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## Article

# Utilization of Central Composite Design for the Production of Hydrogel Blends for 3D Printing

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**Abstract:** Central composite design (CCD) is a statistical experimental design technique that utilizes a combination of factorial and axial points to study the effects of multiple variables on a response. This study focused on optimizing hydrogel formulations for 3D printing using CCD. Three biopolymers were selected: sodium alginate (SA), gelatin (GEL), and carboxymethyl cellulose (CMC). Maximum and minimum concentrations for each polymer were established, and CCD was employed to generate various combinations for hydrogel preparation. The hydrogels were characterized for their swelling degree (SD) in phosphate-buffered saline (PBS) and Dulbecco's modified Eagle medium (DMEM), as well as their printability in 2D and 3D assays. The formulation consisting of 7.5% SA, 7.5% GEL, and 2.5% CMC exhibited the best swelling properties and exceptional printability, surpassing all other tested formulations. This study highlights the effectiveness of design of experiments methodologies in accelerating the development of optimized hydrogel formulations for various applications in 3D printing and suggest avenues for future research to explore their performance in specific biological contexts.

**Keywords:** polymer; swelling; 3D bioprinting; design of experiments; printability

## 1. Introduction

Hydrogels are three-dimensional (3D) networks made of polymers that possess a high degree of flexibility due to the large water content that they can absorb. They are suitable substances for a wide variety of applications because they can retain a large amount of water or biological fluids under physiological conditions and are characterized by a soft rubbery consistency similar to living tissues [1]. These materials are formed within an aqueous microenvironment through the cross-linking of hydrophilic polymer chains. They are widely used in several areas, such as tissue engineering, drug delivery, actuators, and wound dressings [2].

Furthermore, this type of biomaterial has been largely applied to fabricate structures with cells incorporated through 3D extrusion-based printing techniques, including 3D printing, because of their cell-friendly environment and high water content [3]. 3D printing, also known as additive manufacturing, involves creating objects layer by layer using digital design data. This process is guided by computer-aided design (CAD) files and can produce objects with complex shapes and structures [4]. 3D printing is a growing field that has been applied in several areas, such as construction, biology, dentistry, prosthesis, and others [5–8]. For 3D bioprinting purposes, when cells and biomaterials are involved in the process, hydrogels are used and these biomaterials must present some features, such as biocompatibility, toughness, degradability, swelling behavior, and printability [9].

In that manner, some biopolymers already present some outstanding properties for hydrogels formation, like alginate that is a natural linear (unbranched) polysaccharide, typically extracted from brown algae, based on d-mannuronic and l-guluronic acids, that is biodegradable, non-toxic, non-immunogenic, and presents a high biocompatibility [10,11]. Also, another biopolymer of interest for

production of hydrogels is cellulose that, probably, is the most abundant renewable and biodegradable material found in nature, since it is generally obtained from plants, and is many times used in its derived form, carboxymethyl cellulose, with both presenting a high viscosity, low cost, and biocompatibility [12–14]. Additionally, gelatin is a protein derived from collagen that has been partially hydrolyzed that presents some interesting characteristics aiming the production of hydrogels for 3D bioprinting purposes, like high water absorption capability, biodegradability, non-immunogenicity, and exceptional biocompatibility [9]. All mentioned properties are important for 3D bioprinting techniques, and the mixture of these three biopolymers may produce hydrogels reliable for micro-extrusion processes, depending on the concentration that will be applied, which makes important the analysis of such conditions.

To optimize a study, it is preferable to combine numerous variables rather than creating an individual experiment for each one, since the number of necessary assays is expressively decreased, resulting in a greater understanding of the process. In such cases, Design of Experiments (DoE) is applied to study concurrent variables in the process [15]. DoE consists of various applied statistic tools that are used to methodically classify and quantify cause-and-effect relations between variables and outcomes in the process under study, which can result in discovering the settings and conditions where the processes become optimized [16]. The application of DoE presents several advantages, including enhanced productivity, reduced variability, reduced development time, and lower costs overall [17].

