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## Predicting fuel energy consumption during earthworks

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### ABSTRACT

This research contributes to the assessment of on-site fuel consumption and the resulting carbon dioxide emissions due to earthworks-related processes in residential building projects, prior to the start of the construction phase. Several studies have been carried out on this subject, and have demonstrated the considerable environmental impact of earthworks activities in terms of fuel consumption. However, no methods have been proposed to estimate on-site fuel consumption during the planning stage. This paper presents a quantitative method to predict fuel consumption before the construction phase. The calculations were based on information contained in construction project documents and the definition of equipment load factors. Load factors were characterized for the typical equipment that is used in earthworks in residential building projects (excavators, loaders and compactors), taking into considering the type of soil, the type of surface and the duration of use. We also analyzed transport fuel consumption, because of its high impact in terms of pollution. The proposed method was then applied to a case study that illustrated its practical use and benefits. The predictive method can be used as an assessment tool for residential construction projects, to measure the environmental impact in terms of on-site fuel consumption. Consequently, it provides a significant basis for future methods to compare construction projects.

#### *Keywords:*

construction process, earthworks, construction site, construction equipment, fuel consumption, load factor

### 1. INTRODUCTION

The construction industry's efforts to use resources more sustainably have mainly been directed towards building energy optimization (European Union, 2010) and the sustainability of construction materials (European Union, 2011). Only marginal interest

has been shown in on-site resource management (i.e. energy, water and materials), because construction management has been mainly driven by decisions related to the maximum efficiency of operations, optimizing economic resources, timing, and the use of new technologies (Schaffhauser-Linzatti, 2012; Turkan et al., 2012; Zhang et al., 2013).

Previous research has mainly focused on the quantification and management of operating energy in buildings, while there has been less emphasis on embodied energy related to the construction process, namely on-site construction (Davies et al., 2013). A few studies have addressed the sustainability of the construction process. They demonstrated the existence and importance of the on-site environmental impact of construction projects, and developed criteria, methods and models for identifying and assessing this impact (Zhao et al. 2006; Šelih, 2007; Shen et al., 2011; Gangoells et al., 2009, 2011; Fuertes et al., 2013; Magnusson et al. 2015). However, none of these studies focused on the prediction of earthworks fuel consumption before the execution phase of the construction process.

Other studies (Muttill et al. 2007, 2006; Chau et al., 2007; Wu, 2006) tackled sustainability by proposing statistical and mathematical methods for analyzing data related to pollution issues, but they did not propose an innovative, simple method for predicting earthworks fuel consumption during the planning phase of new residential construction projects.

Energy consumption due to on-site construction activity is also commonly ignored in life cycle assessment (LCA) studies, owing to a lack of available data and the inconsistent use of LCA boundaries (Davies et al., 2013). In other cases, it is simply approximated because the analysis is very complicated or the impacts are thought to be small (Guggemos et al., 2006). The environmental impact of infrastructure and construction may be much lower than the impact of a building's operation. However, when we examine these environmental impacts in a different time frame, or as a function of all buildings, they may be considerable (Sharrard et al., 2008). In general, the construction phase has been found to contribute to 0.4–12.0% of the environmental impact. This figure is low due to the overwhelming impact of the use phase, which is much longer (Guggemos et al., 2005; Junnila et al., 2006; Davies et al., 2013). According to Sharrard et al. (2007), on-site energy usage in the United States construction sector represents 2.6-3.0% of the entire US energy consumption, including passenger vehicles and shipping, while Ahn (2010) reports that consumption related to construction equipment use accounts for 0.8% of Canada's total energy consumption. However, these data underestimate the real consumption, since they do not include the use of on-road trucks.

Sharrard (2007) indicates that gasoline and diesel fuel are responsible for the majority of energy consumption in the construction industry at 62–75% of all use, while electricity varies between 10 and 25% of the total energy consumption.

Substantial differences in the estimation of on-site fuel consumption in construction projects have been reported by Kotte (1996) and Peters and Manley (2012). Although construction equipment manufacturers provide power consumption information in their technical specifications, the challenge is that construction projects may involve complex and unique products and include a wide variety of construction techniques and systems

(Gangoellis et al., 2011). Thus, construction projects involve a great variety of tasks of variable duration, and the use of a range of equipment at different intensities. Other relevant factors are the distributed nature of construction and the subcontracting of activities (Sharrard et al., 2007). A lack of data on subcontractor fuel consumption (Peters and Manley, 2012) and a lack of data verification (Davies et al., 2013) are also highlighted as difficulties in the quantification of on-site energy consumption. Similarly, Kenley and Harfield (2011) stated that methods for measuring carbon dioxide and other greenhouse gas emissions in construction processes have yet to be developed, and Barandica et al. (2013) confirmed that statistics are needed on the fuel consumption of specific machinery.

Several authors have agreed that emissions generated by construction equipment are the main source of on-site environmental impact. Consequently, it is important to mitigate this impact (Ahn et al., 2009; Frey et al., 2010; Kaboli et al. 2012; Carmichael et al., 2012; Barandica et al., 2013). Ahn et al. (2009) proposed a method that integrates the emission model of construction vehicles with the simulation model of construction operations. However, the approach did not use information from project documents. Other authors such as Frey et al. (2010) and Zarotti et al. (2009) focused on on-site fuel consumption. Frey et al. (2010) published a set of field data on non-road equipment, including engine attributes, representative duty cycles, and average fuel use and emission rates, while Zarotti et al. (2009) analyzed fuel consumption during the operating cycle of an excavator, while it was in use with a professional operator. However, only the operating cycle was taken into account in this study; on-site excavator movements and pauses with the engine running, which can take up to half a workday, were not considered. Other studies, such as those by Al-Hasan (2007), Shikata (2009) and Kecojevic and Komljenovic (2011), also focused on earthworks machinery and its operation in relation to fuel consumption and emissions. Kecojevic and Komljenovic (2011) analyzed the impact of engine load conditions on fuel consumption and the subsequent carbon dioxide emissions, with a specific focus on bulldozers. Along the same line, Shikata (2009) indicated that bulldozer fuel consumption is highly dependent on factors such as site geography, weather and the maintenance program. Some recommendations about operation methods were also provided. Al-Hasan (2007) studied the impact of outside temperature on fuel consumption. Thus, although previous research has focused on the development of methods for estimating the fuel consumption of construction equipment, a predictive model based on information contained in construction project documents is still lacking.

Therefore, the aim of this research was to develop an innovative predictive model to estimate in advance (during the planning stage) the on-site fuel consumption and corresponding carbon dioxide emissions arising from earthworks in residential construction projects, using information from project documents. A number of four construction activities were reviewed, along with their corresponding fuel consumption agents. As a result of this review, we decided to focus on earthworks and related fuel consumption agents, because of their high environmental impact. We then developed the proposed method through a careful and in-depth analysis of machines' parameters. Over a hundred pieces of equipment made by the best-known manufacturers were considered and classified into main types. Classification parameters, in particular engine load factors, were identified.

Following this introduction, the second section describes the method adopted in this research. Then, to illustrate a practical application of the model, a case study is reported in the third section. The fourth section discusses the results obtained using the model, and compares them with data collected on-site. The final section reports the conclusions of this research and presents future research issues.

## **2. METHOD**

The method used in this research included the following steps:

1. Identification of earthworks activities and corresponding fuel consumption agents
2. On-site fuel consumption analysis for earthworks activities
  - 2.1 Characterization of fuel equipment
  - 2.2 Characterization of the load factor
3. Analysis of fuel consumption in transport
4. Estimation of on-site fuel consumption related to earthworks in building projects

### **2.1. Identification of earthworks activities and corresponding fuel consumption agents**

In order to identify the fuel consumption related to each earthworks sub-activity, we used a process-oriented approach, similar to that applied by Gangoellis et al. (2009). First, earthworks sub-activities were identified based on the Ente Nazionale Italiano di Unificazione UNI 8290-1 (UNI, 1981), the Classification of Building Elements and Related Sitework of the American Society for Testing and Materials International (ASTM, 2009), and the Spanish database from the Catalan Institute of Construction Technology (ITEC, 2013). The activities that were considered included: (1) stripping overburden, (2) excavations, (3) embankments and (4) compaction (Figure 1).

