

Feasibility study on the use of recycling materials for prototyping purposes: a comparative study based on the mechanical resistance

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Abstract

3D printing is seen as a disruptive technology and continues to expand the design space boundaries for prototypes and final products. However, sustainability is one of the major objectives for manufacturing and the use of recycled materials becomes a relevant strategy, particularly for improving material resource efficiency. This paper attempts to evaluate the suitability of the substitution of virgin polylactic acid (PLA) by recycled PLA. An experimental plan divided into three phases to evaluate the mechanical resistance was described. The results showed that recycled PLA may be used thanks to the similar resistance, though slightly lower than the virgin material. Besides, the infill density and the orientation parameters played a major role. A retention of the 58.1% of the resistance using an infill density of 40% was evidenced. This is a relevant insight for prescriptions of the 3D printing parameters guaranteeing minimal quality conditions in the prototyping phases.

1 Introduction

Additive manufacturing (also called 3D printing) is becoming a key technology for cross domain applications. The layer-by-layer principle of manufacturing objects enables a higher flexibility degree in the product design phase. The set of several available printing technologies is pushing forward advantages such as the customization of objects with complex geometries with a great deal of detail, combination of different materials (Askari et al. 2020), reduction of the need for assembly and high utilization rate of raw materials (Pérez et al. 2020; L. Wang, Jiang, and Zhang 2020). Thus, this field is receiving great attention by the industrial companies and the general public.

3D printing has developed significantly over time. A great development is expected in sectors such as product consumption, medical products and aerospace components (Peng et al. 2018). The rapid prototyping market reached \$11.86 billion US dollars according to Wohlers 2019 report (S. Singh and Agrawal 2021), which also forecasts the market to reach 35.6 billion dollars by 2024 (McCue 2019).

Nowadays, there is a need to find paths to reduce the ecological impact of manufacturing processes and activities (Niaki, Torabi, and Nonino 2019). Researchers are making efforts to identify opportunities of 3D printing on the circular economy paradigm (Despeisse et al. 2017). Moreover, due to the fact that plastic is one of the most used materials in the 3D printing industry (González-Henríquez, Sarabia-Vallejos, and Rodríguez-Hernandez 2019), and given their non-biodegradable nature, plastic is one the most abundant type of waste produced and their impact is well document in the different ecosystems (Ryberg et al. 2019). Thus, reducing the consumption of plastics is of great importance for the environment.

A major literature coming from engineering, human computer interaction, design thinking or software development (Elverum, Welo, and Tronvoll 2016a) validates the rationale for the prototyping phase in the early design phases of product development. According the prototyping theory, different kind of prototypes are needed during the new product development phases (eg. prototype for desirability, for feasibility, and for viability) (Menold, Jablokow, and Simpson 2017) with the purpose of reducing uncertainties, exploring

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new ideas, increasing feasibility and/or engaging with users (Hansen and Özkil 2020). Based on that, a prototype is accomplished in terms of certain aims: (1) Model to Link, (2) Model to Test, (3) Model to Communicate, (4) Model to Decide, and (5) Model to Interact (Menold, Jablokow, and Simpson 2017). The use of digital tools allows designers to create highly flexible prototypes that enable short learning cycles at an affordable cost. Moreover, the use of 3D printing technology enables the materialization aspect. Regardless of whether the printed part is functional or not, the printed part is found to be valuable in design decisions (Elverum, Welø, and Tronvoll 2016b). However, there is a gap in the literature in terms of sustainable manufacturing using 3D printing in the early design phases (Peng et al. 2018). Although the technology offers high efficiency in the use of material, the democratization of this technology could cause a rebound impact due to the increasing generation and disposal of huge amounts of waste or polluting emissions to fabricate the virgin feedstock required, particularly, in the prototyping phases. Without a doubt, the roots of FFF (Fused Filament Fabrication) are linked to the rapid prototyping concept (Campbell, Bourell, and Gibson 2012; Bourell et al. 2009) and in the last years it has been widely adopted by industry, academia and users to create functional objects for their designs. Therefore, one question that remains is how to define the most favorable printing conditions in order to create prototypes in the early phases without compromising the mechanical properties, even for recycled feedstocks.

Studies on the technical viability of recycled materials as substitutes for conventional virgin materials are still limited for particular applications (Fabio A. Cruz Sanchez et al. 2020). It is important to note that in most cases, prototypes do not require excellent mechanical resistance but the minimum to be handled in order to allow inspection and measurement. Thus, the type of material used and its amount can be further optimized when it comes to prototyping.

The present study evaluates the mechanical properties of both conventional and recycled polylactic acid (PLA) materials. The objective is the assessment of the suitability of the recycled PLA as replacement in prototyping, though its use may be further extended to other applications. To do that, this research is based on a comprehensive experimental study with three main phases in order to evaluate the influence of several printing parameters on the mechanical properties of the parts. In section 2, a literature review is presented, focusing on the critical parameters in 3D printing technology and providing readers with an overview on the use of a distributed recycling approach. Then, section 3 illustrates the methodology used in this study. In section 4, the results of the experimental approach is presented. In section 5, we discuss the main research outcomes. Finally, section 6 summarizes the main conclusions.