Among the existing types of planning, central composite design (CCD) is an excellent choice that has emerged in the process of optimization and for finding the best possible product from a batch in progress. The CCD model is an essential part of response surface methodology, and one of its main advantages is that it is more accurate than previously applied one-variable-at-a-time models. Response Surface Methodology is a set of statistical and mathematical techniques based on the fit of a polynomial equation to the experimental data, which needs to represent the behavior of a data set with the aim of making statistical predictions. Therefore, it simultaneously optimizes the levels of several factors to obtain the best performance and has been applied in several areas, with the potential to be utilized for the selection of hydrogels [18–23].

The present study proposes the production of an optimized hydrogel for 3D printing process using CCD based on the evaluation of its swelling degree and printability. The findings of this research contribute to the advancement of micro-extrusion-based 3D bioprinting and biomedical applications by providing a valuable tool for developing optimized biomaterials. The enhanced hydrogel formulation offers a promising foundation for future research and development, potentially leading to improvements in healthcare, biotechnology, and bioengineering.

## 2. Materials and Methods

### 2.1. Materials

Calcium chloride dihydrate (Sigma, USA); Carboxymethyl cellulose sodium salt (Impex, Brazil); Dulbecco's Modified Eagle Medium (Sigma, USA); Gelatin P.A. (Dinâmica, Brazil); Phosphate buffered saline (PBS) (AMRESCO, USA); Sodium alginate (CRQ, Brazil).

### 2.2. Production of Hydrogels

To define the minimum and maximum concentration of each polymer for the production of the mixtures, the Google Scholar database was employed, and the first 30 articles that reported the production hydrogels using carboxymethyl cellulose (CMC), gelatin (GEL) and sodium alginate (SA), separately, were analyzed, and the minimum and maximum concentrations found were applied. The criteria for selecting articles from the Google Scholar search engine were based on the relevance of their content to the production of hydrogels using carboxymethyl cellulose, gelatin, and sodium alginate. No publication date restrictions were imposed, and articles in all languages were considered. The first 30 articles that met these criteria were chosen for further analysis.

These concentrations were then employed in Chemoface software [24] using CCD, yielding 17 mixtures of hydrogels, with the central point being repeated 3 times. Subsequently, mixtures of hydrogels were produced by adding 0.5 mL of each polymer at the initial concentration provided by Chemoface into 24-well plates, and they were left overnight. The following morning, hydrogels were subjected to swelling assays.

### 2.3. Swelling Kinetics

Hydrogels produced the previous day were removed from the 24-well plate, cross-linked with 2% calcium chloride for 5 min, gently dried, and weighed, providing the initial weight ( $w_0$ ) of the hydrogels. Subsequently, these hydrogels were placed in beakers with 6 mL of PBS, or DMEM, added separately to each beaker. They were stored in an oven at 37°C for 72 h. At intervals of 30 min, 1 h, 2 h, 4 h, 24 h, 48 h, and 72 h, the hydrogels were removed from the PBS or DMEM, gently dried, and weighed. The fluid absorption rate of each hydrogel was calculated using the following equation:

$$\text{Fluid absorption rate (\%)}: \frac{w - w_0}{w_0} \times 100 \quad (1)$$

Where  $w$  is the weight of the hydrogel at different intervals. Swelling degree (SD) is presented in percentage and represents the maximum weight observed, not dependent on the time at which it was measured. Similarly, the degradation degree is presented as the maximum weight loss, not dependent on the time of the measurement. This assay was performed in quadruplicate, and the results are presented as the mean of each experiment.