Secondly, fuel consumption agents were identified, taking into account the Italian Joint Territorial Committee's list of equipment (Comitato Paritetico Territoriale, 2009). More than 100 pieces of equipment were considered and classified under the categories of (1) logistics services, (2) placed equipment, (3) aerial handling machines and (4) mechanized handling machines (Figure 1).

|                      | MECHANIZED HANDLING MACHINES |                          |       |           |        |                   |             |     |
|----------------------|------------------------------|--------------------------|-------|-----------|--------|-------------------|-------------|-----|
|                      | Compaction roller            | Diaphragm wall equipment | Dozer | Excavator | Loader | Pumpcrete machine | Truck mixer | ... |
| <b>EARTHWORKS</b>    |                              |                          |       |           |        |                   |             |     |
| Stripping overburden |                              |                          | ■     |           |        |                   |             |     |
| Excavations          |                              |                          |       | ■         |        |                   |             |     |
| Embankments          |                              |                          |       |           | ■      |                   |             |     |
| Compaction           | ■                            |                          |       |           |        |                   |             |     |

Figure 1. Identification of on-site fuel energy consumption agents used during earthworks.

As a result of this process, a list of earthworks sub-activities and corresponding fuel consumption agents were obtained. The agents included (1) dozers, (2) excavators, (3) loaders and (4) compaction rollers, because these are the typical fuel equipment used during earthworks activities in new residential projects.

## 2.2 On-site fuel energy consumption analysis for earthworks activities

In order to evaluate the real fuel consumption of on-site equipment, a predictive model was developed taking into account the influence of diesel engine features and equipment operation. The fuel consumption required to perform 1 m<sup>3</sup> of any activity can be obtained using Equation 1, whereas the corresponding carbon dioxide emissions can be obtained applying Equation 2.

$$\text{Fuel consumption}_{\text{activity}} \left( \frac{1}{\text{m}^3} \right) = \sum_{i=1}^{i=n} \text{Fuel consumption}_i \cdot \text{Pr}_i \quad (1)$$

$$\text{Carbon dioxide emissions}_{\text{activity}} \left( \frac{\text{kg}}{\text{m}^3} \right) = \text{Fuel consumption}_{\text{activity}} \cdot \text{EF}_{\text{diesel}} \quad (2)$$

where Fuel consumption<sub>i</sub> is the fuel consumed by the equipment i expressed in l/h, Pr<sub>i</sub> represents the productivity of the equipment i expressed in h/m<sup>3</sup>, and EF<sub>diesel</sub> represents the emission factor for diesel. According to the International Organization for Standardization (2012), the emission factor for diesel is assumed to be 2.60 kg of carbon dioxide per liter (following CO<sub>2</sub>/l).

According to the Environmental Protection Agency (EPA, 2010), the fuel consumption of a given piece of equipment can be calculated as follows:

$$\text{Fuel consumption}_i \left( \frac{1}{\text{h}} \right) = P_i \cdot \text{SC}_i \cdot \text{LF}_{ij} \cdot \frac{1}{\rho_{\text{fuel}}} \quad (3)$$

where P<sub>i</sub> represents the power of the equipment i expressed in kW, SC<sub>i</sub> is the specific consumption of the equipment i and depends on the engine's characteristic curve (expressed in kg/kWh), LF<sub>ij</sub> stands for the load factor of the equipment i and refers to

the instantaneous loading of the engine in relation to its maximum capacity (expressed as a %) depending on the activity  $i$  and the soil layer  $j$ , and  $\rho_{\text{fuel}}$  denotes the specific weight of the fuel that ranges from 0.83 to 0.87 kg/l. According to Keckojevic and Komljenovic (2011), the average specific weight of the fuel is assumed to be 0.85 kg/l.

### 2.2.1 Characterization of the fuel equipment

Based on information in the technical specifications, the main equipment types and corresponding classification parameters were defined for each of the fuel consumption agents related to the earthworks activities: (1) dozers, (2) excavators, (3) loaders and (4) compaction rollers. We analyzed 38 models of dozers, and identified three types and three classification parameters for them (Table 1). Similarly, we analyzed 179 models of excavators, including 101 tracked excavators, 28 wheel excavators and 50 mini excavators, and identified five main types and five classification parameters within this category (Table 2). In the case of loaders, an analysis of 121 models, including 37 mini loaders, 75 wheel loaders and 9 truck loaders, allowed us to identify five main types and three classification parameters (Table 3). Finally, six main types and three classification parameters were identified within the main category of compaction rollers, through the analysis of 232 models, including 121 smooth drum rollers, 17 pneumatic rollers, 47 soil compactors and 47 tandem compactors (Table 4).

| Type               | Classification parameters |                 |                           |                 |
|--------------------|---------------------------|-----------------|---------------------------|-----------------|
|                    | Operating weight [kg]     | Blade width [m] | Maximum digging depth [m] | Power [kW]      |
| Small dozer        | 8,200 - 18,300            | 2,71 – 3,22     | 0,33 – 0,59               | 66.00 - 131.00  |
| Medium-sized dozer | 20,000 - 28,100           | 2,99 - 5,77     | 0,5 – 0,76                | 131.00 – 195.00 |
| Big dozer          | 28,700 - 108,000          | 3,94 – 4,99     | 0,57 – 0,8                | 237.00 – 671.00 |

Table 1. Characterization of dozers.

| Type                           | Classification parameters |                           |                 |                                   |                 |
|--------------------------------|---------------------------|---------------------------|-----------------|-----------------------------------|-----------------|
|                                | Operating weight [kg]     | Maximum digging depth [m] | Track width [m] | Bucket capacity [m <sup>3</sup> ] | Power [kW]      |
| Mini tracked excavator         | 880 - 8,400               | 1.13 – 4.15               | 0.73 – 2.99     | 0.02 – 1.05                       | 6.80 - 48.5     |
| Small tracked excavator        | 12,500 - 20,000           | 2.05 – 6.59               | 2.49 – 2.98     | 0.52 – 1.14                       | 60.00 – 95.00   |
| Medium-sized tracked excavator | 20,200 - 35,400           | 6.00 – 14.91              | 2.38 – 3.19     | 0.40 – 2.66                       | 95.00 – 200.00  |
| Big tracked excavator          | 36,300 - 111,000          | 2.15 – 13.40              | 2.49 – 5.06     | 0.47 – 9.93                       | 200.00 – 515.00 |
| Wheel excavator                | 11,300 - 27,300           | 3.90 – 7.05               | 1.91 – 2.75     | 0.44 – 1.7                        | 65.00 – 155.00  |

Table 2. Characterization of excavators.

| Type                      | Classification parameters |                                   |                  |
|---------------------------|---------------------------|-----------------------------------|------------------|
|                           | Operating weight [kg]     | Bucket capacity [m <sup>3</sup> ] | Power [kW]       |
| Mini loader               | 5,630 - 8,450             | 0.23 – 1.80                       | 52.00 - 71.00    |
| Small wheel loader        | 5,160 - 15,928            | 0.80 – 5.00                       | 46.00 – 126.00   |
| Medium-sized wheel loader | 19,425 - 31,244           | 3.00 – 14.00                      | 140.00 – 303.00  |
| Big wheel loader          | 50,144 - 195,434          | 7.70 – 36.00                      | 373.00 – 1092.00 |
| Truck loader              | 3,170 - 29,555            | 0.97 – 3.21                       | 42.00 – 1176.00  |

Table 3. Characterization of loaders.

| Type                     | Classification parameters |                      |                |
|--------------------------|---------------------------|----------------------|----------------|
|                          | Operating weight [kg]     | Compaction width [m] | Power [kW]     |
| Light smooth drum roller | 2,000 - 14,680            | 1.20 – 2.20          | 30.00 - 119.00 |
| Heavy smooth drum roller | 15,000 -32,000            | 2.13 – 2.40          | 98.00 – 190.00 |
| Pneumatic roller         | 8,900 - 27,000            | 1.50 – 2.75          | 60.00 – 132.00 |
| Soil compactor           | 7,630 – 37,900            | 2.13 – 4.39          | 75.00 – 330.00 |
| Vibratory soil compactor | 5,800 – 20,100            | 1.67 – 2.14          | 48.00 – 160.00 |
| Tandem vibratory roller  | 6,650 – 14,000            | 1.13 – 2.13          | 51.00 – 100.00 |

Table 4. Characterization of compaction rollers.

