results concerning the mechanical behavior of the stem,  
314 the strain effort in the rear side of the stem plays a major role in the target emission's function.

#### 315 **4.1. Comparison of geometrical variables**

316 It becomes necessary to determine whether the cost-optimized walls and the CO<sub>2</sub>-optimized  
317 walls exhibit similarities in terms of geometric variables. Some limitations are to be considered  
318 in the tendencies analysis described here, such as optimizing through discrete values (Table 2)  
319 of the large number of variables (32). As a remainder, the variables to modify during the  
320 intensification phase of the algorithm are carried out by random choice of 3% of the 20 variables.  
321 Thus, discrete values for the dimensions of the geometric variables provide the great casuistic  
322 of results. As a consequence, some scattering is observed in the values of geometrical variables  
323 obtained and analyzed herein. The general tendencies are linearly emphasized hereafter,  
324 despite some variables that exhibit better adjustment to parabolic curves.

325 Fig. 9 shows the variation of the variables of an emissions-optimized in contrast to a cost-  
326 optimized strategy. Values below 1.00 indicate that the emissions optimization seeks smaller  
327 geometrical dimensions than in the cost optimization. Despite the scatter, decreasing trends in  
328 some dimensions are worth mentioning. The greatest difference is found in the distance  
329 between buttresses ( $dc$ ). Cost-optimized solutions exhibit larger distances than the emissions-  
330 optimized solutions. While  $dc$  values range from 68–92% of those obtained by the cost optimized  
331 method (linearly adjusting to  $R_{dc} = -0.0135x + 0.8791$ ), the ratio of length of the toe  $lp$  increases  
332 ( $R_{lp} = -0.0112x + 1.0301$ ). This means that the emissions-optimized solutions prioritize shorter  
333 distances between buttresses, and the cost-optimized solutions prioritize higher lengths of the  
334 toe, allowing for larger distances between buttresses. This is coherent with the fact that the  
335 cost-optimized stems present greater volume of concrete with the height (Fig. 10). As for the

336 remainder of the geometrical ratios, the thickness of the base slab,  $cz$ , the thickness of the stem  
337  $em$  and the distances between buttresses,  $dc$ , seem to decrease for the emission-optimized  
338 method compared to the cost-optimized one. This means that such dimensions are reduced with  
339 the height in the emission-optimized method. The expressions for the ratio of  $cz$  and  $em$  adjust  
340 to linear trends, as the aforementioned variables. Each of them adjusts, respectively, to  $R_{cz} = -$   
341  $0.0094x + 1.0054$  and  $R_{em} = -0.0112x + 1.0301$ . The length of the footing ( $l_t + l_h$ ) exhibits an  
342 increasing ratio of  $CO_2/cost$ , thus the emission-optimized method prioritizes longer toes with  
343 the height in the foundation. However, the length of the total base slab presents a steady ratio.

344 Fig. 10 shows the volume of concrete ratio of the emissions and cost optimizations. All values  
345 remain below 1.00 indicating that the optimization of  $CO_2$  uses less concrete than the cost-  
346 optimized method. Despite the scatter in the results, the ratio of total concrete, in the stem and  
347 the foundation, drops, meaning that less concrete with the height is the choice in the emission-  
348 optimized walls. Our results indicate that emissions-optimized walls use 4.85% less concrete  
349 than the cost-optimized walls. Considering each part of the wall individually, the volume of the  
350 stem decreases by 10% and 11.82% in the base slab. The ratio of concrete volume  $CO_2/cost$   
351 adjusts to  $V_{wall} = -0.0091x + 1.0398$ . The findings for this concrete volume ratio suggest that the  
352 target function ( $CO_2$  emissions) would seek a greater amount of steel. However, the use of a  
353 greater compressive strength  $f_{ck}$  might hinder the influence of the steel weight. The next section  
354 describes the influence of  $f_{ck}$  on the weight of steel and the concrete volume.

#### 355 **4.2. Sensitiveness to the concrete class**

356 This section analyzes the influence of the concrete strength  $f_{ck}$  on the volume of concrete and  
357 weight of steel necessary in the emission-optimized objective. As regards emissions per  $m^3$ , the  
358 concrete class is grouped per concrete strength  $f_{ck}$  as HA-25 and HA-30, with 25 and 30  $N/mm^2$   
359 respectively, according to the Spanish Structural Concrete code (Ministerio de Fomento, 2008).  
360 The remaining values of  $f_{ck}$  present substantial differences in emissions and unit prices, making  
361 it ineligible by the algorithm for earth-retaining walls. All the cost-optimized walls sought the  
362 lowest  $f_{ck}$ , HA-25, while the emission-optimized ones used both HA-25 and HA-30.

363 As regards the influence of the concrete strength in the results, every emission-optimized  
364 solution shows at first glance that the concrete class used is both HA-25 and HA-30 in walls from  
365 6 m height in the emissions' optimization. As the use of HA-30 is not the systematic choice as  
366 the height increases, one cannot state that the emission objective function favors HA-30  
367 concrete with the height. A comparison between the solutions obtained by the emissions'  
368 optimization, for the HA-25 and HA-30 classes, was performed. The geometrical variables, the  
369 volume of concrete and the steel weight in the stem and the base slab were compared. Our  
370 findings revealed that the distance between buttresses, length of the footing and thickness of  
371 the stem – and therefore the volume of concrete – are sensitive to the concrete strength  $f_{ck}$ . The  
372 results presented in Figs. 11-15 will be described next.

373 Fig. 11 shows a linear tendency of the distances between buttresses; the distance using HA-25  
374 adjusts to  $D_{but-25} = 0.1587x + 2.2737$  and the use of HA-30 adjusts to  $D_{but-30} = 0.1531x + 2.098$ ,  
375 with a respective correlation  $R^2 = 0.8995$  and  $R^2 = 0.8827$ . The largest difference is obtained for  
376 an 11 m-high wall, which gains 0.50 m on the adjacent buttress with HA-30. This means that the  
377 horizontal bending of the stem is influenced by the concrete resistance, as much as the  
378 emissions of the volume required of concrete HA-30 are lower than an equivalent reinforced  
379 section with greater steel amount. As a reminder, note that the trends of the geometric variables  
380 are expected to exhibit some scatter as 1) mean values are obtained from discrete values of the

381 variables, and 2) the algorithm's choice is based on random search of the variables that  
382 determine the vectors of optimum solutions.

383 As seen in Section 4.1 (Fig. 9), the length of the footing, does not exhibit any noticeable  
384 difference depending on the target function. However, the toe presents a difference in length.  
385 Fig. 12 shows parallel parabolic trends for the length of the toe obtained with HA-30 and HA-25.  
386 The length for HA-25 adjusts to  $L_{\text{toe-25}} = 0.026x^2 - 0.0904x + 0.3792$  with  $R^2 = 0.9882$ , and HA-30  
387 can reach an 11% shorter length. The largest difference is found for the shortest walls (i.e., a  
388 maximum difference of 7 cm is found in length of walls of 4 m: 30%). Fig. 13 shows a different  
389 performance nonetheless in the thickness of the stem for HA-30 and HA-25, which exhibits a  
390 noticeable divergence with height. Differences of up to 3 cm can be obtained with HA-30,  
391 meaning a reduction of 20% of the thickness with HA-25. The curve of HA-30 adjusts to  $T_{\text{st-30}} =$   
392  $0.0027x^2 - 0.0131x + 0.2652$  with a correlation  $R^2 = 0.9058$ , while that for HA-25 is  $T_{\text{st-25}} = 0.0013x^2$   
393  $- 0.0031x + 0.2498$  with  $R^2 = 0.9342$ .

394 Fig. 14 illustrates the volume of concrete on a 1.0 meter wide strip when HA-25 or HA-30 are  
395 used. The results show a significant difference in the stem wall with the height; the volume  
396 decreases by 5.73 % on average when using HA-30. The curve for the volume for HA-30 adjusts  
397 to  $V_{30} = 0.0206x^2 - 0.0611x + 1.0486$  with  $R^2 = 0.9758$  and for HA-25 to  $V_{25} = 0.0452x^2 - 0.486x +$   
398  $2.8184$  with  $R^2 = 0.9768$ . This makes sense, because the taller the wall, the greater the bending  
399 stress, so the concrete yields to the use of a greater  $f_{ck}$ . The results indicate that the concrete  
400 strength is less influential in the foundation than in the stem (i.e. the HA-25 and HA-30  
401 foundation curves are closer). The slight increase in volume when using HA-25 M could be due  
402 to the shear stress in the base slab, which agrees with our results of the condition factor  
403 obtained when checking the structure: it barely exceeded the limit value of compliance of 1.0.

