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#### 20 **Abstract**

21 The construction industry has received attention due to its significant contribution to 22 global carbon emissions. In this paper, conventional design and construction practices 23 of reinforced concrete beams are scrutinised to explore the potential for reductions in 24 embodied carbon. For a given set of design criteria, a family of discrete beam designs 25 which have different geometries and corresponding reinforcements were developed to 26 identify those with minimum embodied carbon. Two algorithms for shape optimisation 27 were developed, one to identify the geometry of the theoretical optimum design, and 28 another considering technical and construction feasibility. Prismatic beams were also 29 optimised exploring alternative designs with different depths and widths along with the 30 required reinforcements, for a reasonable comparison. Several cases were studied to 31 understand the effect of different design parameters. Different design criteria 32 suggested different geometries to minimise embodied carbon, even if the design span 33 was the same. The importance of minimising web width was seen throughout the 34 analysis. The expected deflection of each design was also estimated to understand the 35 effect of optimisation on serviceability performance and found to be satisfactory in all 36 the cases. Embodied carbon of beams can be reduced by up to 38% by optimising 37 prismatic beams compared with conventional designs. Further savings up to 8% are 38 possible with a feasible shape optimised design compared with optimised prismatic 39 beams.

40 **Keywords**: parametric design, reinforced concrete beam design, shape optimisation, 41 embodied carbon, deflection

42

## **1 Introduction**

44 The built environment accounts for approximately 40% of global energy consumption and 30% of greenhouse gas emissions, according to United Nations Environment Programme [1]. Thus, assessing the environmental performance of buildings is crucial in aiming at sustainability. Ding [2], Ortiz et al. [3], Pomponi and Moncaster [4] and Sharma et al. [5] discussed the methods of measuring the environmental performance of the buildings by analysing different phases of life for their energy consumption and greenhouse gas emissions, while EN 15978 [6] specifies a calculation method. Referring to EN 15978 [6], RICS [7] identifies operational emissions as the result of 52 energy consumption in the day-to-day running of a property whereas embodied emissions as the results from producing, procuring and installing the materials and 54 components of the structure. Since operational carbon is appreciably understood and regulated, Cabeza et al. [8] and Orr et al. [9] suggested that the potential of reducing embodied carbon should be explored equally vigorously in the present context, to reduce whole life carbon emissions of buildings.

 Reinforced concrete is widely used in the construction industry. Global production of cement which is mainly used for concrete is around 4.1 gigatonnes [10], being responsible for 5-6% of global carbon emissions [11]. Dimoudi and Tompa [12] and Luo et al. [13] showed that concrete and steel are responsible for 65-75% of total embodied carbon in buildings. Furthermore, Sansom and Pope [14], and Foraboschi et 63 al. [15] identified floor systems were responsible for a share of up to 75% of the overall embodied carbon of the superstructure. Therefore, this paper will explore the possibilities of reducing the embodied carbon of reinforced concrete floor beams.

 Prismatic structural members with a uniform longitudinal and transverse reinforcement have the same flexural and shear capacity throughout the member. Such sections are

 underutilised in several places, implying the potential of reducing material consumption. Shape optimisation is a proven strategy to reduce material usage by providing the necessary amount of material in the right places. Hawkins et al. [16] showed that shape optimisation using flexible formwork can reduce concrete consumption of beams up to 44%. Thus, this study utilises the concept of shape 73 optimisation to minimise embodied carbon of concrete beams.

74 For a given set of design criteria for a building, there exists a range of viable and safe 75 Structural designs that have different grids, element sizes, steel reinforcement design, 76 and even geometries. From the perspective of optimisation, such alternative designs 77 can be analysed to seek the design with minimum possible embodied carbon. For 78 example, if a steel-reinforced concrete beam of a specified span is to be designed to 79 withstand a specified load envelope, there are multiple arrangements of concrete and 80 steel that will satisfy the requirements. Existing design guidelines such as IStructE 81 Design Manual [17] and Concrete Buildings Scheme Design Manual [18] offer span to 82 depth ratios as the starting point for the design process. This paper examines how 83 parametric design could be used to update these starting points to support reductions 84 in embodied carbon in new designs.

 According to Orr et al. [19], the depth profiles of the shape optimised beams can be developed considering the flexural performance, and the width profile can be developed considering shear performance. Some adjustments to the depth profile 88 might be required to incorporate shear capacity. However, there might exist more 89 optimal shapes by trading off the width and depth near the ends of the beams in terms 90 of environmental performance. Thus, shape optimisation was considered as a parametric exploration in this study to understand whether the embodied carbon could be further reduced. Therefore, this paper explores the possibility to reduce the

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93 embodied carbon of reinforced concrete floor beams through parametric design 94 exploration coupled with shape optimisation.