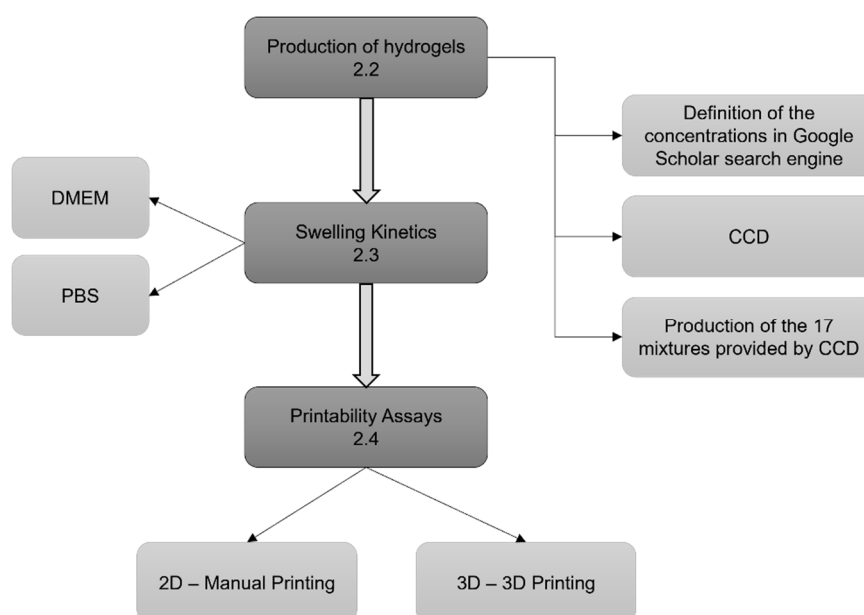
### 2.4. Printability Assay

From all the 15 different combinations offered by Chemoface (the central point had three replicates reaching the 17 mixtures), the ones that presented higher swelling degrees in PBS and DMEM were chosen to be manually extruded. In this assay, hydrogel mixtures were produced, packed in 5 mL syringes, and geometric shapes were extruded manually on a flat surface.

Subsequently, the chosen mixtures were submitted to 3D printing tests. The 3D printer used for all tests was the Engine HR (Hyrel 3D, USA). A computer-aided design (CAD) model was produced for the tests. The model chosen was a cylinder with dimensions of 15 × 15 × 10 mm, with a layer height of 0.3 mm, and a speed of 4 mm/s for the perimeter and filling, with 40% filling.

### 2.5. Workflow

Figure 1 presents a flow chart for step-wise procedures described in this section.



**Figure 1.** Flow chart for step-wise procedures and experimental design.

## 3. Results and Discussion

### 3.1. Production of the Hydrogels

Table 1 shows the experiments proposed using Chemoface software, presenting the initial concentration of each biopolymer for each experiment, named from 1 to 17. The maximum and

minimum concentrations defined were 7.5% and 1% for SA; 3% and 2% for CMC; and 10% and 5% for GEL, respectively, and the other concentrations were provided by CCD analysis.

**Table 1.** Experimental design with the independent variables, which are the initial concentration of sodium alginate (SA), carboxymethyl cellulose (CMC), and gelatin (GEL).

Experiments	SA	CMC	GEL
1	2.3	2.2	6
2	6.2	2.2	6
3	2.3	2.2	9
4	6.2	2.2	9
5	2.3	2.8	6
6	6.2	2.8	6
7	2.3	2.8	9
8	6.2	2.8	9
9	4.25	2	7.5
10	4.25	3	7.5
11	4.25	2.5	5
12	4.25	2.5	10
13	1	2.5	7.5
14	7.5	2.5	7.5
15	4.25	2.5	7.5
16	4.25	2.5	7.5
17	4.25	2.5	7.5

CCD is a methodology that indicates experimental conditions based on the combination of factorial points (+1 and -1), axial points (+α and -α), and a central point (level zero) of the chosen variable levels. The maximum and minimum values chosen for each factor are known as factorial points; the axial points are extreme values that are calculated using the following equation:

$$\alpha = \sqrt[4]{2^k} \tag{2}$$

Where *k* represents the number of factors, in the case of this study, *k* was defined as 3; and the central point is the mean between maximum and minimum values [25]. Table 2 describes the points used for this study, with all the values presented in the table being percentages.

**Table 2.** Variable values (factors) used for CCD representing the initial concentrations of the biopolymers to form the hydrogel blends. +1 and -1: factorial points. +α and -α: axial points. 0: central point.