404 Fig. 15 shows the sensitiveness of the steel rebar to  $f_{ck}$ . The results show that the weight in the  
405 foundation decreases by 4.79% on average when using HA-30. This is due to a better  
406 performance against shear stress in the heel of the foundation. This is confirmed by the  
407 structural checking module; the average shear strength condition factor obtained for the heel  
408 barely exceeded the acceptance value. The curve of steel weight in the foundation adequately  
409 adjusts to  $S_{\text{fd-30}} = 6.586x^2 - 86.238x + 301.6$ , with a correlation of  $R^2 = 0.9964$ , using HA-30.  
410 Similarly, the curve for HA-25 adjusts to  $S_{\text{fd-25}} = 6.1114x^2 - 70.999x + 209.59$  with  $R^2 = 0.9944$ .  
411 Conversely, and, as expected, the weight of steel in the stem presents negligible sensitivity to  
412 the concrete strength, as the compressive stress in the cross section of the stem similarly affects  
413 results for both HA-30 and HA-25 classes. This is coherent, as the horizontal bending stress  
414 increases due to the size of the T-shaped cross section that decreases as the height increases  
415 (see Section 1.3, Fig. 2), regardless of the compressive stress. Consequently, the condition  
416 factors affecting the stem obtained, i.e., the negative reinforcement of the stem in the joint to  
417 the buttress and the bending constraint of the buttress, so that the optimal feasible solutions  
418 barely exceeded the limit of compliance of the constraints.

419 Our results suggest that wall elements under bending-compressive strains – the stem of the  
420 buttressed retaining wall – performed differently depending on the target function. Mapping  
421 the aforementioned results, the stem was thinner when concrete HA-30 was used. Despite the  
422 reduction in the concrete volume in the stem when the choice is HA-30, the algorithm does not  
423 systematically seek greater concrete strength with height. This is presumably due to a good  
424 performance of any concrete strength in reinforced concrete compressed and flexural-  
425 compressed sections; the structure satisfies the bending-compressive stress of the stem; its

426 limiting performance against bending may be solved with a greater reinforcement area. As  
427 regards the influence of  $f_{ck}$  on the foundation, little difference was found in the base slab.  
428 Therefore, the concrete compressive strength did not turn out as response variable for the  
429 emissions target considering the whole structure (stem and foundation). This all makes sense  
430 indeed; the stem seems insensitive to concrete strength due to the good compressive  
431 performance of the concrete section under bending-compressive stress.

### 432 **4.3. Sensitiveness to height on the reinforced cross-section**

433 The influence of the height affects the use of steel and concrete in a different manner in the  
434 emission and cost optimizations, as previously analyzed. This subsection outlines such a  
435 difference by means of different ratios:  $CO_2/cost$ ; and the ratio of the weight of steel  $S_{st}$  in kg  
436 and weight related to the volume of concrete  $R_{rf}$  in  $kg/m^3$  used in the stem and foundation. These  
437 variables refer to a 1.0 meter wide strip along the longitudinal dimension of the wall.

438 Table 7 shows the weight of steel ratio  $S_{st}$ , between the emission- and cost-optimized solutions  
439 ( $CO_2/cost$ ). Values over 1.00 indicate that greater steel is the preference with height in the cross  
440 section by the emission-optimized strategy. The results indicate that emission-optimized walls  
441 require more steel than the cost-optimized ones from 12 m-height walls. Then, lower walls  
442 exhibit varying total steel use, mainly because the steel in the stem seems not to be clearly  
443 sensitive to the optimization target within these lower heights. In contrast, the base slab exhibits  
444 an upward and more pronounced trend of steel use. In agreement with the results, the ratio of  
445 reinforcement per unit of volume of concrete is expected to increase with the wall height.  
446 Greater steel content seemed to be the most environmentally efficient alternative. In  
447 agreement with Fig. 10, the higher the wall, the fewer concrete amount for the emission target.

448 Fig. 16 shows the trend of the reinforcement ratio for the economic and the emission targets of  
449 the wall. Also for the whole wall, the total amount of steel is sensitive to the height. When the  
450 concrete strength  $f_{ck}$  is fixed in the emission optimization, the ratio of reinforcement reaches  
451 equivalent values with the height. The different ratio at lower heights unveils that there is a limit  
452 where the algorithm reaches a minimum emission, regardless of  $f_{ck}$ . As of such limit, the concrete  
453 strength does not play a major role in the structural performance as the steel does.

## 454 **5. Conclusions**

455 This paper describes a parametric optimization of an earth retaining wall with buttresses using  
456 the HSTA algorithm. The comparative analysis is presented considering two objectives: a  
457 strategy of minimal carbon and an economic strategy. Working towards the emission target  
458 provides stabilized results without impairing the economic target. The results suggested that  
459 there is a relationship between cost and  $CO_2$  equivalent emissions. It is observed that optimizing  
460 emissions generally implies fewer concrete (3.18%) in the wall than the cost-optimized method.  
461 Analyzing the parts of the wall independently, the stem exhibited by average 8.72% less concrete  
462 volume when optimizing emissions. It can be said that the higher the wall, the more steel is  
463 sought by the emission target, and less concrete. Also the use of a greater concrete class is  
464 beneficial as less volume of concrete is required.

465 As a result of a second analysis, where the concrete class is restricted in the emission  
466 optimization, a higher concrete (class HA-30 instead of class HA-25) implied an average  
467 reduction of volume equivalent to 5.73% in the stem of the wall. On the other hand, emissions  
468 due to the weight of steel in the foundation decrease by 4.79% on average when using class HA-

469 30. As a consequence, the class HA-30 would reduce the total emissions of the wall by 4.9%  
470 (11.05 kg CO<sub>2</sub> equivalent/m<sup>3</sup>) on average, which is considered a meaningful amount.

471 However, the results for the stem show how the bending-compressive strain of the stem wall  
472 conditions the optimization. The emission optimized walls used both classes HA-25 and HA-30,  
473 but the latter was not systematically chosen with the height. These findings imply that the stem  
474 is more sensitive to the steel amount than to the concrete class; the higher the wall, the less  
475 influential the amount of cement in the mix is, because the main component needed in the wall  
476 is the reinforced steel. Thus, the greater the bending effort in this type of structure, the less  
477 relevant the optimization objective becomes. The scientific relevance for structural designers is  
478 that there is some range for minimizing emissions by using higher concrete classes, although it  
479 mainly benefits lower heights.

480

### 481 **Acknowledgments**

482 This research was funded by the European Institute of Innovation and Technology under grant  
483 agreement nº 20140262 Low Carbon Strategy in the Construction Industry  
484 (PGA\_APED0094\_2014-2.1-278\_P066-10) and the Spanish Ministry of Economy and  
485 Competitiveness along with FEDER funding (Project BIA2014-56574-R). The authors are grateful  
486 for the through revision of the manuscript by Tatiana García-Segura.

487

488	Notation	
489	$em$	stem thickness
490	$cz$	footing thickness
491	$lp$	toe length
492	$p_i$	unit prices
493	$q$	uniform surface loading on top of the fill
494	$lt$	heel length
495	$dc$	distance between buttresses
496	$v_c$	total volume of concrete
497	$x_1, \dots, x_n$	design variables
498	$A_1, \dots, A_{12}$	reinforcement variables
499	$R_{st}$	reinforcement of the stem
500	$R_{ft}$	reinforcement of the footing
501	$R_t$	total weight of steel
502	$H$	total height of the wall
503	$H_2$	foundation depth

504	$M_{of}$	moment reaction at the base of the wall
505	$M_{ou}$	total favorable overturning moment
506	$P(\gamma, \phi, \delta)$	earth pressure
507	$P_p$	passive earth pressure on the toe
508	$Q$	surface loading on top of the fill
509	$\alpha$	angle slope of the buttress
510	$\gamma$	density of the fill
511	$\gamma_{fs}$	safety coefficient against sliding
512	$\gamma_{fo}$	safety coefficient against overturning
513	$\phi$	internal friction angle
514	$\delta$	wall-fill friction angle
515	$\sigma$	maximum bearing pressure
516	$\mu$	base-friction coefficient