Then, specific consumption, measured in kg/kWh, was assigned to each type of equipment, according to the characteristic curves of the equipment's engine. When the specific consumption of a given piece of equipment could not be found because the engine's characteristic curve was not available, a value of 0.25 Kg/kWh was assumed by calculating a rounded-up average of values found in the existing literature (Bocchi 1987, CEQA Handbook 1993, Nebraska Tractor Test Laboratory 2010, Picco 2011).

### 2.2.2 Characterization of the load factor

Typical load factors, understood as the average proportion of the equipment power that is actually used, were identified based on existing performance handbooks. Engine load factors depend on the machine model. Therefore, manufacturers' guides were analyzed to estimate the load factors and identify their qualitative variables. These documents usually provide three typical work application descriptions for each piece of equipment (named low, medium and high), and a load factor guide with a load factor range value based on the application description. We only considered qualitative variables related to construction project information in the documents. When the equipment load factor could not be found because performance handbooks were not available, a value of 59% was assumed (EPA, 2010). For the same reason, and because of limited empirical research, Ahn and Lee (2013) assumed a constant load factor for each piece of equipment.

In the following paragraphs, we present an in-depth analysis of the load factor for the main earthworks equipment. The main equipment and related types were chosen considering the typical organization of a medium-sized construction company and its fleet of machines. Dozers were excluded, because their activity is normally done by loaders. Thus, the items of equipment chosen were: medium-sized tracked excavator, small wheel loader, and vibratory soil compactor. For the medium-sized tracked

excavator, we provide a detailed description of the method used to identify load factor values. For the vibratory soil compactor and small wheel loader we only provide a summary, since the method for deriving the load factors is similar for each equipment type.

### 2.2.2.1 Load factor for a medium-sized tracked excavator

For this type of equipment, the technical manuals that were consulted report that the load factor depends on two characteristic variables: the type of soil, and the duration of the daily work schedule. According to the Caterpillar Performance Handbook (2013) and the Komatsu Specifications & Application Handbook (2009), two main qualitative variables are significant in order to identify a homogeneous range of load factors (Table 5).

| <b>Load Factor</b> | <b>Type of soil</b>                   | <b>Duration of use</b>                           | <b>Value</b> |
|--------------------|---------------------------------------|--|--------------|
| Low                | Sandy soil and low density material   | Digging less than 60% of the daily work schedule | 20% - 40%    |
| Medium             | Clay soil and medium density material | Digging 60-85% of the daily work schedule        | 40% - 60%    |
| High               | Rocky soil and high density material  | Digging more than 85% of the daily work schedule | 60% - 80%    |

Table 5. Identification of load factor ranges for a medium-sized tracked excavator, depending on type of soil and duration of use.

Source: adapted from the Caterpillar Performance Handbook (2013) and the Komatsu Specifications & Application Handbook (2009).

In this approach, as described in Gottfried (2013), Sciesi et al. (2013) and the Caterpillar Performance Handbook (2013), the different types of soils were associated with a quantitative variable, represented by the corresponding material densities (considered in bank). The different types of soils were then clustered into three groups using a centroid-based clustering analysis method that assigns each density value to the closest centroid, based on a Euclidean distance measurement.

Figure 2 represents the material densities that were identified, and the corresponding groups of load factor ranges: low, medium and high.

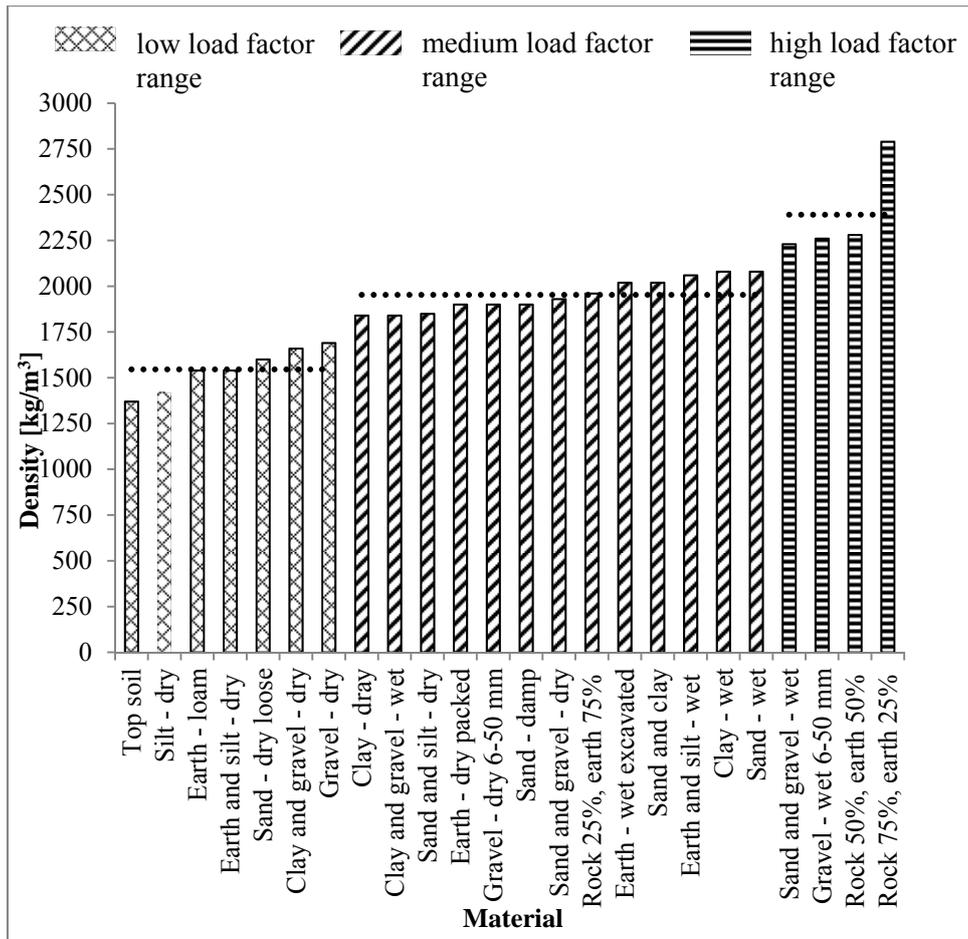


Figure 2. Identification of load factor ranges according to the material density. The hatched line represents the cluster mean.

Having identified each material density in its proper range, a specific load factor was calculated for each material using a regression line of load factors, based on the ranges reported in the technical manuals.

Table 6 represents the final calculated load factor values, depending on material density.

| Type of soil          | Material density in bank [kg/m <sup>3</sup> ] | Load factor range | Cluster mean | Load factor |
|-----------------------|---|-------------------|--------------|-------------|
| Top soil              | 1370  | L                 | 1545.71      | 20%         |
| Silt - dry            | 1420  | L                 | 1545.71      | 23%         |
| Earth - loam          | 1540  | L                 | 1545.71      | 26%         |
| Earth and silt - dry  | 1540  | L                 | 1545.71      | 29%         |
| Sand - dry loose      | 1600  | L                 | 1545.71      | 31%         |
| Clay and gravel - dry | 1660  | L                 | 1545.71      | 34%         |
| Gravel - dry          | 1690  | L                 | 1545.71      | 37%         |
| Clay - dry            | 1840  | M                 | 1952.31      | 40%         |
| Clay and gravel - wet | 1840  | M                 | 1952.31      | 42%         |
| Sand and silt - dry   | 1850  | M                 | 1952.31      | 43%         |
| Earth - dry packed    | 1900  | M                 | 1952.31      | 45%         |
| Gravel - dry 6-50 mm  | 1900  | M                 | 1952.31      | 47%         |
| Sand - damp           | 1900  | M                 | 1952.31      | 48%         |
| Sand and gravel - dry | 1930  | M                 | 1952.31      | 50%         |
| Rock 25%, earth 75%   | 1960  | M                 | 1952.31      | 52%         |
| Earth - wet excavated | 2020  | M                 | 1952.31      | 53%         |
| Sand and clay         | 2020  | M                 | 1952.31      | 55%         |
| Earth and silt - wet  | 2060  | M                 | 1952.31      | 57%         |
| Clay - wet            | 2080  | M                 | 1952.31      | 58%         |
| Sand - wet            | 2080  | M                 | 1952.31      | 60%         |
| Sand and gravel - wet | 2230  | H                 | 2390.00      | 65%         |
| Gravel - wet 6-50 mm  | 2260  | H                 | 2390.00      | 70%         |
| Rock 50%, earth 50%   | 2280  | H                 | 2390.00      | 75%         |
| Rock 75%, earth 25%   | 2790  | H                 | 2390.00      | 80%         |

Table 6. Identification of load factor values, depending on type of soil.