95

### 96 **2 Literature review**

 Considering the different phases of the lifecycle of building materials, Embodied 98 Carbon of buildings can be reduced by adopting low carbon materials, material minimisation strategies, construction optimisation strategies, local sourcing of materials, material reuse and recycling strategies as shown by Akbarnezhad and Xiao [20], Lupíšek et al. [21], Birgisdottir et al. [22], and International Energy Agency [23]. 102 This study focuses on material minimisation through developing design alternatives. 103 | Miller et al. [24], Zeitz et al. [25], Nadoushani and Akbarnezhad [26], Foraboschi et al. [15], and Sahab et al. [27] have successfully illustrated the potential of reducing embodied carbon of buildings by developing design alternatives varying structural form 106 of the building, floor system, reinforcing technique and layout. Going to the next step of optimisation, this study focuses on the reduction in embodied carbon of structural elements by minimising resource usage through understanding the potential trade-off 109 between the choice of the amount of concrete and the reinforcement.

110 | Different researchers have attempted to explore the possibility to reduce the embodied 111 carbon of structural members through developing a range of design solutions. Due to 112 the similarity of the principles, attempts to optimise either cost or embodied energy are 113 also considered in this review. Camp et al. [28], Lee and Ahn [29], and Leps and 114 Sejnoha [30] used genetic algorithms to optimise steel-reinforced concrete frames or 115 beams by varying reinforcement arrangement and sectional dimensions. With the 116 proven savings of around 25-36%, their studies confirm that understanding the trade-117 off between sectional dimensions and reinforcement may be a promising approach to

118 optimise embodied carbon of concrete members. Kwan et al. [31] optimised two-way 119 span slabs for different span lengths by varying the slab thickness, the grade of 120 concrete, and the amount and strength of reinforcement using genetic algorithms. They 121 observed that the designs with optimum carbon had less concrete and more low 122 strength steel than a conventional design, but the optimum designs were dominated by 123 limiting slab thickness. This further certifies the importance of understanding the trade-124 off between the amount of steel and concrete chosen in a design. Perea et al. [32] 125 optimised reinforced concrete bridge frames through heuristic optimisation and 126 observed that the optimum designs are governed by the serviceability criteria. 127 Therefore, it is required to assess the serviceability of each discrete design in this study 128 in the optimisation process. Yeo and Gabbai [33] parametrically varied the geometry of 129 and amount of reinforcement in beams to identify optimum and observed a parabolic 130 relationship between depth and embodied carbon, supporting the viability of parametric 131 design approach for optimisation. The above studies adhered to selected existing 132 design codes for the design limitations even if they designed the structural elements 133 with varying dimensions and reinforcement configurations.

134 Several researchers have reduced the concrete consumption of beams using different 135 design and construction techniques. Xie and Steven [34], Huang and Xie [35], Huang 136 et al. [36], Bendose and Kikuchi [37], Jantos et al. [38], and Gaganelis et al. [39] 137 Fesearched algorithms for topology optimisation which can reduce material 138 consumption by changing the geometry and forming voids. Jewett and Carstensen [40] 139 Successfully tested a topology optimised beam with a CNC cut Styrofoam mould 140 reducing concrete usage by 50%. Vantyghem et al. [41] 3D printed a topology 141 optimised post-tensioned beam using 20% less concrete. Veenendaal et al.[42], 142 Garbett et al. [43] and Orr et al. [19,44] used flexible fabric formwork to cast shape 143 optimised reinforced concrete beams reducing concrete usage up to 58%, 55% and

144 40% respectively. Apart from the minimised concrete consumption, Hawkins et al. [16] 145 identified additional benefits of fabric formwork such as improved durability, textured 146 surface finish, and reduced weight of formwork due to permeable fabric formwork. 147 Therefore, this paper studies the shape optimisation of beams, further exploring the 148 design aspect from a parametric point of view.