517

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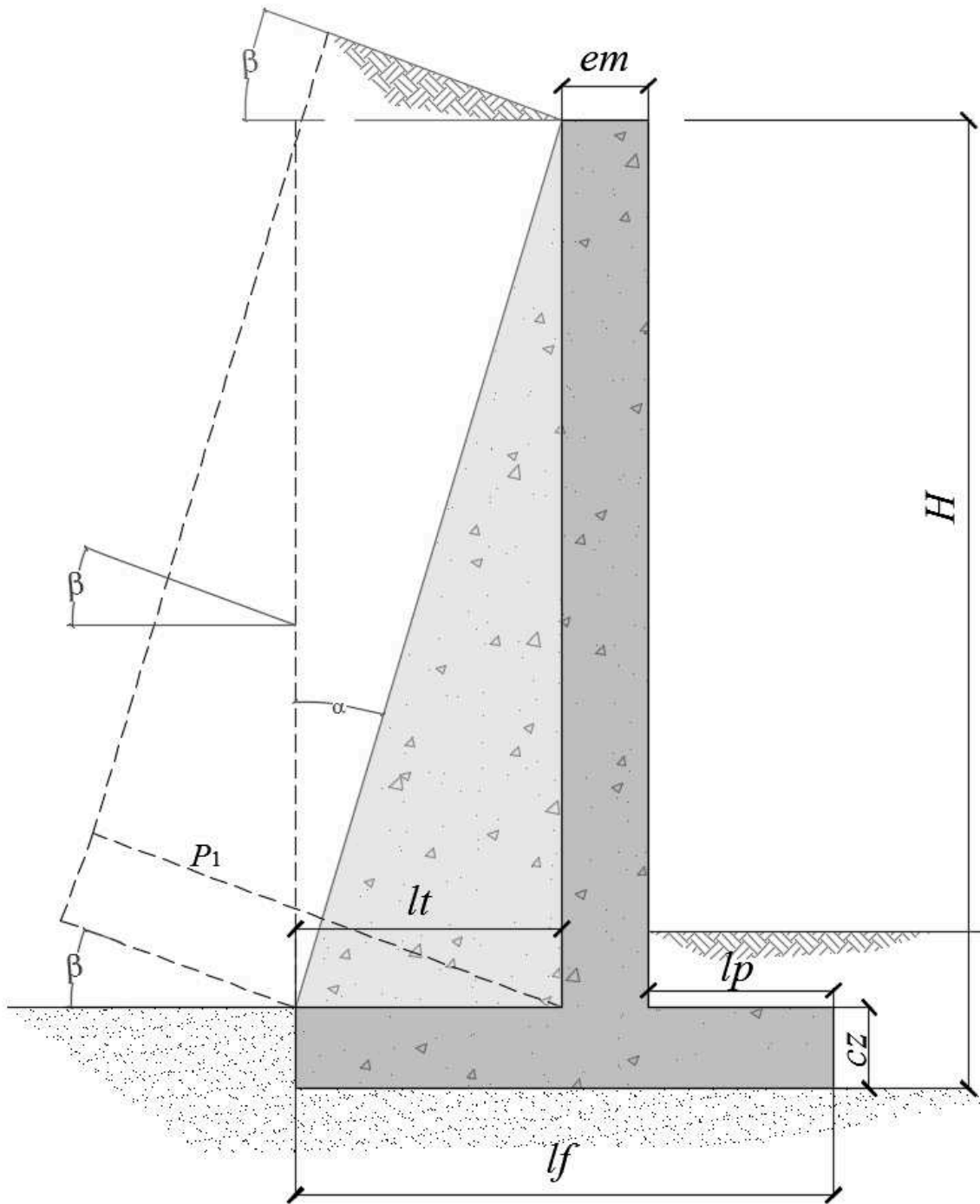
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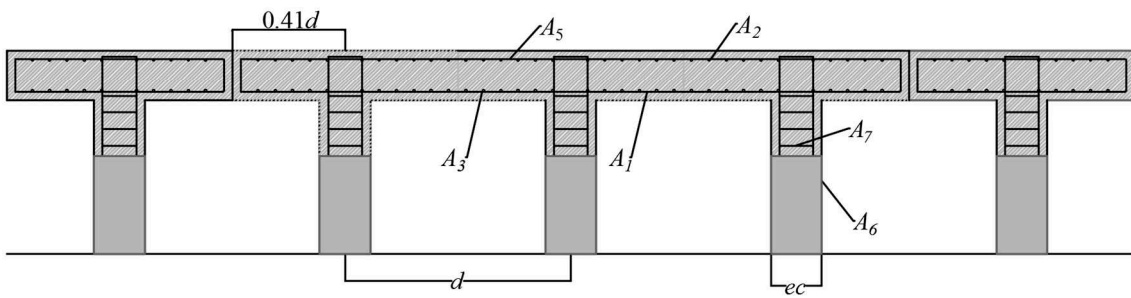
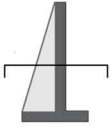
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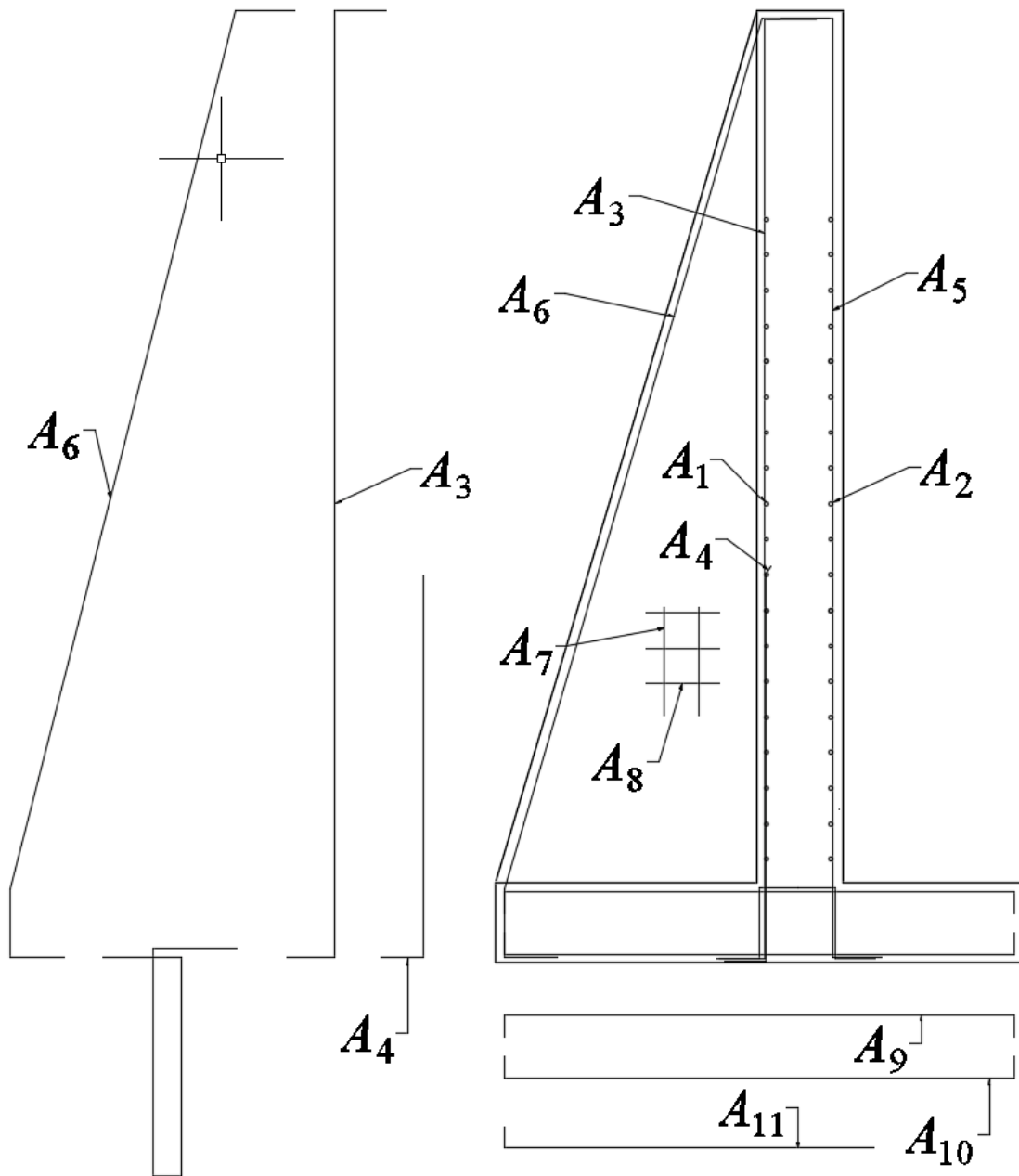


