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Characterization of the Santa Maria del Fiore cupola construction tools using X-ray fluorescence

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ABSTRACT

This paper presents the characterization of different tools employed in the construction of the Santa Maria del Fiore cathedral in Florence; they are part of the Opera di Santa Maria del Fiore collection and are currently exhibited in the Museo dell'Opera del Duomo. The analysed objects are turnbuckles, pulleys, three-legged lewises, and pincers; indeed, despite their uniqueness and their importance from the historical point of view, this study is the first one that investigates their alloys composition. Actually, this information can be of great interest for curators to find the best conservation strategies and to have new insights on the production techniques typical of the Renaissance. The study was performed using X-Ray Fluorescence (XRF) in order to identify the materials constituting the objects. Then, XRF spectra were analysed using chemometric techniques, namely Principal Components Analysis (PCA), in order to investigate possible similarities among different alloys and thus provide new indications to help collocating these tools in a specific historical period.

Section: RESEARCH PAPER

Keywords: X-ray fluorescence; PCA; non-invasive measurements; cultural heritage; metals; archaeometry

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1. INTRODUCTION

The Santa Maria del Fiore Cupola (Dome), located in Florence, is a unique Renaissance creation. Indeed, the Brunelleschi's Cupola is an extraordinary masterpiece, still being the biggest masonry dome in the world. Its dimension, together with the innovative construction project that led to its realization, made the Cupola one of the most famous buildings in history.

The history of the Santa Maria del Fiore Cathedral spans through a wide time frame and is a really complex one. In the 14th century Florence was a flourishing city, with the reputation of being one of the most important in Europe. The city wanted to increase its relevance, visibility and pride, in order to wipe out all the nearby competing cities. To this aim, the Florentine

citizens decided to build a very large cathedral, similar to the ones in the other most important European cities [1]-[3].

The history of the Santa Maria del Fiore Cathedral started with the Italian architect Arnolfo di Cambio, who developed the initial project and supervised the beginning of the construction in 1296. About 100 years later, just the main body was completed, without the facade and the dome. In 1418 an open competition started, to find a project for the construction of the biggest Cupola in the world. The competition ended only in 1420, when Filippo Brunelleschi was entrusted with the work. However, his project was always surrounded by skepticism [2]-[4].

Among the many challenges that Brunelleschi had to face, the main one was the size of the dome. Indeed, the regular techniques employed in the 14th century involved the use of internal support structures, which would not be possible for the construction of the Santa Maria del Fiore Dome. Due to their



Figure 1. Historical tools employed for the construction of the Santa Maria del Fiore cathedral in Florence. The instruments are displayed in the Museo dell’Opera del Duomo, Florence: a), b) turnbuckles, c) three-legged lewises, d), e) pulleys, f) pincers. Yellow circles indicate the analyzed areas.

size, these frameworks would have not been capable of supporting even their own weight.

Brunelleschi, who had spent many years studying the ancient roman architectural techniques in Rome, in order to solve this major issue, together with many other challenges related to the project, found a way to build a self-supporting double-walled dome, thanks to the insertion of particular pattern of bricks, called “a spina di pesce”. The construction was carried on employing suspended platforms which were progressively moved up along with the construction [1]-[8].

Another remarkable novelty employed by Maestro Brunelleschi was the design and development of specific machines and tools, that were used on the construction site. The employment of these new tools, used to lift the building materials, allowed to save both time and money.

Today, some of these unique tools, such as pulleys, turnbuckles, pincers, winches, and ropes, are part of the Opera di Santa Maria del Fiore collection, exhibited in the Museo dell’Opera del Duomo, in Florence.

Even if these tools were a great innovation for the Duomo project, they did not attract the attention of researchers so far. Nevertheless, these unique objects and their history could provide important information regarding the production techniques and the materials employed during the Brunelleschi era.

For instance, a lot of information can be deduced from a visual inspection of the tools, by comparison with the historical sources. Indeed, it is possible to find drawings of similar tools made by Taccola, Francesco di Giorgio, Bonaccorso Ghiberti, Giuliano da Sangallo and even in the Codex Atlanticus by Leonardo da Vinci [1], [9]. On the other hand, the provenance, the materials and the production techniques of some of these tools are more complex to reconstruct. In such cases, conservation science and engineering can provide useful tools to reconstruct these tools’ history. Indeed, tailored analytical strategies can be applied to investigate the constituent material and to develop specific conservative approaches [10]-[12].