149 Though embodied carbon has been used as a popular assessment method for 150 environmental performance, it has some degree of uncertainty. Hammond and Jones 151 [45] suggested that embodied carbon coefficients should be generally considered 152 tentative. Omar et al. [46] and Dixit et al. [47] illustrated that embodied carbon 153 coefficients can be geographically and temporally inconsistent. Furthermore, Oh et al. 154 [48] pointed out that adhering to present databases may not be a solution for 155 Sustainable design due to extreme inconsistencies in the present literature. As an 156 example, the average embodied carbon of C 28/35 concrete is 0.126 kgCO<sub>2</sub>e/kg as per 157 The Inventory of Carbon and Energy [49]. The value can be increased to 0.136 158  $\vert$  kgCO<sub>2</sub>e/kg when only CEM I is used or decreased to 0.099 kgCO<sub>2</sub>e/kg when fly ash is 159 used for 40%. While the world average embodied carbon of steel rebar is 1.99 160  $\vert$  kgCO<sub>2</sub>e/kg, using 85% recycled steel will reduce the coefficient to 1.20 kgCO<sub>2</sub>e/kg. 161 Furthermore, the reports by Energy Transitions Commission [50] and Material 162 Economics [51] highlight the possibilities of decarbonising the steel industry. Therefore, 163 this study illustrates how sensitive the optimum designs are to carbon coefficients as 164  $\vert$  well.

165 Design codes such as EN 1992-1-1 [52] and ACI 318 [53] require Ultimate Limit State 166 and Serviceability Limit State to be considered in the reinforced concrete design to 167 provide functional structures. Those codes of practice often offer span/depth ratios as 168 the starting points of the design to tackle deflection conservatively. Further, the design 169 codes impose limits to allowable deflection as a predefined fraction of span. Different

170 researchers have questioned those conventions considering both the design approach 171 and the design limit. Stewart [54] developed a probabilistic model for deflection of 172 reinforced concrete beams sized according to span/depth ratios and proved that the 173 probabilities of serviceability failures are not consistent. Vollum and Hossain [55] 174 conducted a series of parametric studies and concluded that there is scope to reduce 175 Slab thicknesses below some conventional guidelines. Further, Orr et al. [56] presented 176 findings of a survey of the structural engineering design profession which showed that 177 47% of respondents were comfortable in allowing the deflection to exceed the design 178 deflection limit for a few minutes per week or more, even if the limiting deflection of 179 beams and slabs are prescribed by different design guidelines. Therefore, it is rational 180 to estimate the deflections with structural mechanics-based calculations in this study 181 for each design and evaluate how the optimisation process can affect serviceability.

182

#### 183 **3 Objective**

184 In this study, the approach for the design and construction of concrete beams passively 185 reinforced with steel is revisited to reduce embodied carbon. Exhaustive parametric 186 design together with shape optimisation is used to explore the design space against 187 the conventional design of prismatic beams. Parametric design in this context refers to 188 the design of a set of beams which have different shapes and corresponding amounts 189 of reinforcement in longitudinal and transverse directions to comply with a specified set 190  $\Box$  of design criteria. The intention is to identify the combination of beam geometry and the 191 amount of reinforcement which provides enough capacity with the lowest embodied 192 carbon. Optimisation algorithms are developed to obtain the designs with theoretical 193 optimum and feasible optimum. Prismatic beams are also optimised to facilitate a fair 194 | understanding of the benefit of shape optimisation. Since conventional span/depth

195 Tratios are not considered as the starting point of the design process, the deflection of 196 each design is estimated and compared against prescribed benchmarks.

197

#### 198 **4 Methodology**

199 To illustrate the effect of the parametric design approach and shape optimisation, a set 200 of shape optimised beams and a set of prismatic beams were designed to withstand a 201 specified structural requirement. Embodied carbon of all the designs was calculated to 202 identify the design with the minimum environmental impact. Deflections of each design 203 were also estimated. For the sake of simplicity, simply supported reinforced concrete 204 Single-spanning flanged floor beams with loadings corresponding to a general office 205 building were analysed in this study. Due to the repetitive nature of the parametric 206 design calculations, MATLAB programmes were developed for designing the beams.

#### 207 **4.1 Design Criteria**

208 One-way-spanning T-beams between columns, which support a two-way-spanning  $209$  slab around its edges were studied in this paper. The beams were designed 210 considering flexural and shear performance while the resulting designs were assessed 211 for deflection. The following design criteria were considered for both prismatic and 212 Shape optimised beams (Figure 1 and Table 1).