At the end of this process, we had 24 load factor and material density values available. The relationship between the two variables was then estimated by a unique exponential regression line, as shown in Figure 3 and reported in Equation 4.

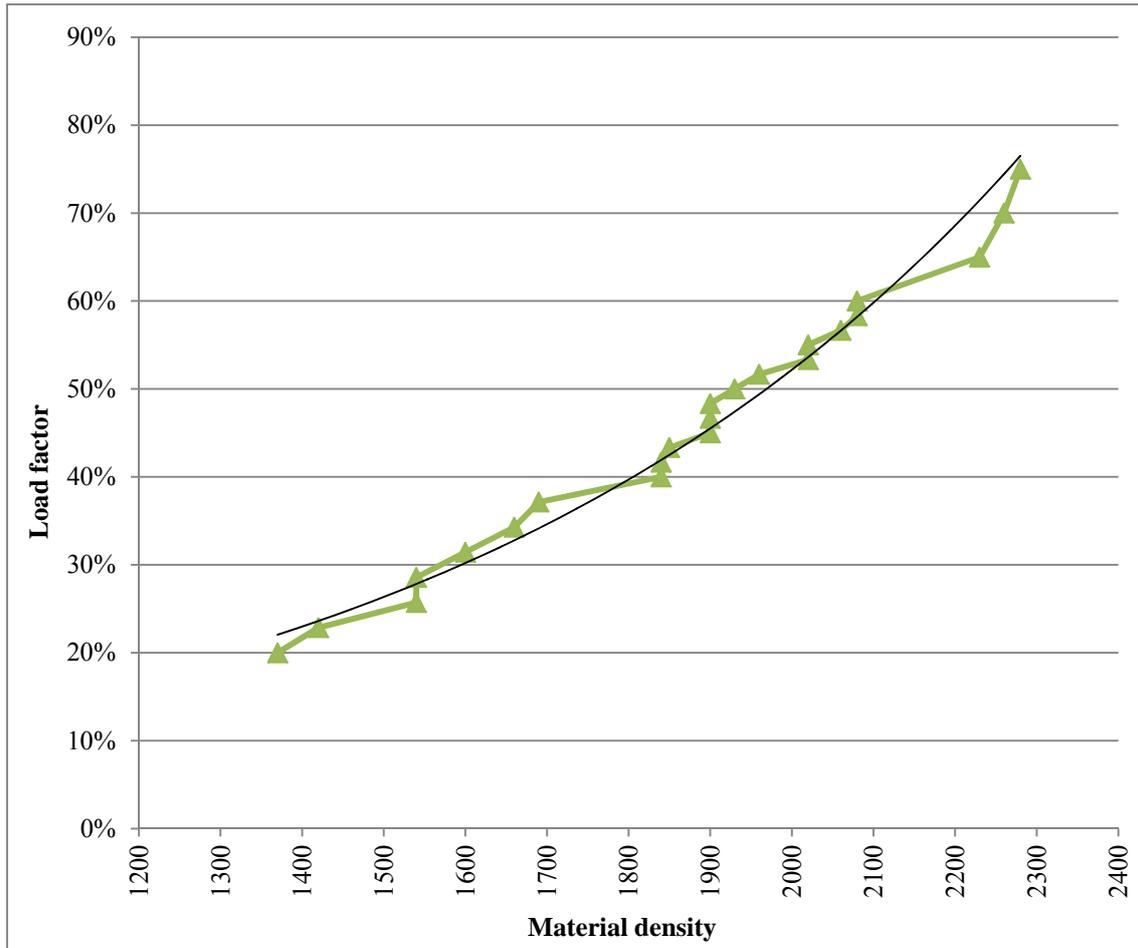


Figure 3. Relationship between load factor and material density.

$$LF_1 = = 0.0339e^{0.0014 \cdot D} \quad (4)$$

Where the dependent variable  $LF_1$  represents the load factor (expressed as a %) and  $D$  stands for the material density expressed in  $\text{kg/m}^3$ . The coefficient of determination ( $R^2$ ) was found to be 0.980 for values of material density within the domain  $[1,370 \text{ kg/m}^3 - 2,280 \text{ kg/m}^3]$ . Based on the reported measurement error, the estimated equation shows good resilience.

The same approach was used to identify the load factor, depending on the duration of use. First, a typical day's work schedule of 8 hours was divided into increments of 10 minutes, from 0 minutes to 480 minutes. Taking into account Table 5, the corresponding percentage of the work schedule was associated with each value and with the corresponding load factor range (low, medium and high). Then, assuming a linear relationship between the duration of use and the load factor, a specific load factor was calculated for each duration of use value. There were 49 load factor values in total.

The relationship between the load factor and the duration of use was found to be represented by Figure 4 and the corresponding Equation 5, with a coefficient of

determination ( $R^2$ ) of 0.987 for duration of use values within the domain [0 minutes - 480 minutes].

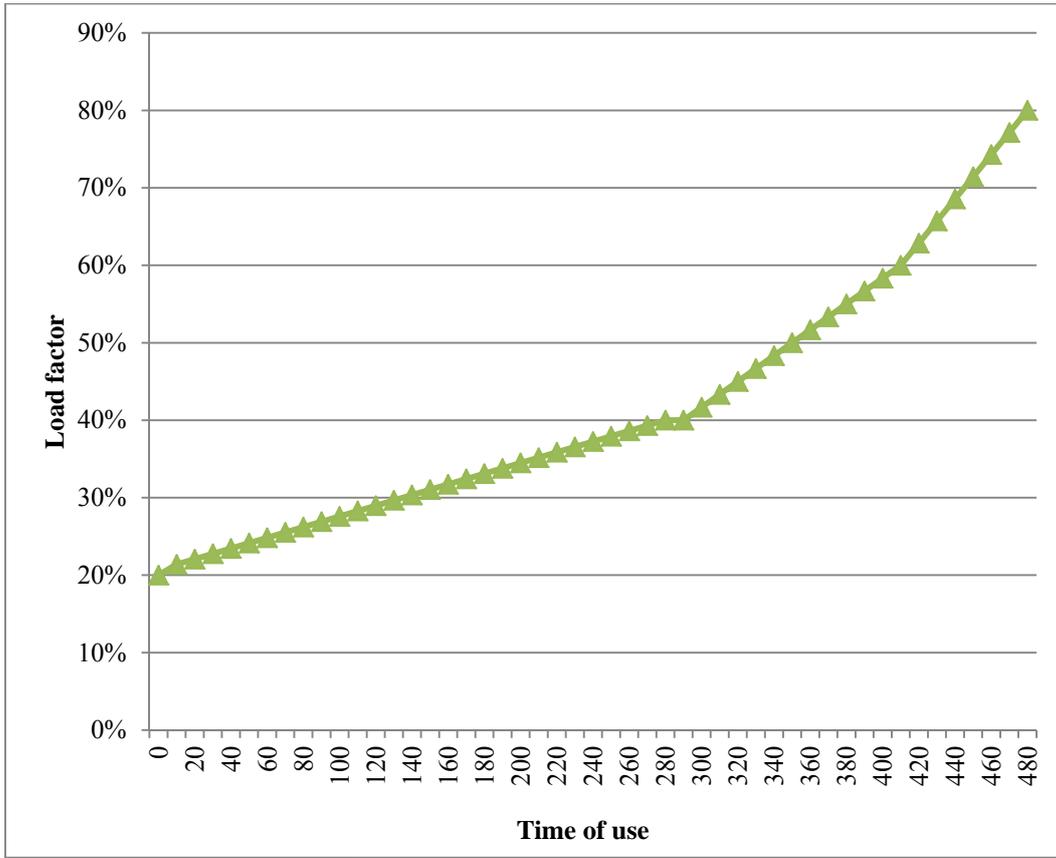


Figure 4. Relationship between load factor and duration of use.

$$LF_2 = 0.2007e^{0.0262 \cdot T} \quad (5)$$

Where the dependent variable  $LF_2$  represents the load factor (expressed as a %), and the independent variable  $T$  stands for the duration of use expressed in minutes.