601  
 602 **Fig. 1.** Geometrical dimensions of a buttressed wall



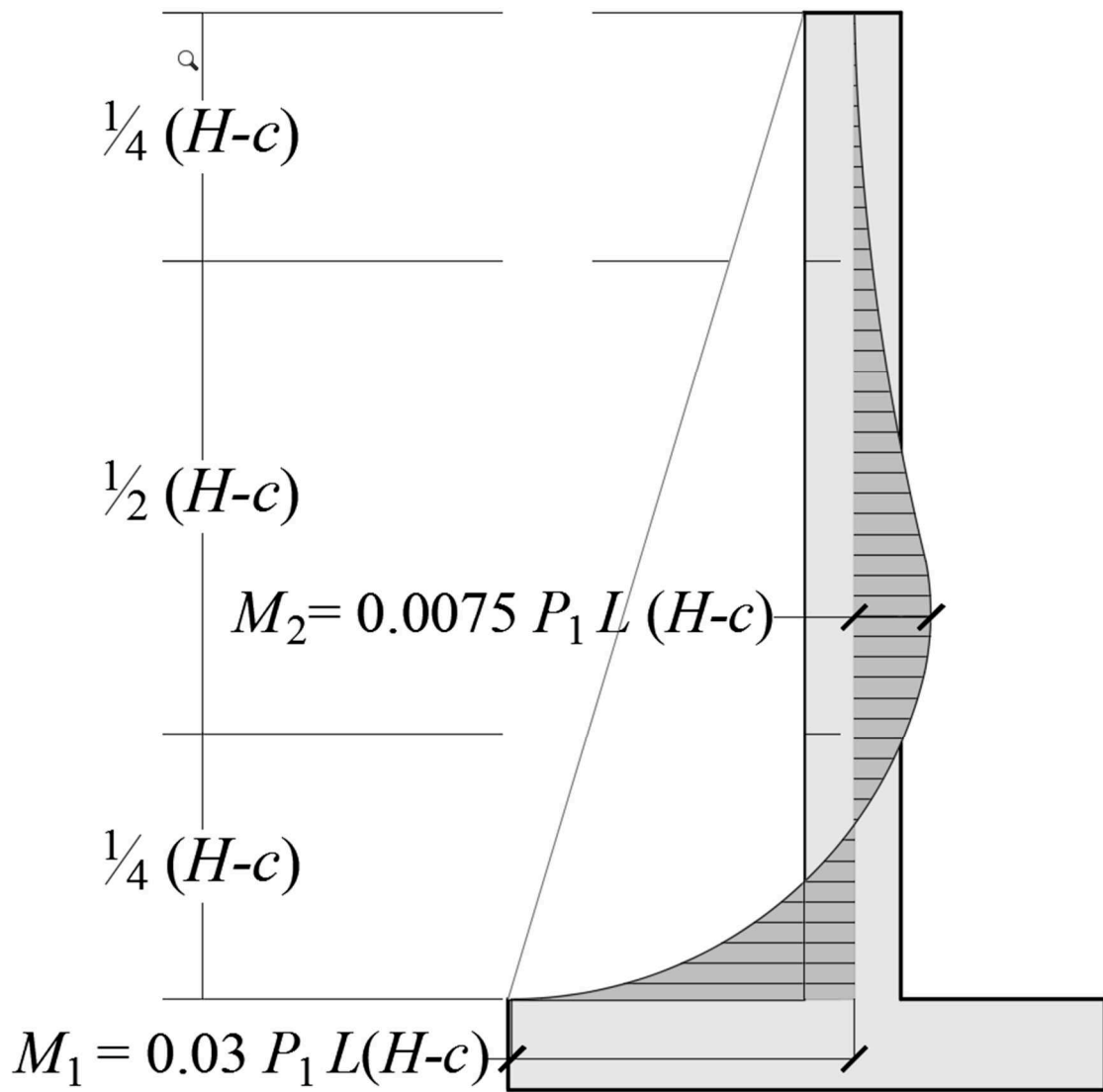
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604 **Fig. 2.** Earth-retaining buttressed wall. Floor cross-section



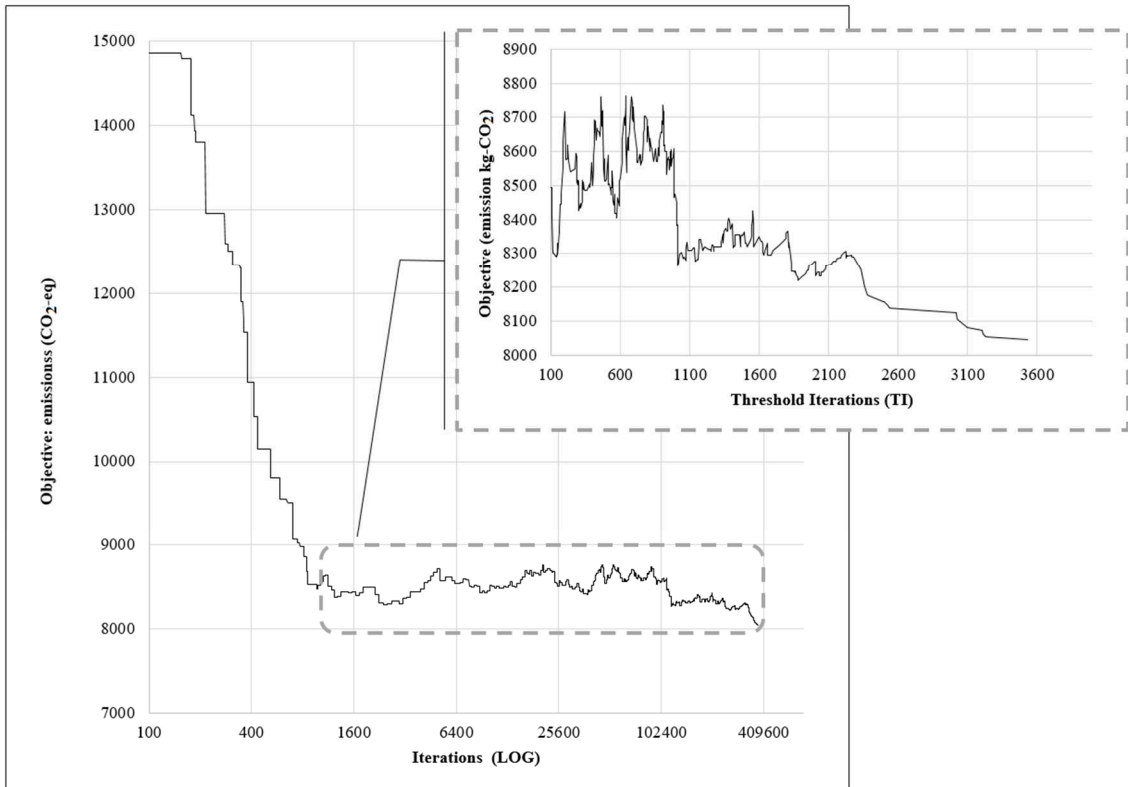
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606 **Fig. 3.** Reinforcement variables for earth-retaining buttressed walls



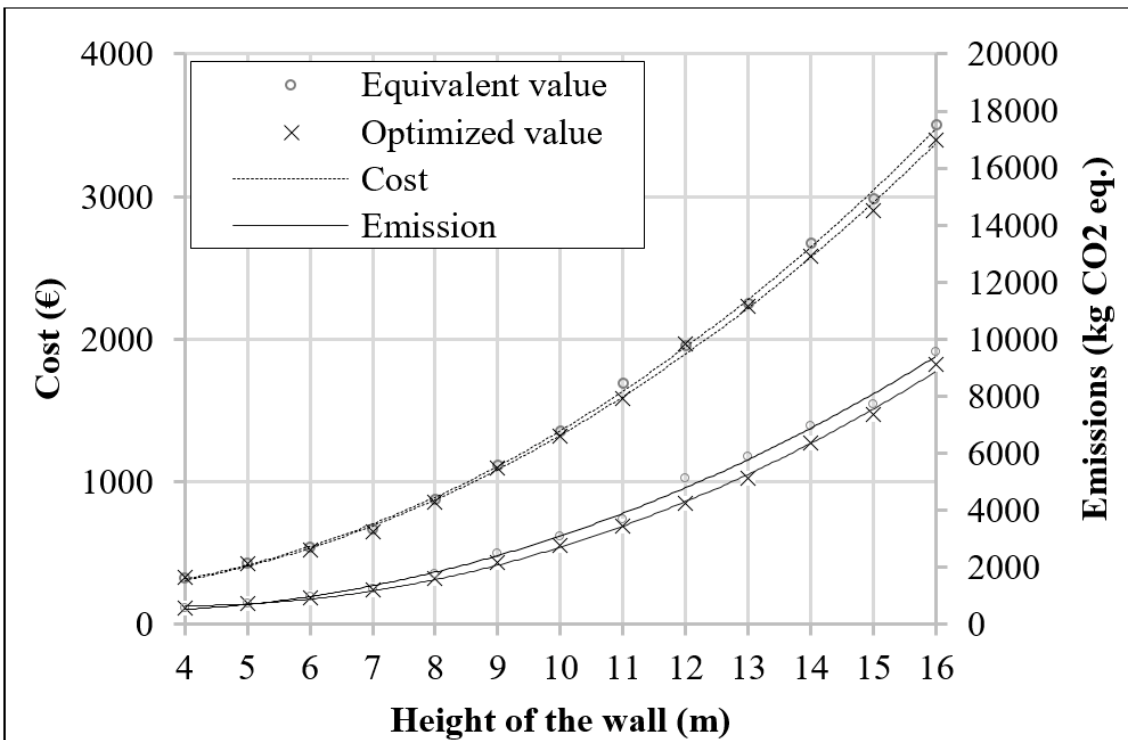
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608 **Fig. 4.** Bending moments of the stem