213 • Three sets of design criteria were studied, namely, 8m span simply supported 214 beams in grids of  $8m \times 8m$ ,  $8m \times 6m$  and  $8m \times 4m$ , aiming to study the effect on 215 the optimum design from the design load. This selection of the grids captures a 216 **range of possible design loads for 8 m span beams within the borderlines of** 217 one-way spanning and two-way spanning slabs. Furthermore, the grid choices 218 can be justified considering the possibility to provide recommended window to





## 245

# 246 **Figure 1. Design criteria of the beams**

# 247 **Table 1. Design details for different load cases**





248

249 The longitudinal reinforcement for a selected depth was designed to satisfy the 250 Ultimate Limit State flexural criterion, following EN 1992-1-1 [52]. Since the critical 251 | location for bending moment in a simply supported beam carrying uniformly distributed 252 | load is at mid-span, this is the defining location to calculate the amount of longitudinal 253 reinforcement, and the same amount was continued throughout the span. All the cases 254 are verified to be within the recommended maximum and minimum amounts of 255 reinforcements stated in EN 1992-1-1 [52]. If the required amount of reinforcement 256 exceeds the maximum reinforcement, the selected geometry was considered 257 structurally unfeasible. The same amount of longitudinal reinforcement was given 258  $\parallel$  throughout the beam.

259 Transverse reinforcement was provided to resist shear which was designed using the 260 variable truss analogy, following EN 1992-1-1 [52] and IStructE Design Manual [17]. 261 The reinforcement was calculated for 11 sections throughout the span, to provide only 262 what is required. The required amount was designed to adopt a strut angle of  $22^{\circ}$  to the 263 horizontal wherever feasible. The minimum recommended reinforcement was provided 264 where the design shear links were unnecessary. The designs in which concrete strut 265 failed were considered unfeasible. The contribution from the flange to the shear 266 capacity has not been considered in this study to be conservative according to EN 267 1992-1-1 [52,59].

268 Three different optimisation approaches were adopted in this study, namely, 269 Theoretical Optimum Shape Finding (TOSF), Feasible Optimum Shape Finding

- 270 (FOSF), and Optimising Prismatic Beams (Figure 2 & 3). In all three cases, series of 271 design solutions were generated for a range of design midspan depths while each 272 design is optimised for embodied carbon as much as possible through three different 273 approaches. Then the optimum midspan depth for each optimisation approach was 274 identified by plotting the variation of embodied carbon with design midspan depth.
- 275



**Theoretical Optimum Shape Finding** (TOSF)

Select designs of cross section with minimum<br>embodied carbon throughout the span for each midspan depth



Feasible Optimum Shape Finding<br>(FOSF)

Select parabolic depth profile and corresponding<br>width profile with minimum embodied carbon for each midspan depth

Optimum Prismatic Shape Finding<br>(OPSF)

Select minimum possible width for each design midspan depth

276

277 **Figure 2. Three different approaches to reduce the embodied carbon of beams**



287 Simplicity. The depth and the web width of the beam have been subjected to 288 optimisation, keeping the shape of the web at a given section as a rectangle. The 289 approach for optimisation was developed based on findings by Orr et al. [19,61–63], 290 but an extended parametric design which explores the optimum overall depth and the 291 corresponding shape has been introduced here. The self-weight of the web of the 292 beam was not considered for the sake of simplicity, acknowledging the insignificance of 293 the self-weight of the web compared to other loads. The minimum possible width of the 294 beam was limited to 150 mm and 200 mm as two separate cases, following the fire 295 rating of R60 and R90 [17]. As per the recommendations from Orr [63], the apparently 296 beneficial effect of inclined bars in resisting shear was not considered in the designs.

297 The process of optimising the shape was approached in two ways. One was to identify 298  $\parallel$  the theoretical shape which results in minimum possible embodied carbon, and the 299 other was to identify the design with minimum possible embodied carbon within the 300 constraints of feasible construction. The motivation was to explore the gap between the 301 theoretical best and the practical best in terms of embodied carbon.

## 302 **4.2.1 Theoretical Optimum Shape Finding (TOSF)**

 For a given midspan depth, the shape of the beam with minimum possible embodied carbon was explored by designing several sections along the beam in a parametric design approach. First, the amount of longitudinal reinforcement for the selected 306 midspan depth was calculated. Six sections along the beam from the support to the midspan were designed for a range of depths and widths with the predetermined 308 amount of longitudinal reinforcement, taking the advantage of symmetry in the algorithm. Each selection of cross-sectional dimensions for a given section of the beam was estimated for its flexural capacity with the predetermined longitudinal 311 Feinforcement and marked structurally unfeasible if the capacity was less than the

312 applied moment at the section. The amount of transverse reinforcement was estimated 313 for each section. Then, the variation of the embodied carbon at each section with 314 design depth and web width was plotted to identify the dimensions which yield the 315 minimum embodied carbon. The shape of the beam with minimum possible embodied 316 carbon for the selected design midspan depth was obtained combining outcomes of 317 such analyses for several sections throughout the beam (Figure 4).