	+1	-1	+α	-α	0
Alginate (%)	6.2	2.3	7.5	1	4.25
Carboxymethyl cellulose (%)	2.8	2.2	3	2	2.5
Gelatin (%)	9	6	10	5	7.5

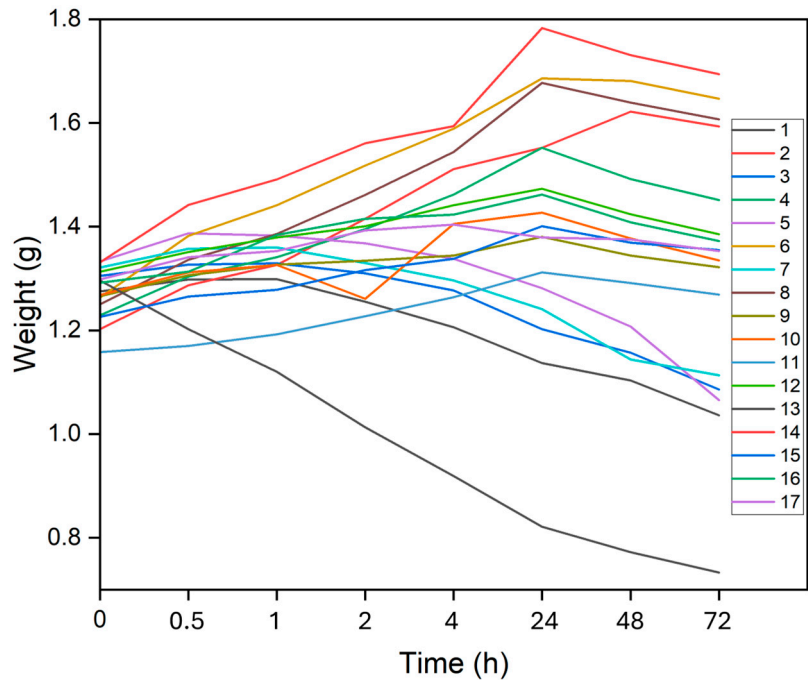
Similarly, Neto and Silva [26] employed CCD to choose the concentration of sodium alginate, gelatin, and calcium chloride to form a biomaterial, aiming to understand how the crosslinking agent can act in the modulation of micro and nanomechanical properties of biopolymeric filaments. In addition, Vaz [27] employed this type of design to select parameters for bioprinting on different 3D printers, such as the diameter of the needles, extrusion multiplier, and the printing speed to define the width of the filament produced.

After the production of each condition proposed, the hydrogels were unmolded and cross-linked using 2% calcium chloride for 5 min, gently dried, and submitted to swelling and degradation assays.