Therefore, the fuel consumption related to the excavation of  $1 \text{ m}^3$  with a medium-sized tracked excavator can be obtained as follows:

$$\text{Fuel consumption}_{\text{excavation}} \left( \frac{1}{\text{m}^3} \right) = \sum_{i=1}^n P_i \cdot SC_i \cdot \frac{\frac{\sum_{j=1}^n W_j \cdot (LF_{ij1})}{\sum_{j=1}^n W_j} + LF_{i2}}{2} \cdot \frac{1}{\rho_{\text{fuel}}} \cdot Pr_i \quad (6)$$

where  $P_i$  represents the power of the equipment  $i$  expressed in kW, and  $SC_i$  is the specific consumption of the equipment  $i$  and depends on the engine's characteristic curve (expressed in kg/kWh).  $W_j$  is the indicator distinguishing each soil layer in relation to the prevalent material densities.  $W_j$  represents the mean thickness of the identified layers (m).  $LF_{ij1}$  is the load factor depending on the material density of each soil layer  $j$  and can be obtained by means of Equation 5, and  $LF_{i2}$  depends on the duration of use and can be obtained with Equation 6.  $Pr_i$  represents the productivity of the equipment  $i$  expressed in  $\text{h}/\text{m}^3$ , and  $\rho_{\text{fuel}}$  denotes the specific weight of the fuel.

### 2.2.2.2 Small wheel loader load factor

For this type of equipment, the load factor depends on the type of soil, as in the case of excavators, and on the type of surface. Thus, according to the Caterpillar Performance Handbook (2013), two quantitative variables were distinguished (Table 7).

| Load Factor | Type of soil                          | Type of surface                           | Value     |
|-------------|---------------------------------------|---|-----------|
| Low         | Sandy soil and low density material   | Smooth surfaces with minimal grade        | 15% - 25% |
| Medium      | Clay soil and medium density material | Normal surfaces with slight adverse grade | 25% - 35% |
| High        | Rocky soil and high density material  | Poor surfaces with adverse grade          | 35% - 45% |

Table 7. Identification of the load factor ranges for a medium-sized wheel loader, depending on type of soil and type of surface.

Source: adapted from the Caterpillar Performance Handbook (2013).

We used the same method as for the excavator to calculate the load factors of specific small wheel loaders. As in the case of the excavators, different types of soils were associated with a quantitative variable, which was represented by the corresponding material densities (considered to be loose). For a total of 24 load factor values, the relationship between the load factor and the material density was found to be represented by Equation 7.

$$LF_1 = 0.05862e^{0.00101 \cdot D} \quad (7)$$

Where the dependent variable  $LF_1$  represents the load factor (expressed as a %), and  $D$  stands for the material density expressed in  $\text{kg/m}^3$ . The coefficient of determination ( $R^2$ ) was found to be 0.984 for values of material density within the domain [ $950 \text{ kg/m}^3$ - $2,020 \text{ kg/m}^3$ ].

The same approach was used to identify the load factor, depending on the type of surface. Three different ranges of surface slopes were identified, taking into consideration Gottfried (2013): a grade of 0 to 10, a grade of 10 to 20, and a grade of 20 to 35. Taking into account Table 7, the corresponding load factor range (low, medium and high) was associated with each value. Then, a specific load factor was calculated for each grade value, to obtain a total of 36 load factor values.

The relationship between the load factor and the type of surface was found to be represented by Equation 8, with a coefficient of determination ( $R^2$ ) of 0.991 for grade values within the domain [ $0^\circ$  -  $35^\circ$ ].

$$LF_2 = 0.00868 \cdot G + 0.15333 \quad (8)$$

Where the dependent variable  $LF_2$  represents the load factor (expressed as a %) and the independent variable  $G$  stands for the grade of the slope.

Finally, the fuel consumption related to embankments of  $1 \text{ m}^3$  with a small wheel loader can be obtained as follows:

$$\text{Fuel consumption}_{\text{embankments}} \left( \frac{1}{\text{m}^3} \right) = \sum_{i=1}^n P_i \cdot SC_i \cdot \frac{LF_1 + LF_2}{2} \cdot \frac{1}{\rho_{\text{fuel}}} \cdot Pr_i \quad (9)$$

where  $P_i$  represents the power of the equipment  $i$  expressed in kW, and  $SC_i$  is the specific consumption of the equipment  $i$  and depends on the engine's characteristic curve (expressed in kg/kWh).  $LF_1$  is the load factor depending on the material density for each soil layer  $j$  and can be obtained by means of Equation 7, and  $LF_2$  depends on the type of surface and can be obtained with Equation 8.  $Pr_i$  represents the productivity of the equipment  $i$  expressed in  $\text{h}/\text{m}^3$ , and  $\rho_{\text{fuel}}$  denotes the specific weight of the fuel.

### 2.2.2.3 Vibratory soil compactor load factor

According to the Caterpillar Performance Handbook (2013), the load factor of the vibratory soil compactor depends on the type of soil and the type of surface. Thus, two quantitative variables were distinguished (Table 8).

| Load Factor | Type of soil   | Type of surface                    | Value      |
|-------------|--|------------------------------------|------------|
| Low         | Soil not compacted to high density                       | Level ground, minimal slope        | 20% - 40%  |
| Medium      | Granular soil compacted to density                       | Working on slopes greater than 5%  | 40% - 60%  |
| High        | Cohesive soil with padded drum and high moisture content | Working on slopes greater than 15% | 60% - 100% |

Table 8. Identification of the load factor ranges for a vibratory soil compactor, depending on the type of soil and type of surface.

Source: adapted from the Caterpillar Performance Handbook (2013).

We proposed the same method as that used for previously analyzed equipment. As in the case of the loaders, the load factor range (low, medium and high) was defined for each material density, which was considered loose. With a total number of 24 load factor values, the relationship between the load factor and the material density was found to be represented by Equation 10.

$$LF_1 = 0.05173e^{0.00142 \cdot D} \quad (10)$$

Where the dependent variable  $LF_1$  represents the load factor (expressed as a %), and  $D$  stands for the material density expressed in  $\text{kg}/\text{m}^3$ . The coefficient of determination ( $R^2$ ) was found to be 0.992 for values of material density within the domain  $[950 \text{ kg}/\text{m}^3 - 2,020 \text{ kg}/\text{m}^3]$ .

The same approach was used to identify the load factor depending on the type of surface. Three different ranges of surface slopes were identified, considering the Caterpillar Performance Handbook (2013) and Gottfried (2013): a grade of 0 to 3, a grade of 3 to 9 and a grade of 9 to 35. Taking into account Table 8, we associated the corresponding load factor range (low, medium and high) with each value. Then, a specific load factor was calculated for each grade value, and obtained a total of 36 load factor values.

The relationship between the load factor and the type of surface was found to be represented by Equation 11, with a coefficient of determination ( $R^2$ ) of 0.995 for grade values within the domain  $[0^\circ - 35^\circ]$ .

$$LF_2 = 0.21032 \cdot G^{0.43210} \quad (11)$$

Where the dependent variable  $LF_2$  represents the load factor (expressed as a %), and the independent variable  $G$  stands for the grade of the slope.

Therefore, the fuel consumption related to the compaction of  $1 \text{ m}^3$  with a vibratory soil compactor can be obtained as follows:

$$\text{Fuel consumption}_{\text{compaction}} \left( \frac{1}{\text{m}^3} \right) = \sum_{i=1}^n P_i \cdot SC_i \cdot \frac{LF_1 + LF_2}{2} \cdot \frac{1}{\rho_{\text{fuel}}} \cdot Pr_i \quad (12)$$

where  $P_i$  represents the power of the equipment  $i$  expressed in kW, and  $SC_i$  is the specific consumption of the equipment  $i$  and depends on the engine's characteristic curve (expressed in kg/kWh).  $LF_1$  is the load factor depending on the material density of each soil layer  $j$  and can be obtained by means of Equation 10, and  $LF_2$  depends on the type of surface and can be obtained with Equation 11.  $Pr_i$  represents the productivity of the equipment  $i$  expressed in  $\text{h}/\text{m}^3$ , and  $\rho_{\text{fuel}}$  denotes the specific weight of the fuel.

### 2.3 Transport fuel consumption analysis

Along the same lines as Cabello Eras et al. (2013), the fuel consumed in the transport of excavated soil can be calculated as follows:

$$\text{Fuel consumption}_{\text{transport}} \left( \frac{1}{\text{m}^3} \right) = \sum_{i=1}^n \frac{K \cdot R_i \cdot Ic_i}{C_i} \quad (13)$$

where  $K$  is the coefficient of the difference between the fuel consumption of an empty truck and a fully loaded one ( $K= 1.7$ ),  $R_i$  is the mean distance travelled by each truck  $i$  from the construction site to the waste disposal area expressed in km,  $Ic_i$  represents the fuel consumption indicator of the fully loaded truck  $i$  expressed in l/km, and  $C_i$  is the capacity of the truck  $i$  expressed in  $\text{m}^3$ .