318

320

322 It is advised to avoid longitudinal reinforcement having both positive and negative 323 curvatures in the design of shape optimised beams since otherwise there will be 324 straightening effects and accompanying vertical forces that add to the shear demand,  $325$  as shown by Orr et al. [61]. Hence, the design space of shape optimised beams is 326 practically limited to beams with longitudinal reinforcement having a single direction of 327 bar curvature. Therefore, FOSF was focused on finding the configuration of the shape 328 optimised beam with a parabolic depth profile resulting in the minimum possible 329 embodied carbon.

330 For the selected midspan depth, several parabolic depth profiles were generated by 331 varying the depth at the end of the beam. The corresponding profiles of web width 332 were generated based on shear criteria and minimum width due to fire rating. The 333 Feinforcement design is like TOSF. The optimum shape for the selected midspan depth 334 was then selected from the generated pool of designs (Figure 5).



335

336 **Figure 5. Feasible Optimum Shape Finding (FOSF)**

337

# 338 **4.3 Optimum Prismatic Shape Finding (OPSF)**

339 For the selected design criteria, sets of discrete beam designs were parametrically 340 developed considering a range of depths which included the conventional design 341 depths ( $d \approx$  span/14). Since the designs are aimed at reducing embodied carbon, width 342 for each design depth was selected as the minimum possible width, which is governed 343 by shear, fire resistance and spacing of reinforcing bars. The minimum width for the 344 Shear criterion was calculated to provide a necessary area for a safe concrete strut. 345 Since the fire rating and the space for reinforcement can have an impact on optimum

 designs, two cases for a minimum width of 150 mm and 200 mm were adopted in this study.

## **4.4 Estimation of deflection**

 Deflections of all the beams were estimated by double integration of the curvatures along the beam, following Euler–Bernoulli Beam Theory [64]. Simplified stress blocks 352 for concrete and steel was used to calculate curvatures, referring to EN 1992-1-1 [52]. Concrete was assumed to behave linearly elastic up to the design strength, and then 354 plastic, in compression while tensile strength was neglected. Steel was also assumed to behave linearly elastic up to the design strength in tension. The stress blocks for 356 several sections were developed by numerically solving the relationships for strain compatibility and equilibrium. Then the curvatures along the beam were numerically 358 integrated twice to obtain the deflection profile.

 EN 1992-1-1 [52] suggests the calculated sag of a beam under quasi-permanent loads to be less than span/250 for unimpaired appearance and general utility. The quasi-361 permanent combinations were estimated using  $\psi_2$ =0.3 for office areas, following EN 1990 [58]. The effect of creep was considered to account for long-term deflection. Referring to EN 1992-1-1 [52], a creep coefficient equal to 2.0 was chosen to represent 364 the conditions of a general office building, resulting in an effective modulus of elasticity 365 for the concrete of 11 GPa for the quasi-permanent loads. The estimated deflections 366 for the developed designs were compared with the benchmark of span/250 to illustrate 367 how the serviceability requirement might affect the selection of optimum design.

### **4.5 Estimation of Embodied Carbon**

370 At the end of the analysis, there were prismatic and shape optimised beam designs for 371 three different load cases, designed to satisfy flexure and shear criteria along with the 372 predicted deflections. The Inventory of Carbon and Energy (ICE database) developed 373 at the University of Bath [49] was used to calculate embodied carbon, considering the 374 emissions in the lifecycle phases from A1 to A3 according to EN 15978 [6], i.e. 'cradle 375 to gate'. Considering the designs to be European in the application, embodied carbon 376 of C30/37 concrete and reinforcing steel were considered as 0.132 kgCO<sub>2</sub>e/kg and  $377$  | 1.20 kgCO<sub>2</sub>e/kg respectively. In the calculation of embodied carbon, only the web 378 portion of the members was considered (height of the beam  $\times$  width of the web), 379 because there was no optimisation considered for the slabs in this study. The top 380 reinforcement of the beam and the reinforcement in the flange were also not included  $381$  for the same reason. The optimisation of slabs will be looked at in future work.