2 Existing Theories & Previous Work

2.1 Main parameters on Fused Filament Fabrication

One of the most common processes in 3D printing is the FFF (also known as fused deposition process modeling (FDM), which is a trademark). The process is based on material extrusion, so the material is heated above its melting point and then deposited onto a platform (Wolszczak et al. 2018). In FFF/FDM, a variety of thermoplastic materials are commonly used, such as acrylonitrile butadiene styrene (ABS), polyvinylchloride (PVS), polycarbonate (PC), nylon, polifenilsulfona, high density polyethylene (HDPE), low density polyethylene (LDPE), polyethylene terephthalate (PET), high impact polystyrene (HIPS) and polylactic acid (PLA) (Chua, Wong, and Yeong 2017; X. G. Zhao et al. 2018; R. Singh, Kumar, and Singh 2018).

The mechanical properties are critical for engineering parts, particularly, for 3D printed because of the anisotropic behaviour, which can influence up to about 47% the ultimate tensile strength in function of the manufacturing parameters (Laureto and Pearce 2018). Using a systematic literature review, Popescu et al. (2018) identified certain key parameters influencing the printed parts including raster-to-raster air gap, raster angle, layer thickness, infill density and build orientation.

Nevertheless, it is highlighted that it might be uncertain if a set of optimal parameters for a machine/material/application combination can be transferred to other 3D printers due to the issue of intra-3D printer variability. The development of standards to qualify the process is a relevant research path in order to set minimal requirements for the dimensional accuracy, repeatability and minimum feature size among the

3D printing technologies (Rebaioli and Fassi 2017). Likewise, considering the open source nature of the FFF technology, standardized experimental protocols are relevant to enable benchmarking and serve as a guide for machine selection (Fabio Alberto Cruz Sanchez et al. 2014; Roberson, Espalin, and Wicker 2013). Therefore, it is crucial to identify the most important parameters that may affect the response variable among all of the available to carry out the process and their expected influence based on the scientific literature (Jaisingh Sheoran and Kumar 2020).

In general terms, it is found that for low values of layer height, the tensile strength of the material is improved (Tymrak, Kreiger, and Pearce 2014). In addition, by directing the printing towards the direction in which the tensile load will be applied during tensile testing, the property can be also maximized. The importance of the printing orientation was also identified by Yao et al. (2019). According to Alafaghani and Qattawi (2018), a higher extrusion temperature, an optimized layer thickness, a triangular filling pattern and a higher filling level maximize the strength of the parts. Regarding the printing speed, it is identified that higher printing speed with higher layer thickness leads to lower part strength. Among others, Altan et al. (2018) also identified the influence of the layer height on the mechanical resistance.

2.2 Materials and distributed recycling

The development of new materials such as polymers, elastomers and composites in engineering plays a fundamental role in the advance of sustainable manufacturing (Ashby and Johnson 2013). Liu et al. (2019) presented a complete review on natural-derived biopolymers for 3D printing purposes, with a particular focus on biomedical, customized food fabrication and textile and apparel products. They pointed out that the use of biopolymers of natural and renewable origin, replacing synthetic polymers, as the cellulose, hemicellulose, lignin, starch, alginate, chitosan and derivatives, represents the most abundant bio-based and renewable raw materials for different 3D printing technologies.

Polylactic acid (PLA) is a type of natural biopolymer obtained from crops such as starch or sugar cane. It is a biodegradable biopolymer consisting of lactic acid molecules and it is one of the most used materials in 3D printing. In addition, PLA is a sustainable alternative that shows a range of crystallinity and mechanical properties between polystyrene and polyethylene terephthalate (Kumar, Singh, and Farina 2018; X. G. Zhao et al. 2018).

In the literature, the distributed recycling via additive manufacturing approach (DRAM) makes an emphasis in the technical steps to reuse plastic waste through the recycling chains for material extrusion based 3D printing (Fabio A. Cruz Sanchez et al. 2020; Little et al. 2020). The use of recycled material as raw material or blended with virgin material is a method of special interest to contribute to manufacture in a sustainable way (P. Zhao et al. 2018). In the DRAM methodology, consumers have an economic incentive to recycle. This is because they can use their waste as feedstock for a wide range of consumer products that can be produced for a fraction of the conventional cost of the equivalent products. Moreover, 3D printing is especially suited because it allows producing parts with (almost) no waste and could reduce more than 40% of the waste related to the material, reusing 95% of the unused material (Petrovic et al. 2011). Currently, most of the cost of 3D printing is associated with the cost of the filament (Wittbrodt et al. 2013). By recycling raw materials such as PLA, the emissions of carbon dioxide can be reduced in the transport to landfills or shipping to customers offering environmental benefits (Santander et al. 2020). The technical feasibility for recycling in laboratory conditions have been proved for PLA (Fabio A. Cruz Sanchez et al. 2017), ABS (Vidakis et al. 2020) and PET (Zander, Gillan, and Lambeth 2018), finding that the recycled plastics have a similar performance to their virgin counterparts and they have even been applied in the manufacture of high value products in some sectors such as the automobile (P. Zhao et al. 2018).