In this paper, the first characterization of these construction tools with a non-invasive and in-situ approach is presented. A previous study has examined the preliminary results from the X-rays fluorescence analyses performed on these objects [13]. In the present manuscript a complete survey of the constituent

materials is provided, discussing the possible role of different elements in the alloys. Then, obtained data were processed using multivariate analysis to find possible similarities in the spectra acquired on different tools and thus formulate hypotheses on the historical collocation of these objects.

2. MATERIALS AND METHODS

This Section presents the characterized historical tools and the analytical techniques employed in the study; moreover, the performed data analysis is described in detail.

2.1. Historical tools under study

This study is focused on thirteen objects which are part of the Opera di Santa Maria del Fiore collection and are currently exhibited in the Museo dell’Opera del Duomo, in Florence. They are tools and equipment that were used in the construction of the Santa Maria del Fiore cathedral. As previously discussed, the construction of this building took several centuries, so it is difficult to collocate each of the tools in a specific historical period. The investigated objects are two turnbuckles, eight pulleys, two three-legged lewises and a pincer. The photographs of some of the characterized tools are shown in Figure 1, where some of the points of analysis are marked.

2.2. X-ray fluorescence

All objects were characterized using X-ray fluorescence in order to investigate the composition of the constituent materials. Measurements were performed using a Bruker Tracer 5i analyser, which allowed to perform non-invasive measurements without moving the tools from their collocation in the Museum. The instrument is equipped with a 20 mm² silicon drift detector and a Rhodium (Rh) anode. The Ti-Al filter was used in order to reduce the intensity of peaks related to Rhodium and Palladium (Pd) [14]. Analyses were carried out using a voltage of 40 kV and a current of 40 μA, with the 3 mm collimator. Spectra processing and elements identification were performed using Artax Spectra (8.0.0.476) software.

2.3. Multivariate analysis

In order to investigate similarities among different alloys, acquired spectra were processed by means of Principal Component Analysis (PCA). Using this chemometric technique

it is possible to identify patterns in acquired measurements and classify spectra in different groups. PCA was performed on XRF spectra using a Python script, as described in [15], by means of the Scikit-learn library [16]. Before computing the Principal Components (PCs), spectra were pre-processed as follows:

- 1) the interval of interest was limited to the range from 1 keV to 12.2 keV for iron alloys and from 1 keV to 15.5 keV and from 24.5 keV to 30 keV for bronzes. Actually, in these energy ranges all significant peaks for the two materials are present and thus only relevant parts of the spectra are included in the PCA.
- 2) Spectra baseline was subtracted using the embedded function in the Artax Spectra software.
- 3) Signal-to-noise ratio was improved applying the Savitzky-Golay filter [17]. A second order polynomial and a window length of 90 eV were used in order to avoid any over-smoothing.
- 4) Spectra were normalized using the Standard Normal Variate Transformation (SNVT) [18].

After performing the pre-processing, principal components were computed and results were graphed as biplots, in which