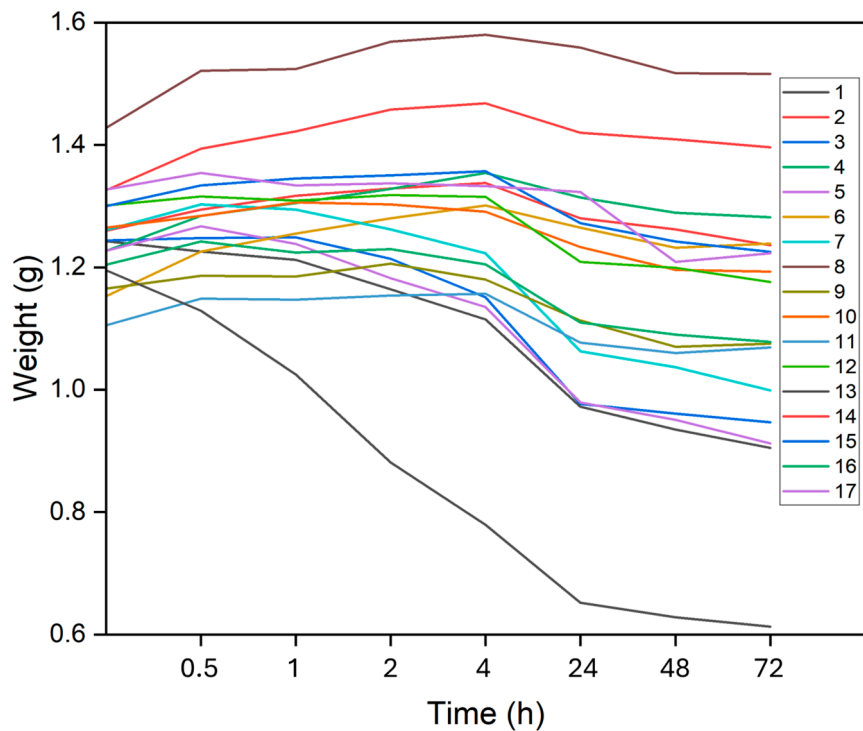


3.2. Swelling Kinetics

Figures 2 and 3 display the average results of the swelling degree and/or degradation of each hydrogel at various time intervals in PBS and DMEM, respectively. In PBS, the general pattern observed was that the hydrogels swelled up to 24 h before starting to degrade, at different rates and times. Exceptions to this were hydrogels 1, 3, 5, 7, and 13, which all contained lower concentrations of SA and exhibited swelling only up 1 or 2 h before degradation began. Notably, hydrogel 13, which had the lowest SA concentration at 1%, did not swell at all and instead showed mass loss at all observed times.



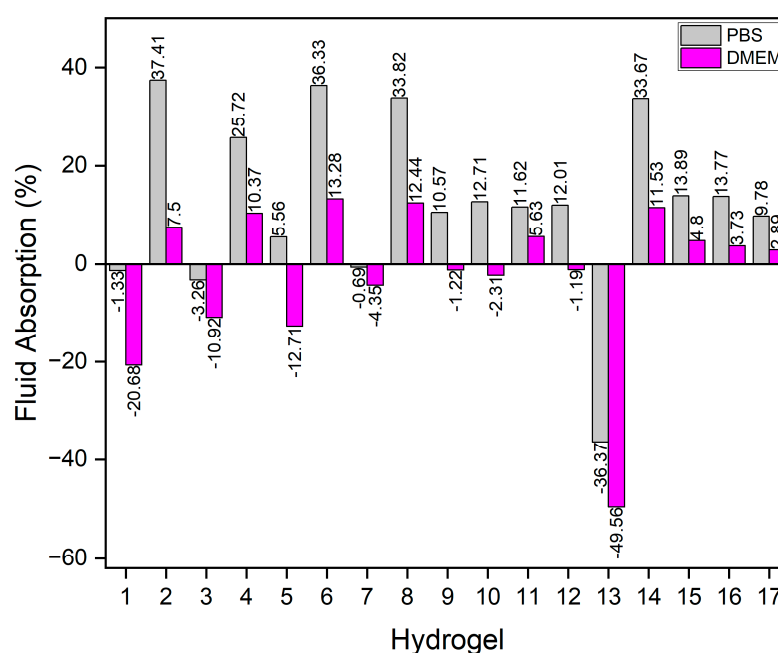
**Figure 2.** Swelling and/or degradation of the hydrogels in PBS produced using the CCD methodology. The values represent the mean of 4 experiments and are expressed in weight (g).



**Figure 3.** Swelling and/or degradation of the hydrogels in DMEM produced using the CCD methodology. The values represent the mean of 4 experiments and are expressed in weight (g).

In DMEM, the hydrogels demonstrated a greater tendency to degrade compared to PBS: 8 hydrogels swelled up to 4 h, 2 swelled up to 2 h, 2 swelled up to 1 h, 3 swelled for only 30 min, and the 2 did not swell at all. Again, hydrogels with higher SA concentrations exhibited longer swelling times, while those with lower concentrations swelled for shorter durations or not at all.