382 The optimisation algorithms adopted in this study are based on finding an optimum 383 design with minimum embodied carbon by trading off the amounts of steel and 384 concrete. Therefore, the resulting optimum designs are expected to be correlated with 385 the selected embodied carbon coefficients for steel and concrete. A separate study 386 was carried out to understand the effect of selected carbon coefficients on the optimum 387 design. Two additional cases were analysed by increasing and decreasing the carbon 388 coefficient of steel by 50%. The carbon coefficient of concrete is kept constant since 389 the varying coefficient of steel represents the reverse effect of changing the coefficient  $390$  of concrete. As an example, the impact on the optimum design by increasing the 391 carbon intensity of steel is similar to decreasing the carbon intensity of concrete since 392 both will suggest the optimum to have less concrete and more steel. The choice of the 393 cases is not to represent specific conditions but to generally investigate the effect of 394 the ratio between carbon coefficients of concrete and steel. Load Case C1 and C3 for

395 limiting the minimum possible width to 200 mm were analysed to observe how the 396 optimum midspan depth varies.

397

## 398 **5 Results**

### 399 **5.1 Variation of embodied carbon in the design space**

400 The optimisation algorithms considered in this study use design depth and load as

401 independent parameters and required amounts of reinforcements and optimum

402 geometry as dependant variables. Figure 6 shows the variation of flexural and average

403 Shear reinforcements for OPSF for three different load cases.



404

# 405 **Figure 6. Variation of flexural and shear reinforcement with design beam depth for three**  406 **load cases for OPSF**

407 Figure 7 presents the variation of embodied carbon with midspan depth for all three 408 | optimisation strategies for Load Case C1, breaking down the composition into the 409 contribution from concrete, flexural reinforcement and shear reinforcement. While the 410 amount of flexural reinforcement is unchanged for three optimisation approaches for a 411 given midspan depth, saving of embodied carbon is mainly associated with reducing 412 concrete consumption. The volumes of shear reinforcement were calculated assuming 413 rectangular shear links. Therefore, shape optimisation suggested an increase in the 414 density of shear links while changing the shape of the links. The resulting increase in 415 Shear reinforcement has an unnoticeable effect on overall embodied carbon.



#### 416

# 418 **for three optimisation strategies**

419 The curves for embodied carbon from concrete hence the total embodied carbon for 420 OPSF had minimum points with noticeable kinks in the curves. These kinks represent 421 the depths where the criterion for minimum width changes from a shear criterion to fire 422 resistance. The beams shallower than the identified optimum design had widths 423 governed by shear criterion whereas the deeper beams had the selected minimum 424 | possible width.

417 **Figure 7. Variation of the composition of embodied carbon with design midspan depth** 

425 The three different optimisation approaches (TOSF, FOSF and OPSF) were repetitively 426 used to develop discrete designs with different design overall midspan depths for three

 different load cases (C1, C2 and C3 in Table 1). Further, the beams were designed considering two minimum possible web widths to illustrate the effect on optimum 429 designs. Then, the variation of embodied carbon was plotted to understand the effect 430 of design overall depth, as in Figure 8. As benchmarks, conventional beam designs based on Economic Concrete Frame Elements to Eurocode 2 [65] are also presented 432 in the same plot. Referring to the design charts given in the guide, beam depths for load cases C1, C2 and C3 were selected as 687 mm, 642 mm and 574 mm respectively, for 300 mm wide beams. The interpolated design depths were directly adopted without rounding to approximate the theoretical optimum if the web width was 436 fixed. Minimum points of all the curves which represent the minimum possible embodied carbon for the respective design load for three different optimisation approaches are also marked. Other than the selection of overall beam depth and the web width, the rest of the benchmark designs were performed using the same 440 algorithms used to design prismatic beams.





**Figure 8. Variation of embodied carbon with design midspan depth for three optimisation** 

**approaches when the minimum width of the beams can be (a) 200 mm (b) 150** 

**mm**

445 The curves corresponding to shape optimised beams were generally smooth, but a 446 minimum could be identified. There was a range of midspan depths which exhibited a 447 similar level of embodied carbon around the minimum, indicated by the almost flat 448 regions of the curves. However, the design midspan depths with minimum embodied 449 carbon was notably different for the 18 curves presented in Figure 8, though all the 450 beams had 8 m spans.