As for fuel consumption agents of excavation activity, we defined the main truck types and the corresponding classification parameters on the basis of the information in the technical specifications. Five main types and three classification parameters were identified through the analysis of 83 models, including 63 on-road trucks, and 20 off-road trucks (Table 9).

| Type                                 | Classification parameters |                               |            |
|--------------------------------------|---------------------------|-------------------------------|------------|
|                                      | Operating weight [kg]     | Speed at maximum power [km/h] | Power [kW] |
| Light on-road truck                  | 3,300 - 7,000             | 126 - 184                     | 70 - 150   |
| Medium-sized on-road truck           | 6,500 - 18,000            | 131.6 - 161.9                 | 137 - 152  |
| Heavy on-road truck                  | > 16,000                  | 81.9 - 117.1                  | 228 - 560  |
| Medium-sized off-road truck off-road | 11,500 - 15,000           | 106.3 - 106.8                 | 118 - 235  |
| Heavy off-road truck                 | > 16,000                  | 66.9 - 113                    | 265 - 534  |

Table 9. Characterization of trucks.

#### 2.4 Estimation of the on-site fuel consumption related to earthworks in building projects

The fuel consumption related to earthworks, expressed in  $l/m^3$  of excavated soil, can be obtained according to Equation 14, given below.

$$\begin{aligned} & \text{Fuel consumption}_{\text{earthworks}} \\ &= \text{Fuel consumption}_{\text{excavation}} + \text{Fuel consumption}_{\text{embankment}} + \text{Fuel consumption}_{\text{compaction}} \\ &+ \text{Fuel consumption}_{\text{transport}} \end{aligned}$$

Where  $\text{Fuel consumption}_{\text{excavation}}$ ,  $\text{Fuel consumption}_{\text{embankments}}$  and  $\text{Fuel consumption}_{\text{compaction}}$  represent the fuel consumed during excavation activities expressed in  $l/m^3$  of excavated soil, and  $\text{Fuel consumption}_{\text{transport}}$  represents the fuel consumed during the transport of the excavated soil expressed in  $l/m^3$ .

In order to calculate the total project consumption, we need to know the volume of soil, and differentiate between the soil volume in bank that is excavated, and the loose soil volume that is used to fill a part of the dig, and then compacted or transported to the waste disposal area. Table 10 represents the different type of soils with the two material densities, the consequent % of soil expansion, and the material load factor. These values have been identified according to Sciesi et al. (2013), Gottfried (1995) and the Caterpillar Performance Handbook (2013).

| Type of soil | Material density in bank [ $kg/m^3$ ] | Material density loose [ $kg/m^3$ ] | Soil expansion [%] | Material load factor |
|--------------|---------------------------------------|-------------------------------------|--------------------|----------------------|
| Clay - dry   | 1840                                  | 1480                                | 24%                | 0.80                 |
| Clay - wet   | 2080                                  | 1660                                | 25%                | 0.80                 |

| Type of soil          | Material density in bank [kg/m <sup>3</sup> ] | Material density loose [kg/m <sup>3</sup> ] | Soil expansion [%] | Material load factor |
|-----------------------|---|---|--------------------|----------------------|
| Clay and gravel - dry | 1660  | 1420  | 17%                | 0.86                 |
| Clay and gravel - wet | 1840  | 1540  | 19%                | 0.84                 |
| Earth - dry packed    | 1900  | 1510  | 26%                | 0.79                 |
| Earth - loam          | 1540  | 1250  | 23%                | 0.81                 |
| Earth - wet excavated | 2020  | 1600  | 26%                | 0.79                 |
| Earth and silt - dry  | 1540  | 1245  | 24%                | 0.81                 |
| Earth and silt - wet  | 2060  | 1601  | 29%                | 0.78                 |
| Gravel - dry          | 1690  | 1510  | 12%                | 0.89                 |
| Gravel - dry 6-50 mm  | 1900  | 1690  | 12%                | 0.89                 |
| Gravel - wet 6-50 mm  | 2260  | 2020  | 12%                | 0.89                 |
| Rock 25%, earth 75%   | 1960  | 1570  | 25%                | 0.80                 |
| Rock 50%, earth 50%   | 2280  | 1720  | 33%                | 0.75                 |
| Rock 75%, earth 25%   | 2790  | 1960  | 42%                | 0.70                 |
| Sand - damp           | 1900  | 1690  | 12%                | 0.89                 |
| Sand - dry loose      | 1600  | 1420  | 13%                | 0.89                 |
| Sand - wet            | 2080  | 1840  | 13%                | 0.88                 |
| Sand and clay         | 2020  | 1600  | 26%                | 0.79                 |
| Sand and gravel - dry | 1930  | 1720  | 12%                | 0.89                 |
| Sand and gravel - wet | 2230  | 2020  | 10%                | 0.91                 |
| Sand and silt - dry   | 1850  | 1646  | 12%                | 0.89                 |
| Silt - dry            | 1420  | 1136  | 25%                | 0.80                 |
| Top soil              | 1370  | 950   | 44%                | 0.69                 |

Table 10. Characterization of soils.

### 3. CASE STUDY AND DICUSSSION OF THE RESULTS

The case study focuses on a new-start residential construction project located in Milan (Italy). The building has 8 aboveground floors and 3 underground floors, and a total floor area of 4,786 m<sup>2</sup> (1,792 m<sup>2</sup> above ground and 2,994 m<sup>2</sup> underground). The main construction work included the diaphragm walls needed to support the soil, excavations (total volume 11,415.76 m<sup>3</sup>), embankments (total volume 294 m<sup>3</sup>), a reinforced concrete structure (pillars and beams) and mixed slabs with joists and hollows for the aboveground floors. The underground floors were designed with prestressed predalles slabs. According to the project document “Budget”, the embankments were characterized by a total volume of soil of 294 m<sup>3</sup> divided into 5 different layers of about 20 cm of depth, while part of the excavated soil (11,121.76 m<sup>3</sup>) was transported to an inert waste dump located 25 km from the construction site. The construction project document entitled “Geological study and geotechnical characterization of the foundation soils” described two prevalent soil layers: a dry, silty sand from 0 to 3 m deep, and a layer with compact and fine sand with gravel from 3 to 10 m deep. The soil layer, which was classified as top soil, was 1 m deep and was excavated and then embanked and compacted to create the logistics area outside the building area. The drawings for the construction project indicated that the excavation had a constant section. Figures 5 and 6 represent the general drawing of the ground floor and a section of the building, respectively.

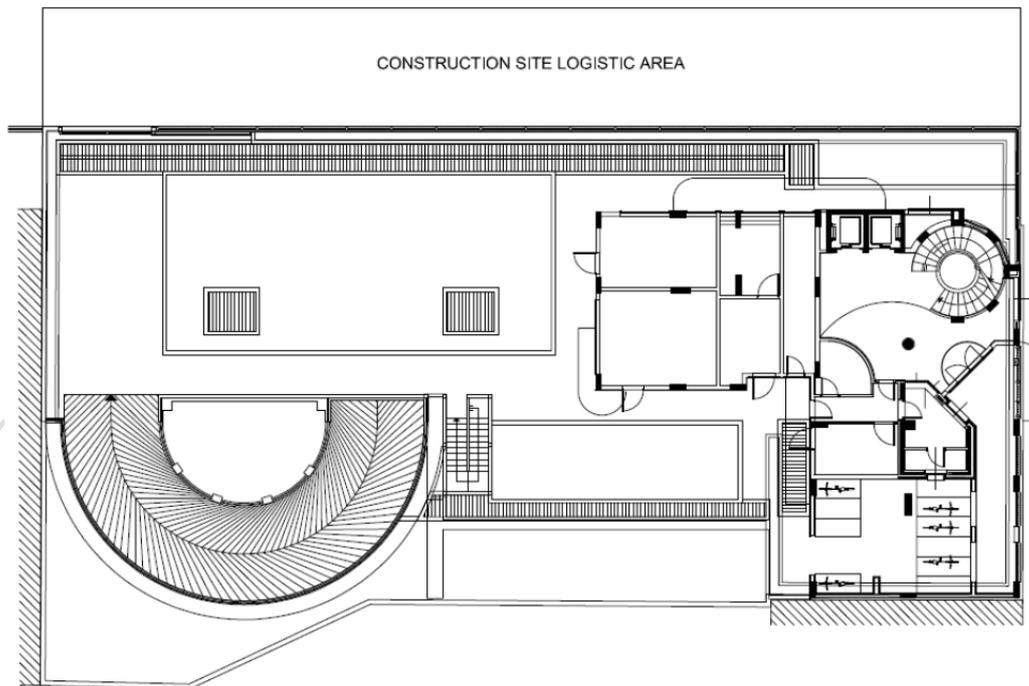


Figure 5. General drawing of the ground floor of the building.