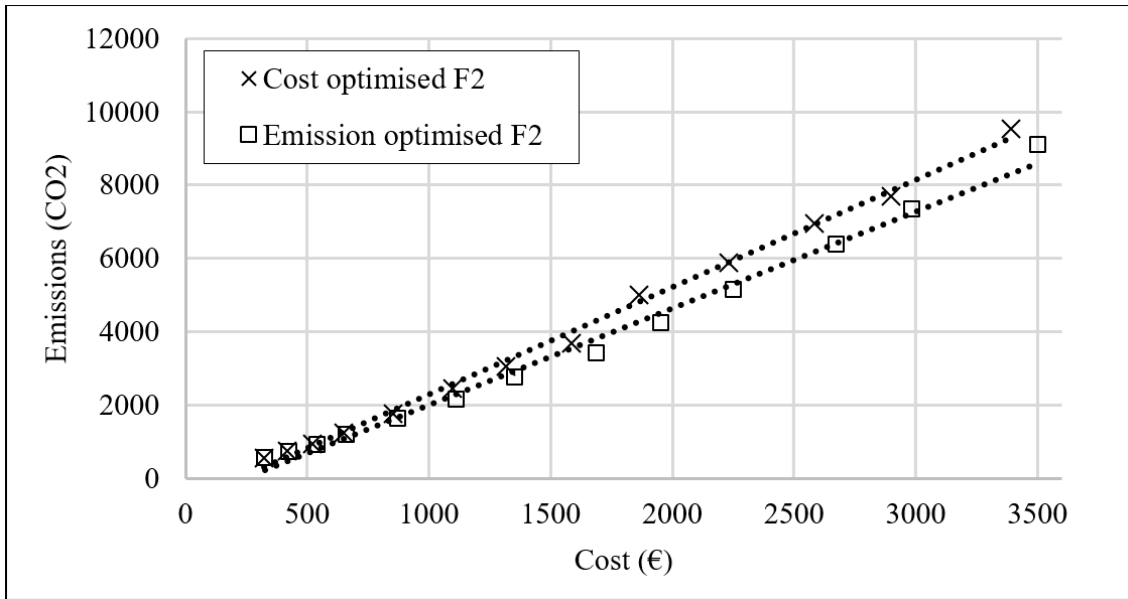
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610 **Fig. 5.** Design history convergence of HSTA for 16 m height earth-retaining buttressed wall



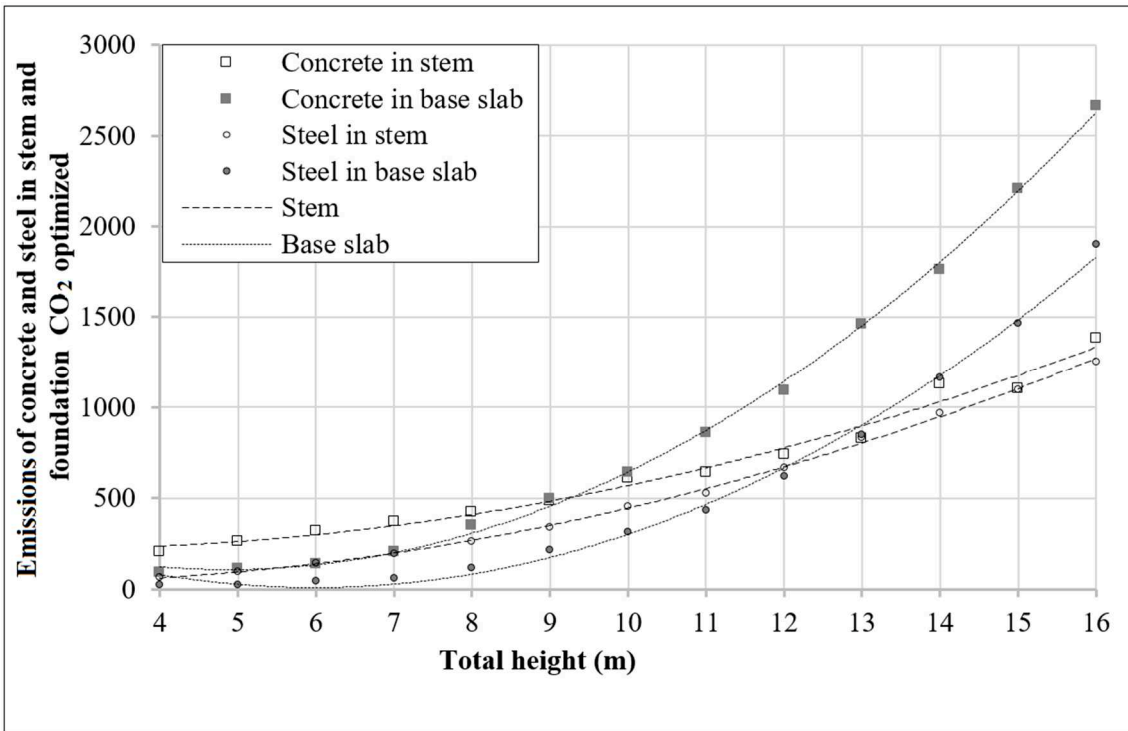
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612 **Fig. 6.** Carbon embodied (CO<sub>2</sub> equivalent .) and cost (€) optimized solutions with equivalent  
613 costs and emissions



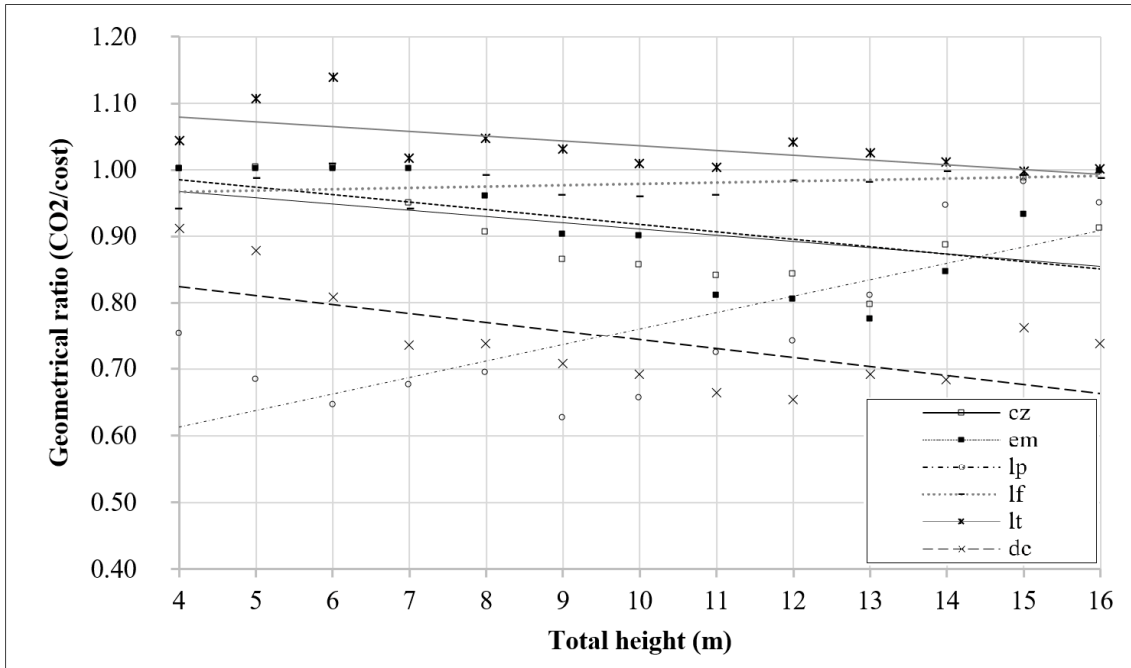
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615 **Fig. 7.** Ratio of emissions-optimized and cost-optimized solutions