## 451 **5.2 Variation of optimum shape**

452 Figures 9 and 10 demonstrate the identified optimum shapes of the beams from TOSF 453 and FOSF respectively. In both shape optimisation approaches, the optimum geometry 454 varied depending on the design load and the selected minimum possible width. The 455 suggested optimum design midspan depth even varied from 500 mm to 750 mm. In all  $456$  the cases for TOSF, optimum designs suggested keeping the web width at the 457 minimum possible throughout the beam. At the end of the beam where shear governs  $458$  the design, the depth profiles were compromised not to increase the web width. In 459 FOSF, the web widths at the ends of the beams were forced to increase so that the 460 depth profile could be parabolic. Since TOSF suggested depth profiles with positive 461 and negative curvatures, FOSF could be treated as the technically feasible approach 462 for shape optimisation.



474 since the optimisation algorithms suggest shallower beams. The deflections at the 475 optimum designs are also marked. Estimated deflections for conventional design 476 depths were around 40% less than the prescribed limit, highlighting the 477 conservativeness of span/depth ratios for deflection control. Shape optimisation always 478 increased the deflection compared to the prismatic beams. Only the shallow extreme of  $479$  the studied range of design depths compromised the deflection limit. The designs with 480 minimum embodied carbon from OPSF and FOSF had satisfied the deflection limit for 481 all the design criteria.



482

483 **Figure 11. Variation of estimated deflections with design midspan depth for OPSF and**  484 **FOSF, compared to a conventional benchmark**

485

## 486 **5.4 Savings of embodied carbon from optimisation**

487 Table 2 presents the savings of embodied carbon from shape optimisation for each 488 design case. The percentage reductions of embodied carbon possible with OPSF,

489 TOSF and FOSF compared to conventional design are noted. Also, the further savings 490 of embodied carbon from TOSF and FOSF compared to OPSF are parallelly reported.

491

492 **Table 2. Minimum embodied carbon from each optimisation approach compared to** 

493 **conventional designs and savings from each optimisation approach**



494

495 To illustrate the differences of the three optimisation approaches adopted in this study, 496 the optimum beam designs suggested for Load Case 1 with a minimum width of 200 497 mm are presented in Figure 12, along with the possible savings of embodied carbon.



 **Figure 12. Shapes resulted from different optimisation approaches and possible savings of embodied carbon for the beam with Load Case C1/ minimum width 200 mm**

# **5.5 Influence of carbon coefficients**

 Figure 13 shows how the optimum design varies for Load Cases C1 and C3 designed with a minimum possible width of 200 mm when the embodied carbon of steel is varied. The optimum design midspan depth of each case is also marked in the same plots. The optimum depth for Load Case C1 varied from 760 mm to 500 mm for FOSF, and 507 from 630 mm to 530 mm for OPSF. The variations were lower for load Case C3. While 508 the optimum depths for OPSF were less sensitive to selected carbon coefficients than FOSF, the curves for OPSF were steeper. It was noticeable that the optimum depth for 510 the OPSF for Load Case C1 remained the same for two scenarios.



 The optimum shapes suggested by FOSF had increased web widths at the end of the beams. Still, the depth and web width at the end of the optimum beams varied for 528 different load cases and selected minimum possible widths.

 In all the cases for OPSF, the optimum designs were either at the kink of the curve or marginally deeper. Therefore, the optimum prismatic beam designs were significantly 531 affected by the selection of the width of the beam. This highlights the importance of limiting the web width of the beams to reduce embodied carbon.

533 | In all three optimisation approaches, optimum midspan depth and geometry depended on the design load and the selection of a minimum possible width. However, the curves 535 of embodied carbon vs design midspan depths for shape optimisation were smooth 536 with mild slopes, even if the minimum points could be identified. There were ranges of depths at which the shape optimised beam designs had similar embodied carbon.

 According to the deflection predictions, prismatic beams with conventional design depths (span/14) have deflection around 60% of the conventional design deflection limit (span/250). Shape optimisation has increased deflection in all cases. However, the predicted deflections of beams with minimum embodied carbon are lower than the conventional design deflection limit in all the cases considered. Hence, the optimisation procedure has not raised concerns about serviceability performance in this study. Therefore, it is worth noting that the optimised designs in all the cases are dominated by Ultimate Limit State. Further, conducting Serviceability Limit State checks with 546 structural mechanics-based calculations help to understand the real extent of design 547 | limitations, rather than limiting the design space with conventional span/depth ratios.