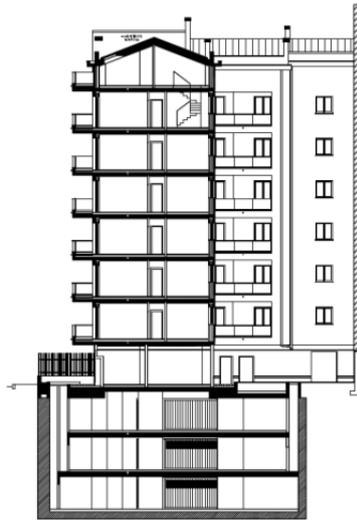


Figure 6. Section of the building.

During earthworks and according to the health and safety plan, four types of equipment were planned to be used on-site, including two medium-sized tracked excavators with hydraulic shovels, one small wheel loader, one vibrator soil compactor and medium-sized on-road trucks. From the progress schedule of the general contractor works, the planned duration was found to be 780 days. According to the same document, excavations were planned to last 30 days, while embankment and compaction were planned to last 2 days. The duration of use of the medium-sized excavators was found to be the entire daily work schedule of the days planned for their activity (40 days). The duration of use of the small wheel loader was the entire daily work schedule on the days planned for its activity (2 days), which was the same duration of use as the vibratory soil compactor.

According to the Caterpillar Performance Handbook (2013), the excavator productivity expressed in  $\text{h}/\text{m}^3$  is  $0.007 \text{ h}/\text{m}^3$  for excavator A, and  $0.008 \text{ h}/\text{m}^3$  for excavator B, taking into account that the time considered is the equipment's average cycle time and a half, expressed in minutes, given for each machine size class from the Caterpillar Performance Handbook (2013), and the equipment's heaped bucket capacity, expressed in  $\text{m}^3$ , is taken from the technical specifications. The bucket fill factor, expressed as a percentage that depends on the excavated soil materials in the case study, is 100% (Caterpillar Performance Handbook, 2013). The job efficiency estimator for the case study, expressed as a percentage and considering the required breaks for operators (10 minutes per working hour), is 83%. To identify loader productivity expressed in  $\text{h}/\text{m}^3$ , we used the same equation as that for excavators (Caterpillar Performance Handbook, 2013). A fill factor of 100% and an efficiency of 83% were considered. Finally, the loader productivity that was calculated is  $0.008 \text{ h}/\text{m}^3$ . According to the Caterpillar Performance Handbook (2013), the vibratory soil compactor productivity expressed in  $\text{h}/\text{m}^3$  is  $0.012 \text{ h}/\text{m}^3$ , taking into account that the number of machine passes to achieve compaction is assumed to be 6, the compacted width per pass expressed in meters of the equipment is 2.13 m as described in the technical specifications, the average speed expressed in kilometers per hour of the equipment is 3 km/h as described in the technical specifications, the compacted thickness of soil is 200 mm as determined in the

project document “Budget” and the number of identified layers is 5, from the same document. Table 10 summarizes the main characteristics of the analyzed equipment.

| Equip-<br>ment | Type                                 | Operating<br>weight [kg] | Power<br>[kW] | Cycle<br>time<br>[min] | Heaped<br>bucket<br>capacity<br>[m <sup>3</sup> ] | Produc-<br>tivity<br>[h/m <sup>3</sup> ] |
|----------------|--------------------------------------|--------------------------|---------------|------------------------|---|--|
| A              | Medium-sized<br>tracked<br>excavator | 28,700                   | 140.00        | 0.38                   | 1.10  | 0.007                                    |
| B              | Medium-sized<br>tracked<br>excavator | 21,000                   | 122.00        | 0.42                   | 1.10  | 0.008                                    |
| D              | Small wheel<br>loader                | 12,868                   | 105.00        | 0.75                   | 1.90  | 0.008                                    |
| E              | Vibratory soil<br>compactor          | 10,555                   | 98.00         |                        |   | 0.012                                    |
| F              | Medium-sized<br>on-road truck        | 12,500                   | 137.00        |                        | 20.00   |  |

Table 11. Main characteristics of the earthmoving equipment.

Considering the excavation activity, and applying Equation 4, the load factor of the first layer ( $LF_1$ ) was found to be 45%, whereas the load factor for the second layer ( $LF_1$ ) was found to be 77%. When we applied Equation 5, the load factor ( $LF_2$ ) was found to be 70%.

The excavation type was identified on the basis of the drawings in the architectural design. Excavation was found to be with a constant section, and  $W_j$ , represented by the thickness of the identified layers, were defined.  $W_j$  for the first layer with dry silty sand (0-3 m deep) was defined as 3,  $W_j$  for the second layer with compact and fine sand with gravel (3-10 m deep) was defined as 7.

We used Equation 6 to calculate the fuel consumption of the two medium-sized tracked excavators. The calculated fuel consumption was 0.194 l/m<sup>3</sup> for excavator A, and 0.189 l/m<sup>3</sup> for excavator B. Considering the duration of use of each excavator and the corresponding dug volume (data taken from the document “Construction site journal”), the fuel consumption was found to be 2,210.65 l for excavator A, and 1,051.01 l for excavator B. The total project fuel consumption for excavations was found to be 3,261.6 liters, with a corresponding carbon dioxide emission of 8,480.33 kg of CO<sub>2</sub>.

Considering the embankment activity, we applied Equation 7 and found a load factor ( $LF_1$ ) of 15% (top soil). When we applied Equation 8, the load factor ( $LF_2$ ) was found to be 15% (0 grade). We used Equation 9 to calculate the fuel consumption of the small wheel loader, which was found to be 0.04 l/m<sup>3</sup>. Considering the volume of soil, and data from the “Budget”, the total fuel consumption for embankment in the project was found to be 10.80 liters, with a corresponding carbon dioxide emission of 28.07 kg of CO<sub>2</sub>.

Considering compaction activity, we applied Equation 10 and found a load factor ( $LF_1$ ) of 20% (top soil). When we applied Equation 11, the load factor ( $LF_2$ ) was found to be 20% (0 grade). Equation 12 was applied to calculate the fuel consumption of the compactor and we found a value of  $0.07 \text{ l/m}^3$ . The total project fuel consumption for compaction was found to be 19.86 liters, with a corresponding carbon dioxide emission of 51.62 kg of  $\text{CO}_2$ .

We used Equation 13 to calculate the fuel consumption of the trucks. The mean distance ( $R_i$ ) travelled by trucks from the construction site to the waste residue area, identified by the general-contractor in the project document “Budget”, was found to be 25 km; while a truck capacity of about  $20 \text{ m}^3$  was found in the technical specifications of the equipment. The volume of soil excavated that had been in bank and had to be transported to the waste disposal area was 11,121.76. Considering the soil expansion of the two prevalent identified layers (see Table 9), we calculated that the trucks would transport  $3,736.91 \text{ m}^3$  of dry silty sand soil and  $8,563.76 \text{ m}^3$  of compact and fine sand with gravel. Therefore, the value of fuel required to transport the soil was calculated as 7,841.67 l, with a corresponding carbon dioxide emission of 20,388.35 kg of  $\text{CO}_2$ .