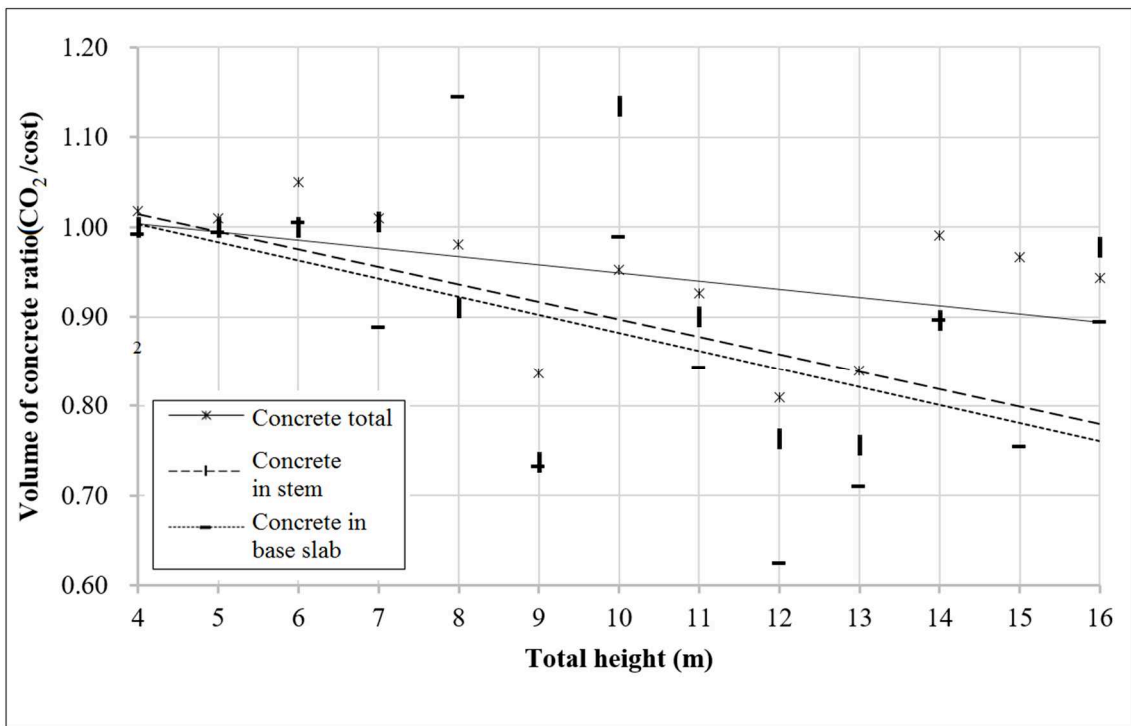
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617 **Fig. 8.** Emissions of steel and concrete in stem and foundation for the CO<sub>2</sub> optimization strategy



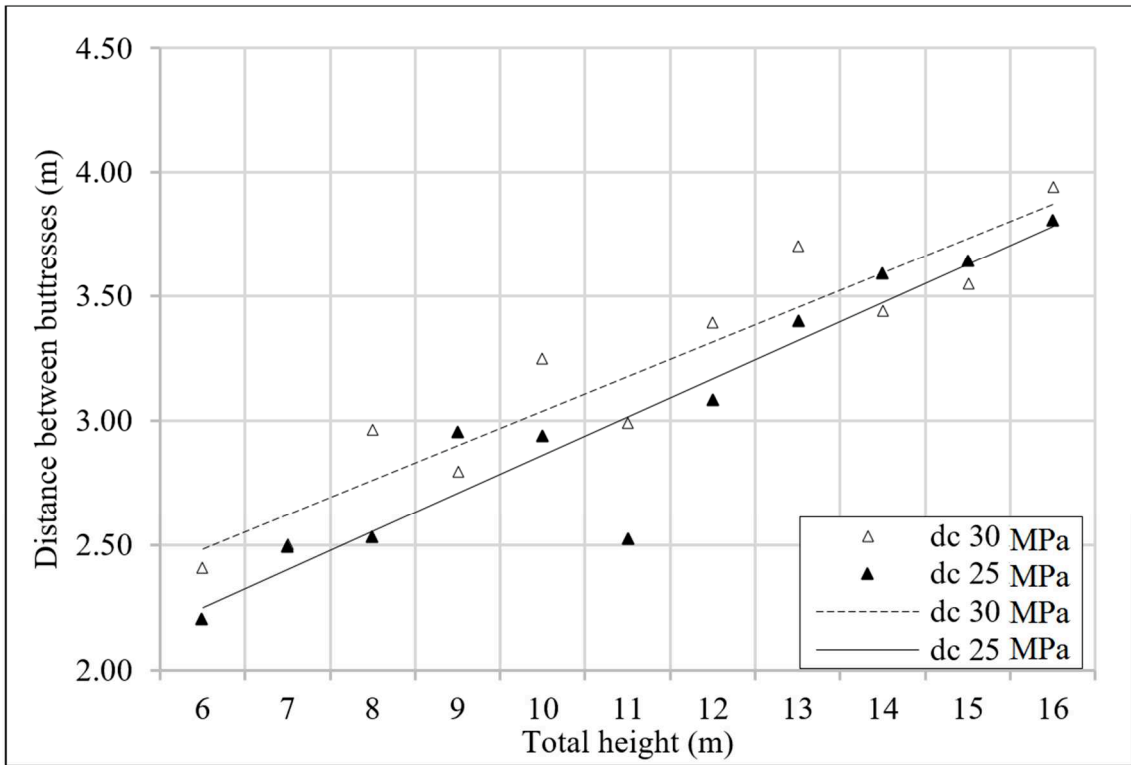
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619 **Fig. 9.** Ratio emission/cost of the geometrical variables



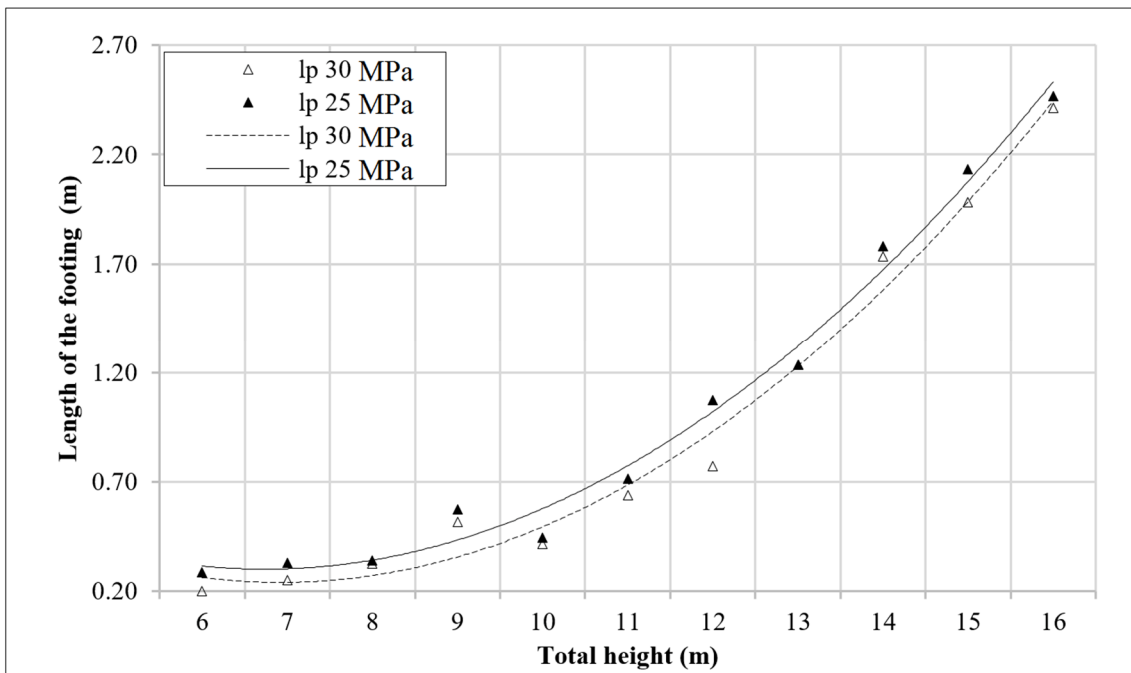
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621 **Fig. 10.** Ratio emission/cost of the volume of concrete