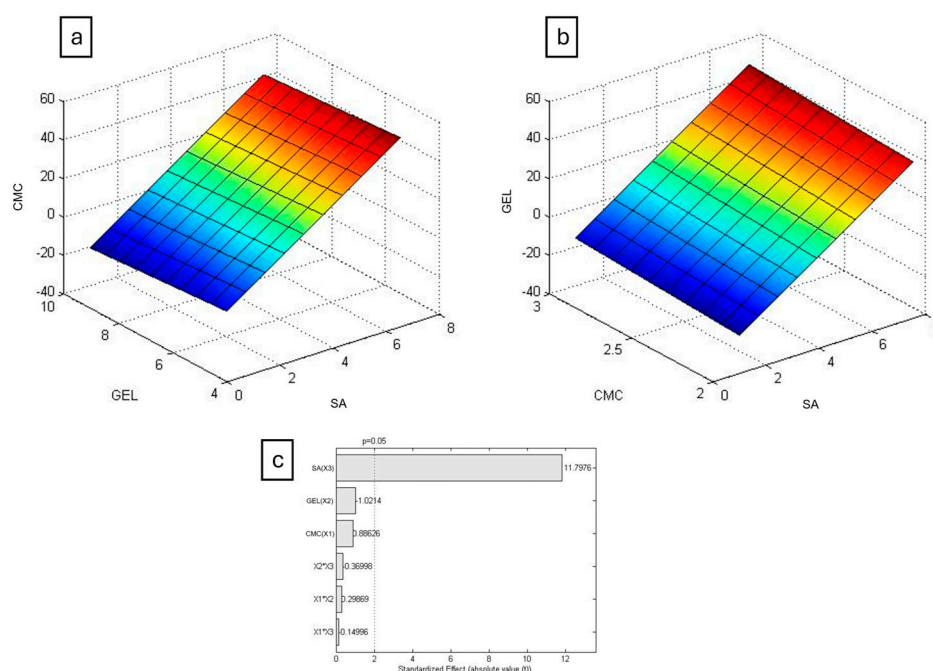
Figure 4 illustrates the swelling or degradation rates, representing the maximum weight gain or loss. It was also evident that hydrogels swelled more in PBS than in DMEM. The highest swelling rate observed in PBS was 37.41% for hydrogel 2, while in DMEM hydrogel 6 reached 13.26%. Hydrogel 13 exhibited the highest degradation rates in both PBS and DMEM, at -36.37% and -49.56%, respectively.



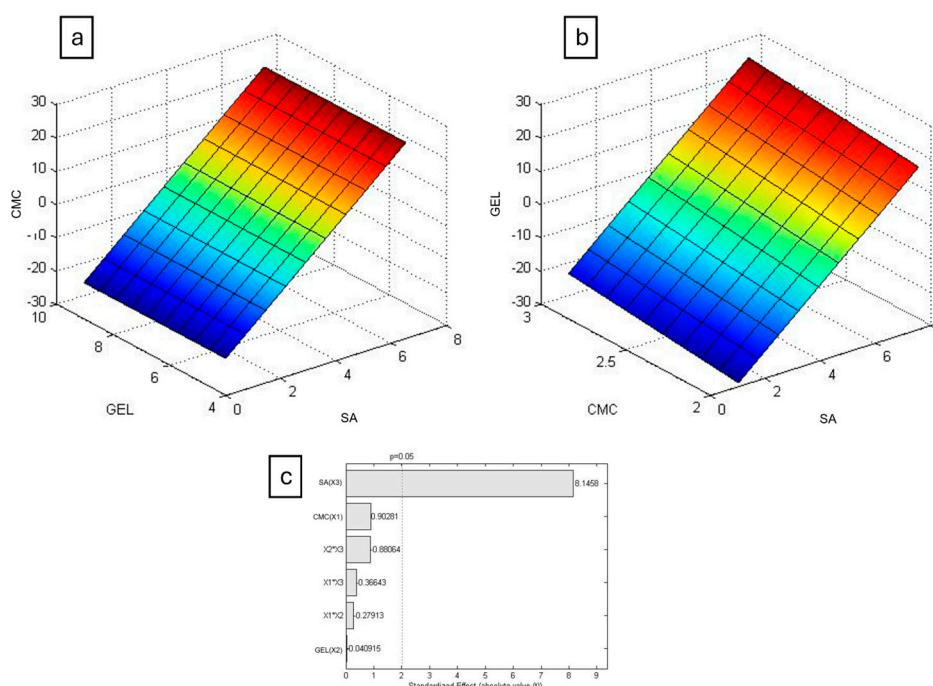
**Figure 4.** Fluid absorption rate of the 17 hydrogels produced using CCD in PBS (gray lines) and DMEM (pink lines).