It is important to evaluate the properties of the recycled materials before substituting virgin for recycled materials. In this sense, Kumar, Singh, and Farina (2018) compared the elongation at break, load at break, flow index, Young's modulus and breaking stress of recycled ABS, high impact polystyrene (HIPS) and PLA. The PLA showed the highest elongation at break along with the ABS. In addition, the PLA had a higher breaking load and breaking stress, although a smaller Young's modulus. Other authors such as Gu, Hall, and Miles (2016) identified the suitability of using recycled polypropylene instead of virgin polypropylene based on mechanical properties. Specifically, they found that the use of fillers (talc and glass fibre) improved

the mechanical properties. Babagowda et al. (2018) studied the influence of the percentage of recycled PLA used in the filament (i.e., 10 to 50 %) showing that the smaller the percentage the higher the ultimate tensile strength. Pinho, Amaro, and Piedade (2020) obtained higher values of tensile stress for recycled PLA when comparing to the virgin one.

As Suárez and Domínguez (2020) pointed out, the use of recycled materials is still uncertain because of the potential changes in the material properties when recycling. P. Zhao et al. (2018) studied the cycles of printing that PLA can withstand until it loses much of its properties. Thus, they showed that PLA adequately withstands two printing cycles since in a third cycle the mechanical properties and viscosity decreased considerably. The increase in crystallinity and melting enthalpy and the decrease of the cold crystallization enthalpy are attributed to the 3D printing process, not to the recycling performed by the extrusion process. Similarly, other authors such as Lanzotti et al. (2019) have proved how recycling PLA provides comparable mechanical properties as the virgin material only after a second recycling process.

The recycling of PLA has certain limitations because of reducing the molecular weight with its reuse, resulting in degradation and decrease of mechanical properties. To counteract this effect, it is possible to add polidopamine (PDA) on the surface to improve these properties. Viscosity is also reduced with each printing cycle, but it could be corrected by adding virgin plastic (P. Zhao et al. 2018; X. G. Zhao et al. 2018). When recycling, there is a decrease in the properties of the material as a result of the presence of carbonyl groups and superficial pitting due to thermomechanical degradation during the new melting process that takes place during 3D printing (P. Zhao et al. 2018).

It is found that this valuable literature is focused on the evaluation and optimization of printed parts that seek the best trade-offs among parameters for a final product. The aim of the study is to identify the major critical factors affecting the mechanical properties in FFF focusing prototyping purposes, evaluating their impact on the mechanical properties, particularly for both virgin and recycled PLA. Thus, based on the results, it is expected to gain a better understanding on the suitability of using recycled materials in 3D printing and how to properly select the printing conditions to guarantee sufficient mechanical resistance in prototypes. In order to do that, an experimental plan comprising three phases will be developed. This is a complementary approach to the well established literature on FFF.

3 Experimental procedure

3.1 Materials and equipment

The printing materials tested in the study were virgin and recycled PLA characterized by data listed in Table 1. Both materials were commercial ones, the recycled PLA contained 10 % of virgin PLA in the blend.

Table 1: Characterization and processing conditions of the used PLA and recycled PLA

	PLA	Recycled PLA
Composition	PLA (Polylactic resin)- 99% CAS: 9051-89-2	PLA - 10% CAS: 9051-89-2 and recycled PLA 90%
Density	1.24 g/cm ³	1.1-1.3 g/cm ³
Diameter	1.75 ± 0.03 mm	1.75 mm
Printing temperature	220 ± 20 °C	205 ± 15 °C
Melting temperature	180 °C	160 ± 10 °C

The specimens were printed with a BQ's Witbox, shown in Fig. 1a. The software used to generate the

printing code was the Ultimaker Cura 3.2.1. To perform the destructive test, the machine used was the MTS Criterion 43 universal testing machine (MTS, 2020) (Fig 1b) with a maximum load of 50 kN, being the maximum load supported by the LPS 104 cell of 10 kN. The clamping system was the Instron 2716-015 system with a maximum supported load of 30 kN. The selected strain rate was 0.5 mm/min.

In this study, the mechanical specimens were manufactured according to the dimensions proposed by [Lin et al. \(2018\)](#) in which the length of the specimen was 75 mm. The dimensions of the specimen are the ones depicted in Fig 1c.