In conclusion, the total fuel consumption of earthworks activities caused by earthmoving equipment and trucks in the case study was calculated as 11,133.99 liters, with a corresponding carbon dioxide emission of 28,948.37 kg of  $\text{CO}_2$ . Table 12 represents the final results of fuel consumption and the corresponding carbon dioxide emission for earthmoving equipment in the case study.

| Equipment                    | Typology                 | Fuel consumption [l/m <sup>3</sup> ] | Total fuel consumption [l] | Total CO <sub>2</sub> Emission [kg] |
|------------------------------|--------------------------|--------------------------------------|----------------------------|-------------------------------------|
| A                            | Medium tracked excavator | 0,194                                | 2.210,65                   | 5.747,69                            |
| B                            | Medium tracked excavator | 0,189                                | 1.051,01                   | 2.732,64                            |
| C                            | Small wheel loader       | 0,04                                 | 10,80                      | 28,07                               |
| D                            | Vibratory soil compactor | 0,07                                 | 19,86                      | 51,62                               |
| E                            | Medium truck on-road     | 0,64                                 | 7.841,67                   | 20.388,35                           |
| <b>Earthmoving equipment</b> |                          |                                      | <b>11.133,99</b>           | <b>28.948,37</b>                    |

Table 12. Final results of fuel consumption and corresponding carbon dioxide emission for earthmoving equipment in the case study.

We then compared predictive data and data from on-site monitoring and surveys. As observed during on-site inspections and confirmed by previous studies (Sharrard et al., 2007; Peters and Manley, 2012; Davies et al., 2013), reports or bills of fuel consumption are not available from the sub-contractors of earthworks activities. The standard behavior of construction companies is to use a tank truck that arrives on site to

refuel equipment. Since the machines' tanks are not completely empty when the tank truck arrives, it is difficult to know the exact amount of fuel loaded into each piece of equipment, and thus records are not usually made. However, we carried out a survey by asking questions directly on-site to the equipment operators and the owner. According to this survey, the fuel consumption of the two excavators, the loader and the compactor, was as follows: about 140 liters a day for excavator A, about 110 liters a day for excavator B, about 30 liters a day for loader C and the same amount for compactor D. Considering the real working day of earthmoving machines reported in the "Construction site record" (18 days for excavator A, 11 days for excavator B, half a day for loader C and compactor D), the total fuel consumption was 3,790.00 liters. No user data were available on the fuel consumption of trucks. Thus, when we compared the predicted data (3,292.31 l) with the actual data (3,790.00 l), we found an underestimation of about 15% (actual data are higher). The reported error has several components: a typical model error derived from the assumption or mathematical techniques used, an observation error related to the methods used to register the validation data, and an exogenous error that depends on the other environmental conditions. It is reasonable to assume that the error is mainly due to the method used to collect validation data, because construction firms do not tend to indicate the hours of operation of machinery, but only their presence on-site expressed in days. Therefore, the time extrapolated from the "Construction site record" to calculate the actual consumption data is likely to be higher than the real figure. In fact, as stated in the Caterpillar Performance Handbook (2013), a machine's work application can vary greatly. Periods spent at idle, dozer and pusher travel in reverse, haul units traveling empty, close maneuvering at part throttle, and operating downhill are examples of conditions that reduce the load factor. Therefore, this 15% represents a ceiling of potential model error. If we also consider that the weight of the other exogenous variables, such as operator temperament or attitude, may involve a 10-12% difference in consumption rates (Caterpillar Performance Handbook, 2013), it can be stated that the proposed method is accurate enough and provides a reliable estimation of fuel consumption.

Subsequently, we compared the results with those from a literature review. Fuel consumption data for earthwork machinery reported by Cabello Eras et al. (2013), which ranged from 35.21 l/h to 23.7 l/h, show quite similar results. However, method with specific load factors considers each piece of equipment in a specific context, with the proper characteristics of the soil and the surface. A comparison of the results with those reported by Keckojevic and Komljenovic (2011) confirms that fuel consumption correlates strongly with the engine load factor.

Moreover, the calculated data were compared with those from a study by Zarotti et al. (2009). Zarotti used an auxiliary fuel circuit for consumption measurements and calculated 0.02684 Kg/cycle of fuel for a medium-sized tracked excavator (i.e. 0.0315 l/cycle), which is 6.85 l/h. Considering productivity of 0.007 h/m<sup>3</sup>, the fuel consumption was calculated as 0.05 l/m<sup>3</sup>. This figure is quite different from that predicted with the proposed method (about 0.19 l/m<sup>3</sup>). However, it must be taken into account that the first value tested by Zarotti et al. (2009) (0.05 l/m<sup>3</sup>) exclusively relates to the operating cycle, without considering on-site excavator movements and pauses with the engine running. These movements and pauses may take up at least half of a workday, and were considered in the case study here (differences in duration of use). Secondly, the test trench in Zarotti et al. (2009) was about 1 m deep, while in the case study the digging

depth varied from 0 to 10 m. Finally, the test carried out by Zarotti et al. (2009) used soft uncompacted soil, while the soil in the case study included a layer of dry silty sand (from 0 to 3 m deep) and a layer of compact, fine sand with gravel (from 3 to 10 m deep). Since there is a direct relationship between duration of use and the excavator load factor, the material density and the excavator load factor, and the indicator  $W_j$  represents the mean thickness of layers, then the duration of use, the material density and the digging depth explain the difference between the data obtained using the method in the case study, and the data obtained by Zarotti et al. (2009).

As a final consideration, both the predicted data and the actual data show that earthworks in new residential construction projects are a significant source of pollution. Therefore, they require careful analysis as they do in road projects, where one of the main sources of emissions is off-road machinery (Barandica et al., 2013).

#### **4. CONCLUSIONS**

A review of relevant literature on construction site fuel consumption assessment during the pre-construction stage revealed that no significant studies have been undertaken that address potential methods. In particular, no shared models have been proposed that are based on a detailed load factor parameter.

Therefore, we carried out a study that proposed a quantitative method to predict the on-site fuel consumption of earthworks activities during the pre-construction stage. First, the research identified fuel consumption agents related to earthworks activities. Then, an analysis of on-site fuel consumption was carried out by characterizing fuel equipment and load factors. Using data available from producers' technical manuals, and applying a cluster analysis method and then a linear regression, we calculated load factors for a medium-sized tracked excavator, a small wheel loader, and a vibratory soil compactor. An analysis of transport fuel consumption was also undertaken. We applied the method in a case study that demonstrated its practical use, and showed that the model's output behavior was sufficiently accurate.

Thus, the proposed method could be used by a construction designer (e.g. architect or engineer) who needs to make a simple comparison of design alternatives for residential construction projects and choose which one is more "sustainable" in terms of on-site fuel consumption. Then, the client can ask the contractor about predicted fuel consumption and use monitoring tools, such as meters, to check predictions.

The strength of this method lies in the fact that on-site fuel consumption is predicted in advance, based on information contained in the construction project's documents, so the design can be changed to minimize the impact. This is also useful within the framework of ISO 14004:2004, to identify and assess the magnitude of the environmental impact related to on-site fuel consumption.

Finally, in agreement with some previous studies, the research shows that earthworks are construction activities that have a great impact in terms of fuel consumption and consequent carbon dioxide emission. This highlights that we should not overlook on-site fuel consumption related to a new-start residential construction project and associated with the equipment used.

## 5. FURTHER RESEARCH

This research represents a first step towards predicting the on-site fuel energy consumption of a construction project. Further research is needed in this area. Construction processes are largely exposed to outdoor conditions, and this also affects fuel consumption. Some significant parameters related to outdoor conditions that can affect fuel consumption, such as temperature and moisture, should be investigated and eventually included in the proposed method. Other factors that could affect fuel consumption are related to the maintenance level of the equipment, which can have a negative impact on engine efficiency, and the workers' ability. Regular maintenance helps to conserve fuel, and lengthens machine life, while two operators with different temperaments or attitudes operating identical machines side-by-side in the same material can have as much as a 10-12% difference in consumption rates. Parameters related to outdoor conditions, maintenance and workers' ability could be included in the predictive model.

Further in-depth methodology developments are needed, through the involvement of earthmoving machines producers and their users, in particular earthworks sub-contractors. The comparison between predicted data and real data in several case studies could contribute to strongly validating the method. In fact, some machinery producers have specific fuel counters installed on their latest equipment models.

Moreover, the method presented here could be easily extended to other construction stages and activities, through the characterization of their related consumption agents and an analysis of corresponding load factors. For other significant earthworks types, such as civil construction, a future in-depth analysis considering different consumption agents and materials would be required to fit the predictive method.

Finally, the method could be integrated into the LCA method, in order to address the lack of data on energy consumption in the construction phase that characterizes LCA. However, before this can take place, a specific database about construction equipment and its parameters would need to be constructed.

Future research in the area of construction equipment could lead to significant benefits for both the construction industry and the environment.

## 6. REFERENCES

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