A probable reason for the great swelling observed in PBS is the ion-exchange process between  $\text{Na}^+$  ions in PBS and  $\text{Ca}^{2+}$  ions bound to  $\text{COO}^-$  groups in the hydrogels. The exchange increases electrostatic repulsion between negatively charged  $\text{COO}^-$  groups, leading to chain relaxation and enhanced gel swelling [28].

The results were plotted in Chemoface to create a response surface (Fig. 5 and 6), a three-dimensional graph illustrating how the swelling degree varies with respect to the concentrations of the polymers used. For both PBS and DMEM, the concentration of SA was the only statistically significant factor, as previously suggested.



**Figure 5.** 3D Response surface graphs by a linear model produced using the swelling degree (SD) of the hydrogels in PBS. a) comparison between gelatin and alginate; b) comparison between carboxymethyl cellulose and alginate; c) Pareto's chart of the variables.  $P < 0.05$ . Graph generated by Chemoface software.



**Figure 6.** 3D Response surface graphs by a linear model produced using swelling degree (SD) of the hydrogels in DMEM. a) comparison between gelatin and alginate; b) comparison between carboxymethyl cellulose and alginate; c) Pareto's chart of the variables.  $P < 0.05$ . Graph generated by Chemoface software.

Alginate gelation occurs by the formation of a three-dimensional network, known as the egg-box model, when  $\text{Ca}^{2+}$  ions interact ionically with glucuronic acid residues, as proposed by Grant et al. (1973) [29]. It was observed that higher alginate concentrations resulted in firmer hydrogels, indicating that those mixtures achieved higher crosslinking rates, resulting in longer swelling times and lower degradation.



On the other hand, degradation likely occurs in the hydrogels once the  $\text{Ca}^{2+}$  ions are released into the swelling environment. This is because it has been demonstrated that the swelling/degradation capability in SA hydrogels, crosslinked with calcium chloride, such as the ones produced in this study, is related to this event [30].

In a previous study [31], various hydrogels were produced using a different strategy, which involved mixing them in ternary combinations of Agar:CMC:GEL, resulting in 36 different combinations, with the highest SD found to be 21.32% in PBS. However, by changing agar to SA and utilizing CCD, it was possible to reduce the number of tested hydrogels to 17 and increase the SD to 33.83%. This demonstrates the advantages of the strategy employed in this study.

### 3.3. Printability of the Hydrogels

The first step in producing a 3D printed object is to create a computer-aided design (CAD) model. This model is then processed by software that converts it into codes, which are sent to the 3D printers. Unfortunately, the final printed form rarely matches its CAD model, a discrepancy that can be attributed to several factors, primarily the printability of a hydrogel. In general terms, printability can be defined as the ability to form and maintain a reproducible 3D structure with dimensional integrity. Printability is a crucial parameter to consider when using hydrogels in 3D printing, as hydrogels with good printability can more efficiently reproduce biomimetic structures [32,33].

Among all the produced hydrogels, the two with the highest swelling in both fluids were chosen for the printability assay: hydrogel 6 (36.33% in PBS and 13.28% in DMEM) and hydrogel 14 (33.67% in PBS and 11.56% in DMEM). Interestingly, both hydrogels contained the highest concentrations of SA: 6.2% for hydrogel 6 and 7.5% for hydrogel 14. Hydrogel 8 also exhibited high SD, but it was not selected due to its tendency to degrade faster in DMEM than hydrogel 14.

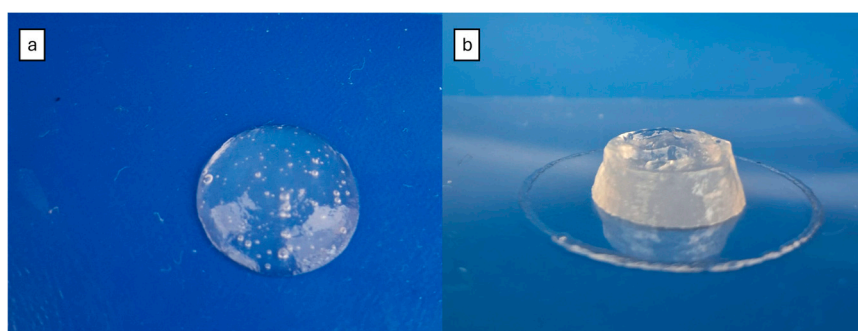
In manual extrusion tests, a two-dimensional (2D) assay, geometric forms were drawn and covered with the selected hydrogels to visually evaluate the hydrogel's behavior, such as the formation of lumps or merged structures. These are considered undesirable parameters for hydrogels intended for 3D bioprinting applications [31]. Figure 7 shows the two hydrogels after manual extrusion, with both exhibiting similar characteristics in the 2D assay.