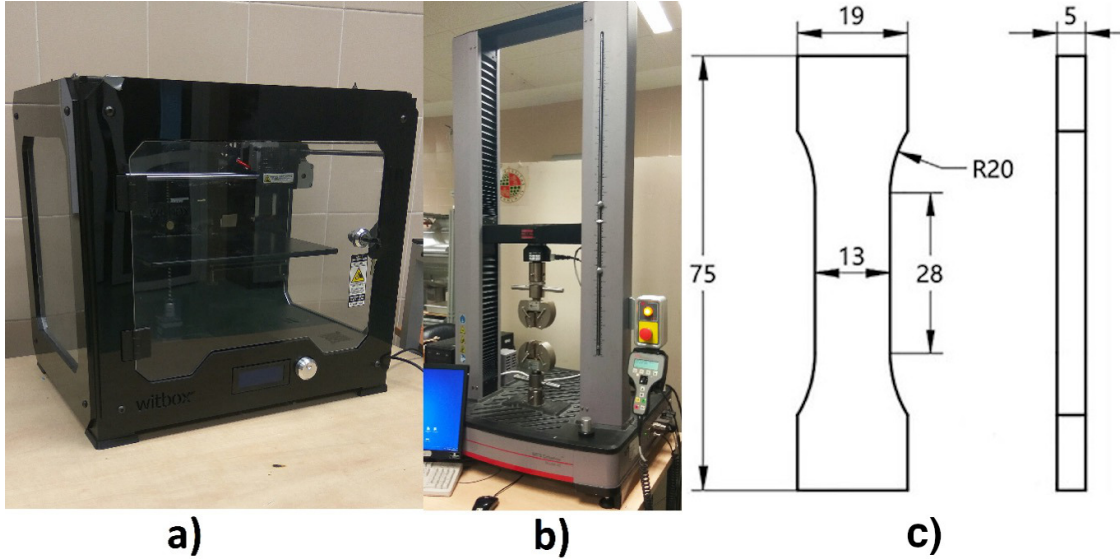


Figure 1: Equipment used in the study: a) 3D printer, b) Universal testing machine and c) mechanical sample.

3.2 Methodology

Fractional designs are useful for minimizing the number of tests, reducing time and money ([Montgomery 2001](#)), being used as screening designs. Hence, the experimental plan included three different phases (Figure 2) to carry out a comprehensive study with a limited number of tests that do not compromise the reliability of the results using fractional designs.

The main goal of *Phase I* is to identify and discard factors depending on their influence on the response variable. The response variable chosen was the maximum load attained during the testing of the specimen ([Kumar, Singh, and Farina 2018](#); [Chacón et al. 2017](#); [Letcher, Rankouhi, and Javadpour 2015](#)). In this phase, the design included only a specimen printed in the horizontal orientation for each of the combinations, not evaluating the influence of the orientation. The use of random order allowed guaranteeing that the hypothesis that the errors are independently distributed random variables was fulfilled ([Montgomery 2001](#)). Based on the literature research presented in section 2, the critical parameters for the study are the (1) layer height -LH- and (2) infill pattern -IP-. In addition, taking into account the goal of sustainable manufacturing (i.e., trying to optimize the consumption of material), but also productivity (i.e., trying to minimize printing times), (3) infill density -ID- and (4) printing speed -PS- were considered ([R. Singh et al. 2019](#); [Tanveer, Haleem, and Suhaib 2019](#)). These four factors were selected using two levels for each of them with large ranges. In consequence, the factors and their levels were: layer height -LH- (0.15 and 0.3 mm), infill pattern -IP- (tri-hexagonal and grid), infill density -ID- (60 and 100 %) and printing speed -PS- (40 and 80 mm/s). The selected printing temperature was 210 °C, which was the recommended for PLA material. This phase ends with an analysis of variance (ANOVA) in order to identify the influential factors on the response variable.

Then, the main goal of *Phase II* is to study in more detail the influence of the most influential factor according to the *Phase I*. Thus, the intent is to make a focus on how the response variable evolves by varying the most

influential factor. For that reason, in this phase an extension of the factor levels was established. On the other hand, the criteria selection of levels for the other three factors aimed at minimizing the printing time.

Finally, the *Phase III* aimed at evaluating the influence of the anisotropy of the specimens based on the study of the printing orientation, which may notably affect the mechanical resistance. In this phase, the main focus is to analyse the influence of the building orientation. Because of the anisotropy, the UNE 116005:2012 (UNE 2012) standard requires printing the specimens in three different orientations: edgewise (E), horizontal (H) and vertical (V), testing five samples in each orientation. This phase included the printing of 15 specimens of both virgin and recycled PLA.