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- **6.2 Reduction of embodied carbon**

 TOSF reduced embodied carbon up to 36% and 45% from conventional prismatic beam designs when the minimum possible widths were 200 mm and 150 mm respectively. Since TOSF resulted in technical and construction challenges, FOSF was adopted which managed to reduce embodied carbon up to 33% and 42% from conventional prismatic beams when minimum widths were limited to 200 mm and 150 mm respectively. However, OPSF could reduce embodied carbon up to 28% and 38% when the minimum possible width is assumed to be 200 mm and 150 mm. TOSF and FOSF could further reduce embodied carbon up to 12% and 8% from OPSF. However, 557 shape optimisation can reduce concrete consumption up to 44% according to the literature review, and the savings of embodied carbon in this study seemed less than the expectation. Therefore, several cases were revisited to assess the reduction of 560 concrete consumption by shape optimisation to evaluate the algorithms in more detail. TOSF and FOSF were observed to reduce concrete consumption up to 30% and 40% 562 respectively for a given midspan depth, though the percentage savings were not consistent across different design criteria. However, optimum midspan depth for prismatic beams and shape optimised beams were not coinciding in almost all the design cases considered in this study. The designs with minimum embodied carbon for prismatic beams and shape optimised beams should be compared with each other to quantify the benefit of shape optimisation, irrespective of the midspan depth. Thus, the percentage reduction of concrete consumption is not directly linked to the saving of 569 embodied carbon from shape optimisation. Due to the need of having positive and negative curvatures in the depth profiles in TOSF, FOSF can be considered as the feasible shape optimisation procedure which could reduce embodied carbon up to 8% 572 compared with OPSF. The interesting outcome is that it seems evident that far greater 573 reductions in carbon footprint are achievable in concrete structures through the prudent analysis of carbon content than by varying the geometry of the structure. The 575 reductions of embodied carbon from all three optimisation algorithms are reduced

 when the design load is increased, due to the higher need for reinforcement for higher loads.

#### **6.3 Sensitivity of the optimum design to carbon coefficients**

 The optimisation algorithms find the beam designs with minimum embodied carbon by 580 trading off the volume of concrete and steel. Thus, the dependability of optimum beam designs on adopted carbon coefficients is to be expected. The optimum design depths 582 for FOSF was noticeably varied with the carbon coefficient of steel. That observation 583 can be justified since the designs with minimum embodied carbon would have more 584 steel and less concrete if the carbon intensity of steel reduced. However, the optimum depths of prismatic beams expressed lesser sensitivity to the carbon coefficients. Furthermore, the variation of embodied carbon with midspan depth was steeper in OPSF than FOSF. As the design midspan increases, the increase in the volume of 588 concrete is higher in prismatic beams since shape optimisation could reduce more concrete from a deeper beam. Therefore, variations of carbon coefficients have a lesser effect on optimum prismatic beam designs than shape optimised beam designs. Furthermore, the variation of embodied carbon with midspan depth of OPSF had kinks where minimums were in most of the cases. Therefore, the optimum designs for prismatic beams were less sensitive for changes in carbon coefficients, than shape optimised beams.

## **6.4 Limitations of the study**

596 The beam geometries suggested by the optimisation algorithms in this study highlighted the importance of minimising the web width of the beams. Though the selected values in this study were associated with fire rating, practically, it may be 599 governed by the spacing of reinforcing bars. Also, the optimisation algorithms 600 suggested different design depths for different cases. Even if the embodied carbon of  beams can be reduced through the proposed method, there might be adverse effects on the overall embodied carbon of the building since it may require higher floor to floor heights.

#### **7 Conclusions**

 The design and construction aspects of concrete beams are scrutinised in this paper to explore the possibilities of minimising embodied carbon. For a given set of structural requirements, a solution with minimum embodied carbon can be identified when the design space is explored. The shape of the beam with minimum possible embodied 610 carbon for a given set of design criteria may have technical and construction objections. Shape optimisation can suggest different geometries for different design criteria, even if the design span is the same. Minimising the web width of the designs is crucial in reducing the embodied carbon of the beams. Such design explorations 614 require deviating from conventional design depths, but the deflection performances of the optimised designs are not compromised. Designs suggested by the shape optimisation algorithms can be very sensitive to adopted carbon coefficients whereas optimising prismatic beams can be less sensitive. Feasible shape optimisation can 618 reduce embodied carbon up to 8% compared with the optimised prismatic beams. However, optimising prismatic beams can save embodied carbon up to 38% compared 620 with conventional design, highlighting the importance of focussing on optimising prismatic beams in practice, and conducting appropriate SLS checks for deflection  $\vert$  rather than relying on span-depth ratio checks.

### **8 Future directions**

