**Figure 7.** Manually extruded hydrogels in different forms and shapes. a) hydrogel 6; b) hydrogel 14.

Therefore, a 3D printing assay was performed using the Engine HR from Hyrel 3D. Micro-extrusion-based 3D printing technique involves the layer-by-layer deposition of a biomaterial (hydrogel) through a nozzle. The process begins with the generation of a CAD model of the desired structure, which serves as the digital blueprint. The biomaterial is prepared and loaded into a syringe-like cartridge and pushed through a nozzle, following the CAD model to create an object with the desired shape. Then, printability was assessed comparing the original CAD model to the final printed structures.

The cylinder structure formed with hydrogel 6 completely collapsed, forming a single lumped structure (Fig. 8a). In contrast, hydrogel 14 was able to form a 3D structure, with defined perimeters and a visible cylindrical form (Fig. 8b), indicating that it is a more suitable hydrogel for 3D printing.



**Figure 8.** 3D printed hydrogels. a) hydrogel 6; b) hydrogel 14.

Despite enhancing the mechanical strength of 3D bioprinted constructs, the crosslinking process of hydrogels is time-consuming. While the printing process is ongoing, the hydrogel may be in liquid or semi-liquid form and, consequently, may not acquire the CAD form [34]. This is likely what happened to hydrogel 6, which presented a solid form with high swelling after crosslinking but proved to be unprintable.

Briefly, this study successfully optimized the production of hydrogels for 3D bioprinting using the CCD method. Hydrogel 14 emerged as the most promising candidate due to its swelling degree and 3D printability. These findings have significant implications for the development of advanced tissue engineering and drug delivery systems, with future research that can focus on further refining the hydrogel composition to enhance its mechanical properties and biocompatibility, as well as exploring its potential applications in various biomedical fields.

#### 4. Conclusions

The present study focused on optimizing hydrogel formulations for 3D bioprinting applications, using the CCD method to systematically evaluate 15 different hydrogel mixtures. Key parameters such as swelling behavior and printability were assessed, emphasizing the critical role of hydrogel composition in determining print success. Notably, a hydrogels demonstrated superior performance, maintaining its 3D structure without the need for crosslinking agents. The results bullet pointed below highlight the potential for further experimentation with printing parameters to enhance quality and reproducibility:

- This study aimed to optimize the production of hydrogels for 3D printing applications;
- By employing the CCD method, it was possible to systematically evaluated 15 different hydrogel formulations, focusing on their swelling behavior and printability;
- These findings highlight the importance of hydrogel composition in determining their suitability for 3D printing;
- The CCD proved to be an excellent choice for enhancing the production process of hydrogels;
- Out of the 15 different mixtures, two exhibited the highest SD in both PBS and DMEM in parallel: hydrogel 6, which contained 6.2% SA, 2.8% CMC, and 6% GEL; and hydrogel 14, which contained 7.5% SA, 2.5% CMC, and 7.5% GEL;

- Despite presenting a solid form when crosslinked with calcium chloride, hydrogel 6 collapsed during the 3D printing assay, while hydrogel 14 was able to maintain a 3D form even without the crosslinking agent;
- Therefore, hydrogel 14 is the most suitable for 3D printing process among all the studied mixtures;
- Further experiment with different printing speeds, nozzle sizes, and temperature settings to enhance print quality and reproducibility may be produced to better understand the 3D printing parameters.

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**Data Availability Statement:** Data are contained within this article.

**Conflicts of Interest:** “The authors declare no conflicts of interest.”.

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