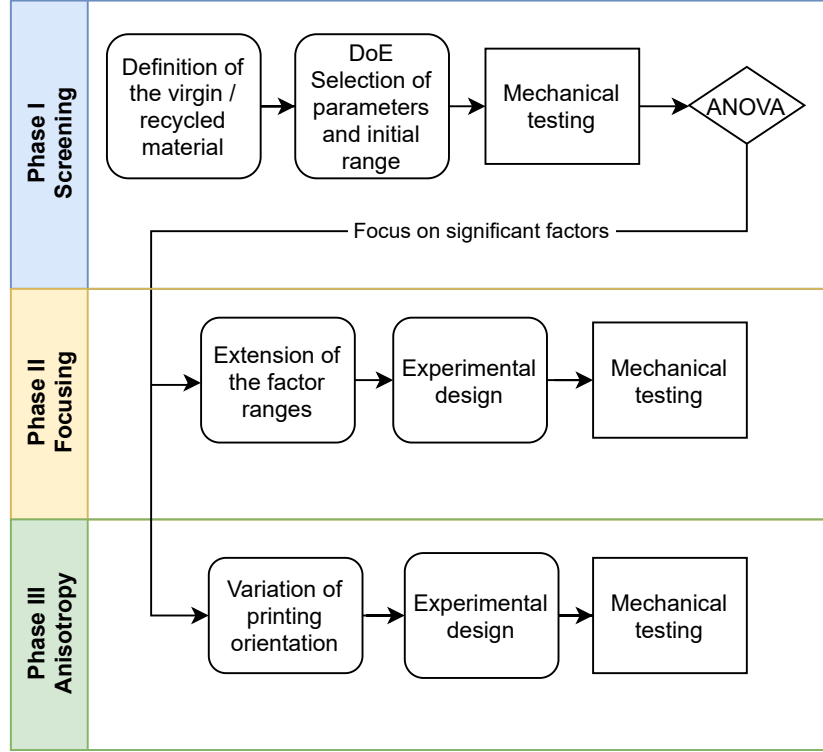


Figure 2: Summary of the three phases of the experimental plan.

4 Findings

4.1 Phase I: Screening phase

Table 2 summarizes the experimental strategy with the results of the maximum load attained during this screening phase. A total of 16 samples were tested.

Table 2: Results of the Phase I

Material	LH (mm) ^a	IP ^b	ID (%) ^c	PS Max Load (mm/s) ^d	Max Load (kN)
Virgin	0.15	Tri-hex	60	40	2.206448
Virgin	0.3	Tri-hex	60	80	2.163030
Virgin	0.15	Grid	60	80	2.239897

^{abcd}Layer height (LH); Infill pattern (IP); Infill density (ID); Printing speed (PS)

Material	LH (mm) ^a	IP ^b	ID (%) ^c	PS (mm/s) ^d	Max Load (kN)
Virgin	0.3	Grid	100	80	3.597994
Virgin	0.3	Tri-hex	100	40	3.620359
Virgin	0.15	Tri-hex	100	80	3.811253
Virgin	0.15	Grid	100	40	3.793354
Virgin	0.3	Grid	60	40	2.160100
Recycled	0.15	Tri-hex	60	40	2.163397
Recycled	0.3	Tri-hex	60	80	2.163340
Recycled	0.3	Grid	60	40	2.151576
Recycled	0.15	Tri-hex	100	80	3.379278
Recycled	0.3	Tri-hex	100	40	3.370447
Recycled	0.15	Grid	60	80	2.050518
Recycled	0.15	Grid	100	40	3.525304
Recycled	0.3	Grid	100	80	3.487604

^aLayer height (LH); ^bInfill pattern (IP); ^cInfill density (ID); ^dPrinting speed (PS)

In general, shortly after attaining the maximum load, the fracture of the specimen occurred. However, the nature of the fracture was not homogeneous as shown in Fig 3a. Thus, in most cases, the specimens showed a fragile behavior and the fracture, either horizontally or with a lower inclination angle, was clean. However, for the recycled material, the specimens presented a ductile behavior and, properly, the fracture did not occur after the maximum load was attained. In these cases, the tensile tests were cancelled after the maximum load was attained, without reaching a complete fracture of the specimen. The breakage in these cases occurred at a 45° angle and, in the case of the RE-2 specimen, two parallel fracture lines can be clearly seen. The images of the fractured specimens did not allow us to observe a clear relation of the fracture of the specimens to the printing conditions. However, the fracture behavior may relate to that explained by Yao et al. (2019). The authors identified two different types of fracture: in-layer and interlayer. In general, the interlayer fracture occurs at the interface of two layers when printing in vertical position, even when varying the printing orientation up to 45° from the vertical position. In-layer fracture is more likely when the specimen is printed using an edgewise position (or, inclined up to 45° from that position). In this case, the printing direction is the same as the tensile stress direction, which also happens when the horizontal orientation is used. In these cases, the material layer is not intact after the fracture. As a result, it is likely that both modes (in-layer and inter-layer fractures) coexist in this study, which may explain the heterogeneity of the different fractures.

An analysis of variance (ANOVA) was performed using R software in order to identify the influential factors on the response variable.

As criterion, critical factors for the response variable were those with p-values lower than 0.05 (Pérez et al. 2018). Shapiro-Wilk normality tests allowed verifying the normality of the residuals. The figure 3b illustrates the boxplots of the results considering each of the factors. Also, the Table ?? lists the results of the ANOVAs carried out for the experimental results.