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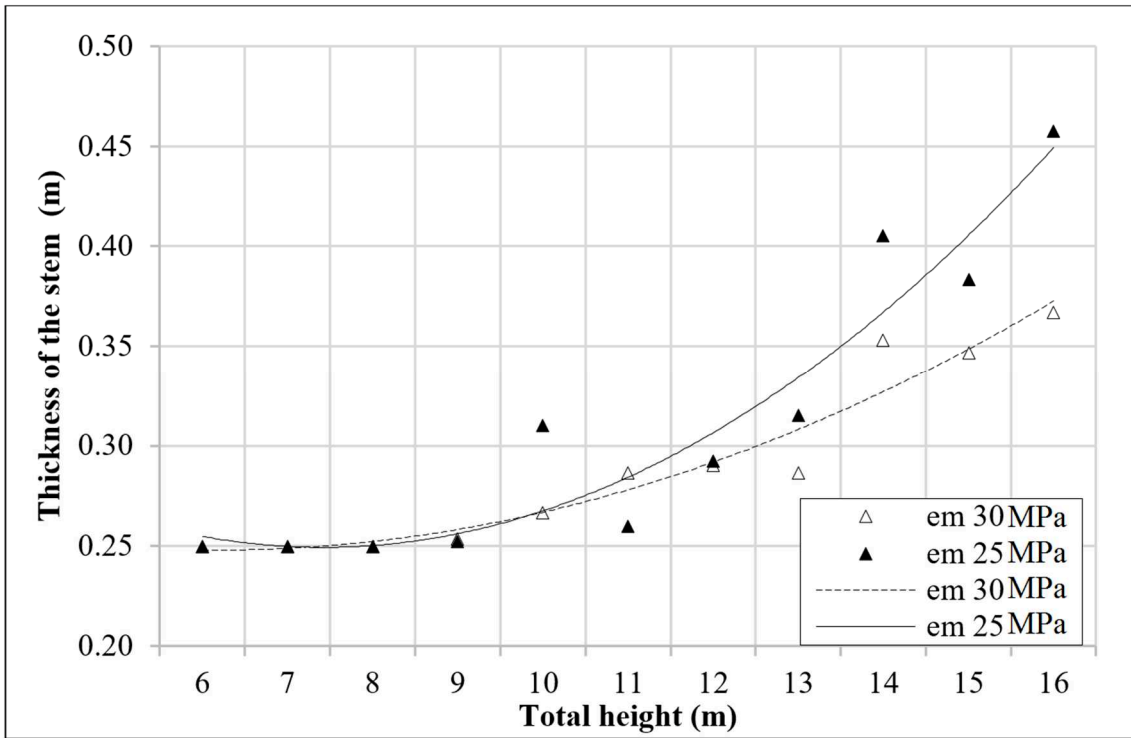
623 **Fig. 11.** Sensitive variables to concrete strength: distance between buttresses



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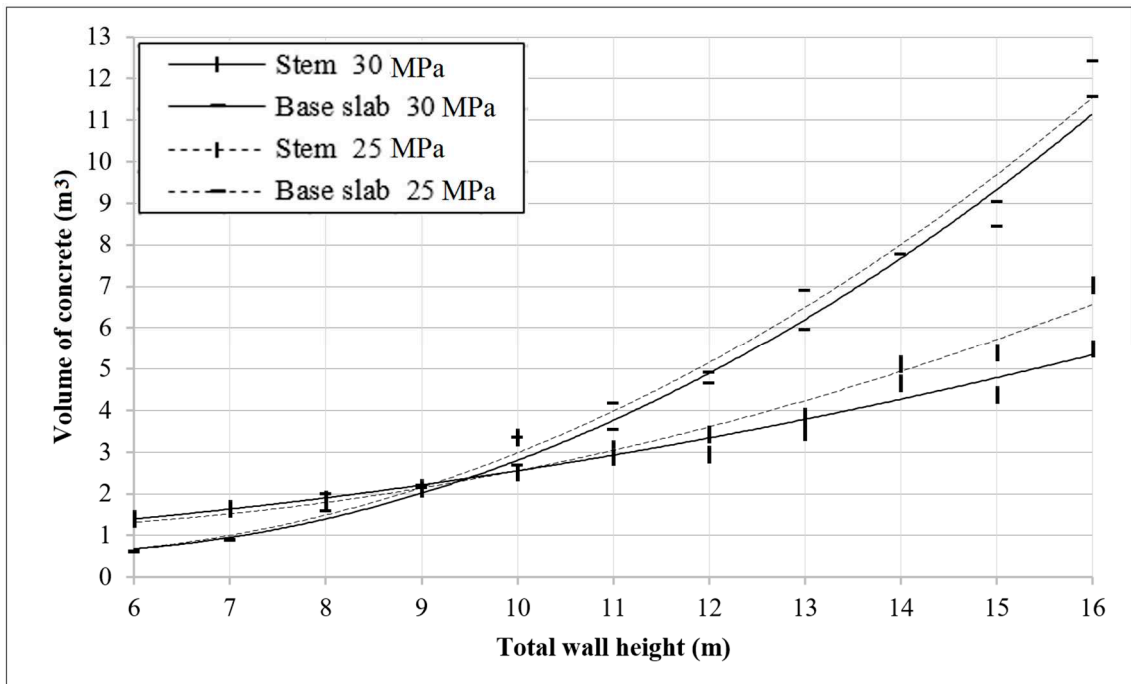
625 **Fig. 12.** Sensitive variables to the concrete strength: length of the footing





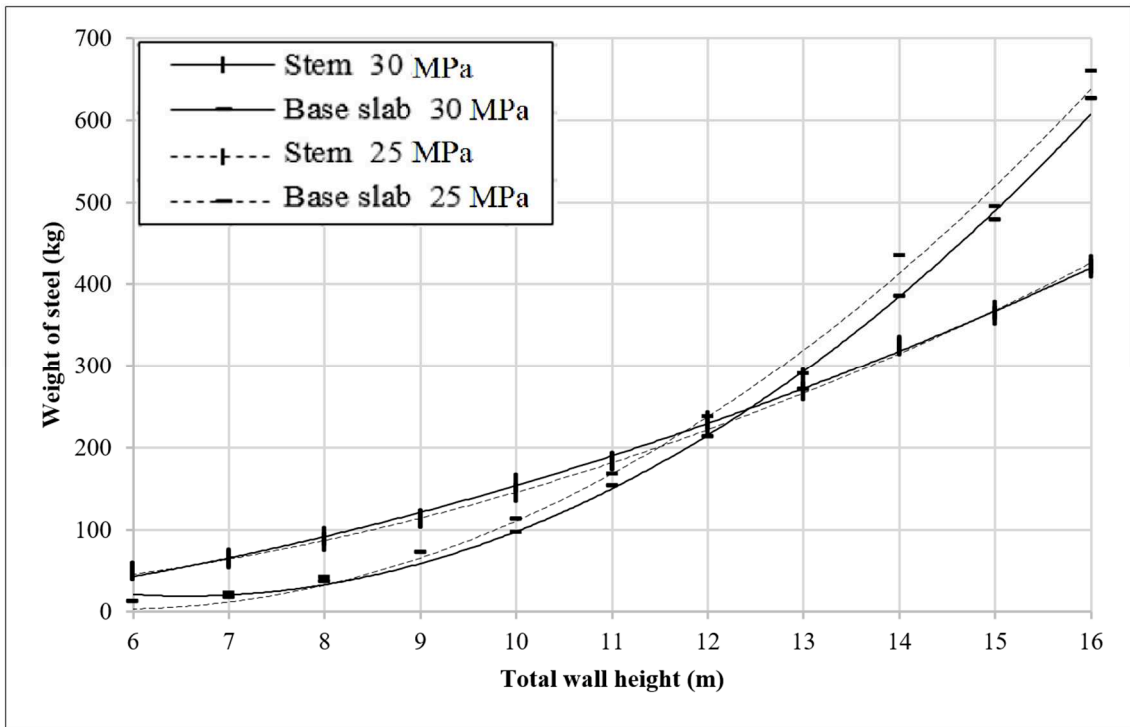
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627 **Fig. 13.** Sensitive variables to the concrete strength: thickness of the stem