From the results of the Table ?? and figure 3b, it can be clearly identified how the infill density was a statistically significant factor for the maximum load with the lowest p-value, lower than 0.001, among the studied factors. Likewise, the type of material is also a statistically significant factor for the response variable but with a higher p-value, being non-significant the rest of the factors. When evaluating the contribution of each of the factors to the variability explained by the model, there were calculated values of 97.3% and 1.3%

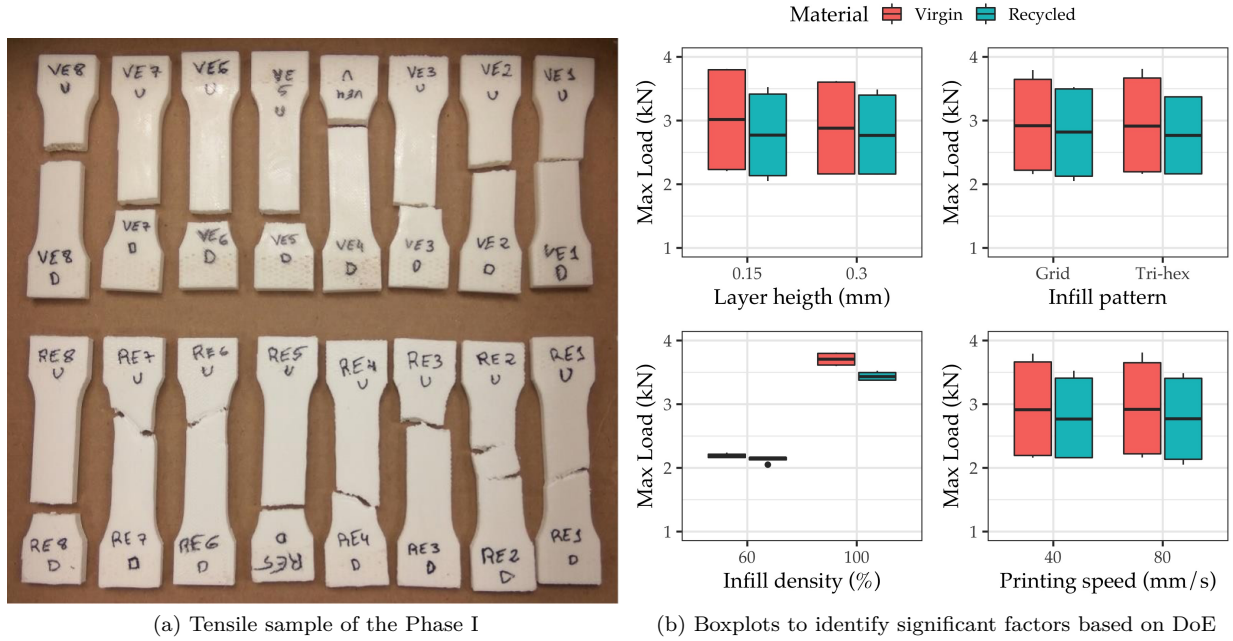


Figure 3: Phase I: screening tests to identify significant factors based on DoE

for infill density and type of material, respectively. Thus, when manufacturing new parts or specimens, infill density is a key factor for guaranteeing adequate mechanical properties of the specimens.

4.2 Phase II: Focusing

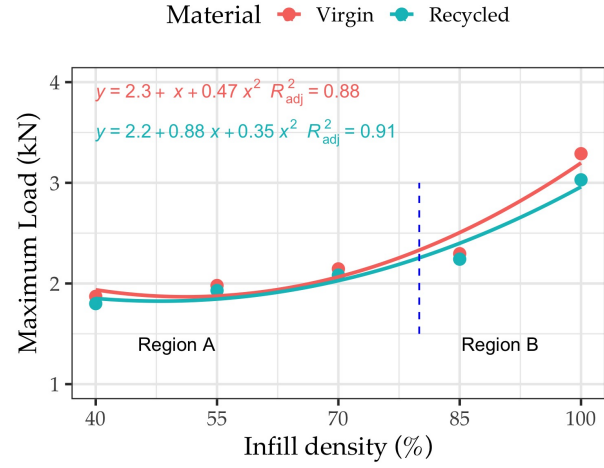
The main goal of *Phase II* is the detailed evaluation of the infill density by the fact that it was observed as the most important factor affecting the mechanical resistance in the previous phase. Therefore, five levels of the infill density were chosen ranging from 40 to 100 % to evaluate the evolution of the maximum load for both virgin and recycled PLA. The specific levels selected were 40, 55, 70, 85 and 100 %. Regarding the selection of the other factors of the printing process, the main criteria was the reduction of the printing time as stated in the methodology section. Therefore, the experimental conditions were layer height of 0.3 mm, tri-hexagonal infill pattern and printing speed of 80 mm/s with an estimated printing time of 20 min. A total of 10 samples were manufactured.

Figure 4a shows the fracture of the specimens tested in *Phase II*. Regarding the fracture, the results were similar to those of the *Phase I* (i.e., more ductile behavior for the recycled PLA specimens). The interesting element in this phase is presented in Figure 4b where the maximum load versus infill density for both virgin and recycled PLA is illustrated.

From the analysis of the Figure 4, it is possible to appreciate that there are two different regions. In the A region, which is between infill densities from 40 to 80 %, the slope of the curve grows slowly with an approximately linear trend meaning that an increase of the infill density provides a proportional increase in the mechanical properties. On the other hand, as from 80% of infill density, the increase of the mechanical resistance becomes more pronounced, as illustrated in the B region. Consequently, with a small increase of infill density, the maximum load notably grows. Regarding the type of material, it is clear that virgin PLA outperforms recycled PLA, but the difference between them is limited. These results are in agreement with studies on the comparison of the performance of recycled and virgin PLA (Fabio A. Cruz Sanchez et al. 2017) in which there was found a difference of about 10% of the mechanical properties in the first recycling cycles. However, the difference notably increased as the infill density approached 100%. The obtained results agree well with those presented by S. Wang et al. (2020). In their study, the authors studied infill densities of 20,



(a) Specimens after tensile test in phase II



(b) Maximum load versus infill density for both virgin and recycled PLA.

Figure 4: Phase II: Tests to evaluate the evolution of significant the factor identified in Phase I.

40, 60, 80 and 100% and the evolution of the tensile strength is similar to the one shown in Figure 4.

Based on the results, it appears that a reduction from 100% to 40% of the infill density implies a relatively limited reduction, in average 41.7%, of the maximum load supported for both types of materials. This is an interesting result that enables the creation of prototypes with less material usage, without compromising the mechanical resistance. Although the number of measured points is reduced, it is possible to model the relation between the maximum load (y) versus the infill density (x) for the two tested materials by means of polynomial regressions that are plotted in the figure. The models may help to anticipate the mechanical resistance of a part based on the selection of the infill density. Based on the developed models, it is possible to highlight that recycled PLA is a suitable substitute for virgin PLA guaranteeing similar mechanical resistance. Moreover, by developing models for the mechanical properties, it is possible to minimize the material consumption for both virgin and recycled materials satisfying the mechanical resistance requirements. Thus, by accurately knowing the influence of the printing conditions on the mechanical resistance, it is possible to advance towards sustainable manufacturing.

4.3 Phase III: Study on the printing orientation

In this final phase, the main goal is to test the influence of the building orientation according to the UNE 116005:2012 (García-Domínguez et al. 2019) standard. Five specimens for each of the orientations (edgewise, horizontal and vertical) for both virgin and recycled PLA were manufactured. The selected printing conditions were infill density of 50%, printing speed of 80 mm/s, tri-hexagonal infill pattern and layer height of 0.3 mm, with the objective of limiting the use of material and the time required for printing.

Figure 5a shows the images of the tested specimens observing the same type of fracture as in the first two phases. It is interesting to evaluate the reduction in the maximum load depending on the type of material and orientation in which the specimens were printed.

The Figure 5b details the maximum load and the mean values for the five specimens at each orientation. From the results, it is clear that the horizontal orientation is the one that provided the higher mechanical resistance, followed by the edgewise orientation. Likewise, the virgin samples performed better than the

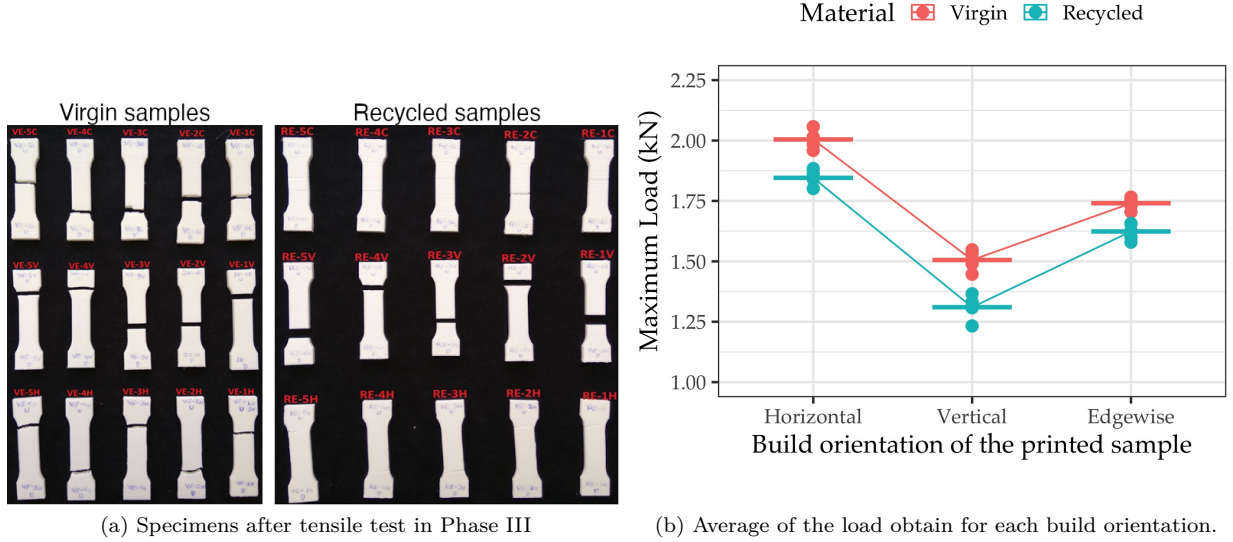


Figure 5: Phase III: Evaluation of the anisotropy.

recycled samples.