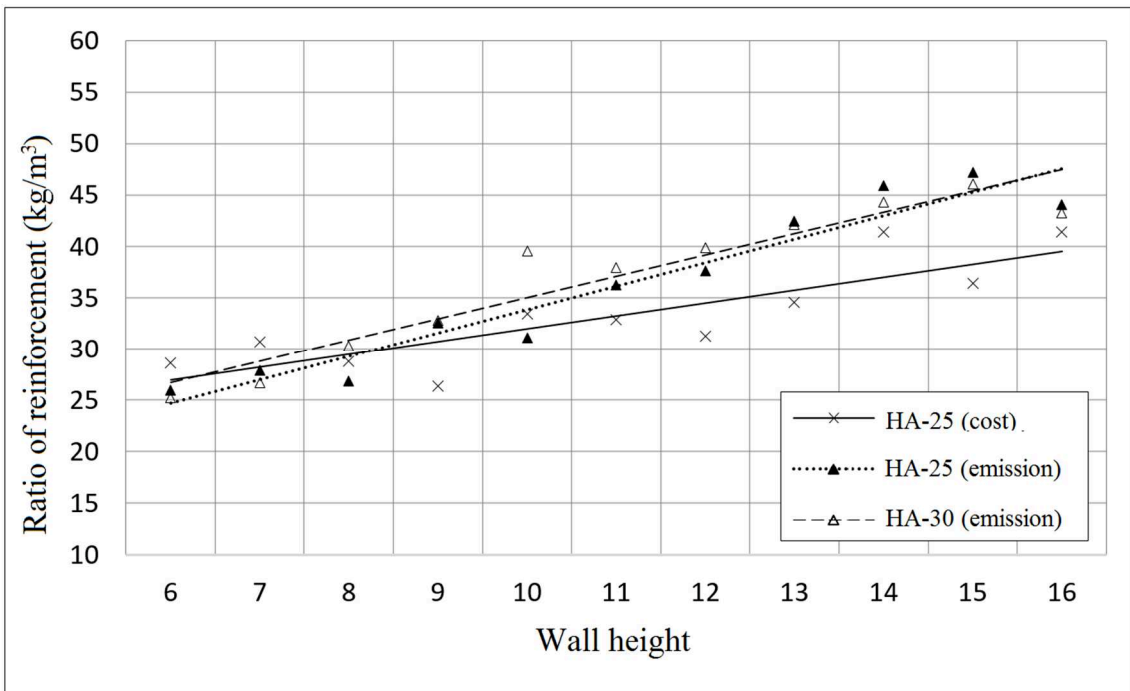
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629 **Fig. 14.** Sensitivity to the concrete strength: volume of concrete in stem and base slab



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631 **Fig. 15.** Sensitivity to the concrete strength: weight of steel in stem and base slab



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633 **Fig. 16.** Ratio of reinforcement by optimization strategy and concrete class (based on the mean  
634 optimum values)

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**Table 1.** Unit breakdown of emissions and cost

Unit	Emissions (CO <sub>2</sub> -eq)	Cost (€)
<i>kg of steel B400</i>	3.02	0.56
<i>kg of steel B500</i>	2.82	0.58
<i>m<sup>3</sup> of concrete HA-25 in stem</i>	224.34	56.66
<i>m<sup>3</sup> of concrete HA-30 in stem</i>	224.94	60.80
<i>m<sup>3</sup> of concrete HA-35 in stem</i>	265.28	65.32
<i>m<sup>3</sup> of concrete HA-40 in stem</i>	265.28	70.41
<i>m<sup>3</sup> of concrete HA-45 in stem</i>	265.91	75.22
<i>m<sup>3</sup> of concrete HA-50 in stem</i>	265.95	80.03
<i>m<sup>2</sup> stem formwork</i>	1.92	21.61
<i>m<sup>3</sup> of backfill</i>	28.79	5.56
<i>m<sup>3</sup> of concrete HA-25 in foundation</i>	224.34	50.65
<i>m<sup>3</sup> of concrete HA-30 in foundation</i>	224.94	54.79
<i>m<sup>3</sup> of concrete HA-35 in foundation</i>	265.28	59.31
<i>m<sup>3</sup> of concrete HA-40 in foundation</i>	265.28	64.40
<i>m<sup>3</sup> of concrete HA-45 in foundation</i>	265.91	69.21
<i>m<sup>3</sup> of concrete HA-50 in foundation</i>	265.95	74.02

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**Table 2.** Set of design discrete variables

Variables	N° of possible values in range	Increment (step size)	Lower Bound (cm)	Upper bound (cm)
<i>cz</i>	188*	1 cm	80*	267*
<i>em</i>	200	1 cm	25	224
<i>lp</i>	800	1 cm	20	819
<i>lt</i>	2000	1 cm	20	2019
<i>e<sub>c</sub></i>	60	2.5 cm	25	172.5
<i>dc</i>	481*	5 cm	320	800
<i>f<sub>ck</sub></i>	6	25, 20, 25, 40, 45, 50		
<i>f<sub>yk</sub></i>	2	400, 500		
<i>A<sub>1</sub> a A<sub>10</sub></i>	∅	8	6, 8, 10, 12, 16, 20, 25, 32	
	<b>n</b>	16	1 steel rebar	2
	∅	8	4,5,6,7,8,9,10	17
<i>A<sub>11</sub> a A<sub>12</sub></i>		7	1 steel rebar	4
	<b>n</b>			10

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\* Number of values as a function of the height

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**Table 3.** Fixed parameters in the design parametric study

Parameter considered	Value
Bearing capacity	0.3 MPa
Fill slope	0
Foundation depth, $H_2$	2 m
Uniform load on top of the fill, $\gamma$	10 kN/m <sup>2</sup>
Wall-fill friction angle, $\delta$	0°
Base-friction coefficient, $\mu$	tg 30°
Safety coefficient against sliding, $\gamma_{fs}$	1.5
Safety coefficient against overturning, $\gamma_{fo}$	1.8
EHE safety coefficient for loading	Normal
ULS safety coefficient of concrete	1.5
ULS safety coefficient of steel	1.15
EHE ambient exposure	IIa

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**Table 4.** Set of calibration parameters tested in HSTA

n_HMS	HMS	HMCR	HMP	IWI	TI	PAR	Percentage of Variables	TA
1	50	0.7	0.9	150	1000	0.2	0.3	1%
4	200	0.8		300	5000	0.4		5%
		0.85						

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**Table 5.** Best performing results by average objective and deviation in 16 m walls

Average	Standard Deviation	n <sub>HMS</sub>	HMS	HMCR	HMP	IWI	TI	PAR	P <sub>var</sub>	TA	Processing Time (s)	Processing Time (min)
9019.03	102.21	1	50*n <sub>HMS</sub>	0.8	0.9	150	1000	0.2	0.3	5%	213.914	3.57
8979.43	186.32	1	50* n <sub>HMS</sub>	0.85	0.9	150	5000	0.2	0.3	1%	228.945	3.82
8630.65	176.95	4	200*n <sub>HMS</sub>	0.85	0.9	300	1000	0.2	0.3	1%	2173.315	36.22
8568.83	150.02	4	200*n <sub>HMS</sub>	0.7	0.9	300	5000	0.2	0.3	1%	2932.251	48.87
8025.86	116.35	4	50*n <sub>HMS</sub>	0.8	0.9	150	5000	0.2	0.3	1%	967.855	16.13
Parameters considered:		<b>4</b>	<b>50*n<sub>HMS</sub></b>	<b>0.8</b>	<b>0.9</b>	<b>150</b>	<b>5000</b>	<b>0.2</b>	<b>0.3</b>	<b>1%</b>		

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**Table 6.** Percentage of total emissions (kgCO<sub>2</sub>/m) of the wall by components

Wall height	4	5	6	7	8	9	10	11	12	13	14	15	16
<b>Emission source</b>													
Concrete in stem	40	39	37	34	27	23	21	19	17	15	18	17	16
Concrete in buttress	8	9	10	11	12	14	15	16	14	15	12	12	11
Concrete in base slab	18	17	16	18	22	23	23	26	26	26	27	27	32
<b>Concrete Total</b>	<b>65</b>	<b>65</b>	<b>62</b>	<b>61</b>	<b>61</b>	<b>60</b>	<b>59</b>	<b>59</b>	<b>58</b>	<b>57</b>	<b>57</b>	<b>56</b>	<b>55</b>
Steel in stem	13	15	17	17	17	16	17	15	16	16	15	15	14
Steel in base slab	4	4	5	6	7	9	12	13	14	16	18	19	21
<b>Steel Total</b>	<b>17</b>	<b>18</b>	<b>21</b>	<b>23</b>	<b>24</b>	<b>26</b>	<b>28</b>	<b>28</b>	<b>30</b>	<b>32</b>	<b>33</b>	<b>35</b>	<b>36</b>
Stem formwork	3	3	3	3	3	2	2	2	2	2	2	2	1
Base slab formwork	0	0	0	0	0	0	0	0	0	0	0	0	0
Earth removal (heel)	3	3	2	2	2	2	2	1	1	1	1	1	1
Earth removal (toe)	0	0	0	0	0	0	0	0	0	0	0	0	0
Backfill	11	11	10	10	10	10	9	9	9	8	7	7	6

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**Table 7.** Ratio emission/cost of the steel per optimization strategy

Height (m)	Steel Total	Steel in stem	Steel in base slab
4	1.06	1.15	0.81
5	0.99	1.12	0.68
6	0.95	1.05	0.75
7	0.92	0.95	0.84
8	1.02	0.99	0.98
9	1.02	0.97	1.08
10	0.97	0.94	1.03
11	1.02	0.97	1.08
12	0.98	0.94	1.02
13	1.04	1.03	1.06
14	1.04	1.08	1.04
15	1.06	1.03	1.06
16	1.09	1.05	1.07

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