The vertical orientation provided the worse results due to the deposition of the layers perpendicular to the tensile direction. These results are in good agreement with those by [Corapi et al. \(2019\)](#) and [S. Wang et al. \(2020\)](#). For the recycled material, there is a slight decrease in the maximum load obtained from 6.71 to 13% depending on the orientation with respect to the virgin values. Particularly, the biggest reduction of the load takes place in the vertical orientation with the maximum decrease of 13 %. However, the other two orientations are more adequate for substituting the virgin material with the recycled material with a limited reduction in mechanical resistance (6.71 to 7.93 %).

5 Discussion and limits of the results

One of the systemic problems of plastic waste relies on dependency of the indiscriminate disposal of plastics, which carries multiple risks because many plastic products contain additives that modify their physico-mechanical properties, making it difficult the recycling/reuse ([Wagner and Schlummer 2020](#)). The use of 3D printing technology for prototyping activities are not excepted of this societal issue. The main purpose of this article is to assess to what extent the influence of the printing parameters affects the tensile resistance of the printed parts. While a large literature is focused on the optimization of the parameters for obtaining functional printed objects using the 100% of the printed material, the approach made here is to observe the influence of a large range of factors considered as critical within conventional printing ranges. This type of approach is important because it enables designers and users to use printing setups that are envisioned for prototypes objects, being secure about the quality of the printed products.

One of the main results in this study relies on that that there is a reduction about 41.7% (in average) of the maximum load supported for PLA (virgin and recycled) when the infill density changes from 100% to 40%. Moreover, it could be inferred from the results that an infill density of 40% retained 58.1% of the mechanical resistance. This is a relevant insight for prescriptions of minimal conditions for 3D printing. Moreover, the use of recycled assets in the printing process may be a relevant path, considering the current priorities of the European Union on circular economy and carbon neutral strategies ambitions ([Schwarz et al. 2021](#)). Also, there is a great development of applications using distributed recycling approaches. For

instance, [Nur-A-Tomal, Pahlevani, and Sahajwalla \(2020\)](#) presented a valuable example of waste-to-wealth to use waste plastic toys retaining the original colour of waste plastic to fabricate new products. Certainly more research is required to the development of complete closed-loop case studies for prototyping purposes based on material type validating technical, ecological and economic feasibility ([Fabio A. Cruz Sanchez et al. 2020](#); [Sauerwein et al. 2019](#)).

There are certain limitations to this work in the perspective of materials and parameters tested. Definitely, the use of other materials is needed to evaluate if the influence of the infill density and recycled material are consequent with the results found. Moreover, other factors are needed in order to consider the quality of a prototype. Clearly, other key variables such as the aesthetic design, surface finishing ([Jin et al. 2017](#)), dimensional accuracy are also key variables to include for the printed objects in addition to the mechanical resistance in the prototypes where the main goal is the user acceptability ([Juergen Sauer and Sonderegger 2009](#); [Jürgen Sauer, Seibel, and Rüttinger 2010](#)). Nevertheless, this is an ongoing research in which the main purpose is the statistical validation of the minimal conditions to promote the use of recycled materials in prototyping phases.

6 Conclusions

The present study includes a comprehensive experimental program to analyze the Fused Filament Fabrication process based on mechanical resistance using virgin PLA and recycled PLA. The paper aims at improving the sustainability of the 3D printing process, assessing the technical feasibility of the substitution of virgin with recycled filaments.

The printing conditions determined in a great manner the mechanical resistance of the specimens. Specifically, the most influential factor on the maximum load for both virgin and recycled PLA was the infill density. The influence of the infill density on the maximum load allowed identifying two different regions: A, from 40 to 80%, linear behavior with a slight slope and, B, from 80 to 100 %, the maximum load increases notably to a greater extent. In general, the fracture of the virgin material corresponded to that of a fragile material, while the fracture of the recycled material showed a more ductile behavior.

The selected orientation for printing the specimens is of great importance for the maximum load because of the anisotropy. In this sense, the horizontal orientation allowed attaining a higher maximum load, while the vertical orientation provided the lower value due to the fact that no layers were deposited in the tensile direction. Our results support the main argument on the substitution of virgin PLA with recycled PLA based on the mechanical resistance for prototyping purposes, advancing towards sustainable manufacturing. It was found that using an infill density of 40%, there is a retention of the 58.1% of the mechanical resistance. Despite recycled PLA offers a slightly lower mechanical resistance, when possible, by properly selecting the printing conditions (mainly, by the infill density and orientation) it could be approximate the mechanical resistance to that of the virgin PLA. Particularly, when using the edgewise and horizontal orientations, it is possible to obtain maximum loads close to that of the virgin material (from 3 to 8 % lower).

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8 Declaration of interest statement

The authors report no declarations of interest.

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