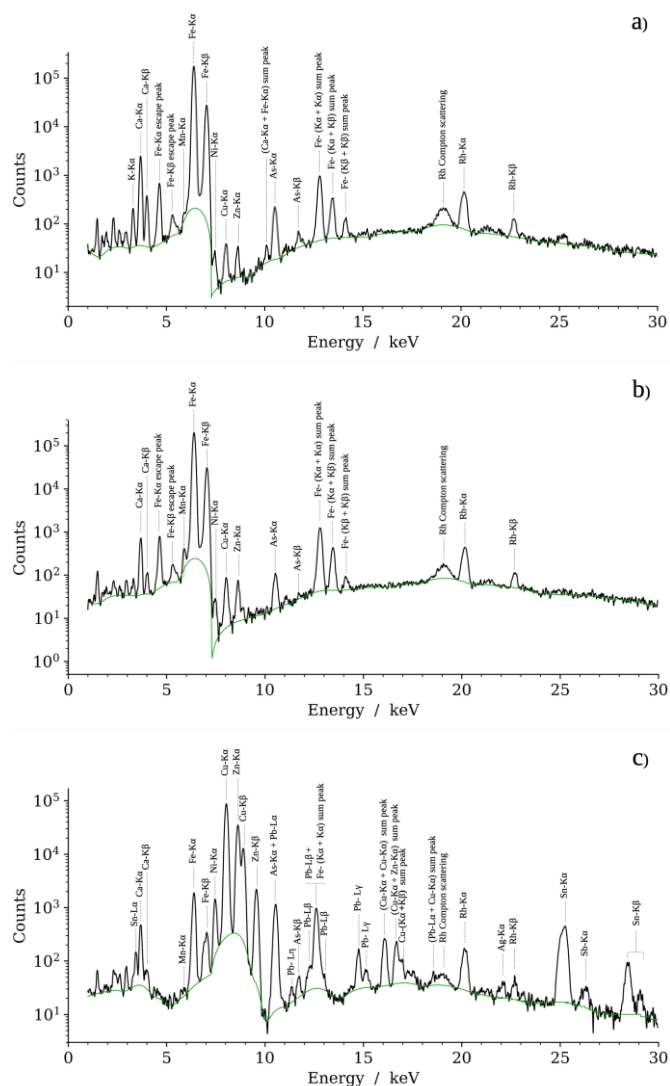


Figure 2. XRF spectra collected on pulleys: frame of one of the 'wooden' pulleys (a), main body of one of the 'metallic pulleys' (b), wheel of one of the 'metallic pulleys' (c). The black line is the acquired spectrum, while the computed baseline is in green.

eigenvalues for different spectra are plotted. Similarities among different spectra were evaluated using a Gaussian mixture model probability distribution and confidence ellipses were accordingly drawn using the *sklearn.mixture.GaussianMixture* class from the Scikit-learn library.

3. RESULTS AND DISCUSSION

3.1. Alloys identification

XRF analyses were performed on all investigated tools choosing different points of interest on each object. The primary goal was to identify the alloys constituting the different parts of the tools.

Most of the analysed objects are pulleys, as these tools were commonly used in the cathedral construction site during the centuries and many of them are still preserved in the museum. It is interesting to notice that two kinds of pulleys can be identified among those present in the Museum collection: one is characterized by both the main body and the wheel made in wood (shown in Figure 1e), and the other is made completely in metal (shown in Figure 1d). Even if at a first glance it could appear easy to collocate the two typologies of pulleys in different historical periods, the only available information in literature dates also the metallic pulleys to the Renaissance era [3]. So, this simple example further highlights the need for an archaeometric approach to study these important tools.

Figure 2 shows some representative spectra acquired on different pulleys. In Figure 2a, the spectrum acquired on the metallic frame of a wooden pulley is reported; as can be seen in Figure 1e, this typology of pulleys had a metallic frame needed to hold and anchor the tool. The material can be identified as an iron alloy, considering the two main peaks at 6.40 keV and 7.06 keV, which correspond to characteristic $K\alpha$ and $K\beta$ lines of iron respectively. The material is then characterized by the presence of manganese, copper, zinc, and nickel demonstrated by the presence of peaks at 5.90 keV ($Mn-K\alpha$), 8.05 keV ($Cu-K\alpha$), 8.64 keV ($Zn-K\alpha$), and 7.48 keV ($Ni-K\alpha$) respectively. Finally, it is possible to identify calcium by the 3.69 keV and 4.01 keV peaks, corresponding to the $K\alpha$ and $K\beta$ emission lines, and potassium ($K\alpha$ 3.31 keV); these are present in all acquired spectra and can be related to environmental contamination.

Additional peaks are present at higher energies. In particular a triplet of peaks can be attributed to iron sum peaks, i.e., 12.81 keV ($K\alpha + K\alpha$), 13.46 keV ($K\alpha + K\beta$), and 14.12 keV ($K\beta + K\beta$). Moreover, the couple of peaks at 4.67 keV and 5.32 keV can be assigned to the Fe-K lines escape peaks.

Furthermore, the peaks related to the rhodium anode can be identified by the $K\alpha$ and the $K\beta$ lines at 20.22 keV and 22.72 keV respectively. The broad peak at 19.06 keV can be attributed to the Compton scattering of the Rh characteristic photons.

Arsenic is present too, as can be seen from the presence of the peaks at 10.54 keV ($K\alpha$) and 11.72 keV ($K\beta$). For these peaks, the K shell intensity ratios ($K\beta/K\alpha$) is respected, as it has an average value close to 0.14 [19]. Arsenic was a common contaminant in iron ores and thus was often present in iron alloys [20], [21].

The spectrum acquired on the main body of a metallic pulley is then presented in Figure 2b. In this case, too, it can be identified as an iron alloy, in which most of the peaks mentioned for the spectrum in Figure 2a can be found. At the same time, the relative intensity of peaks changes with respect to the ones in the spectrum shown in Figure 2a.

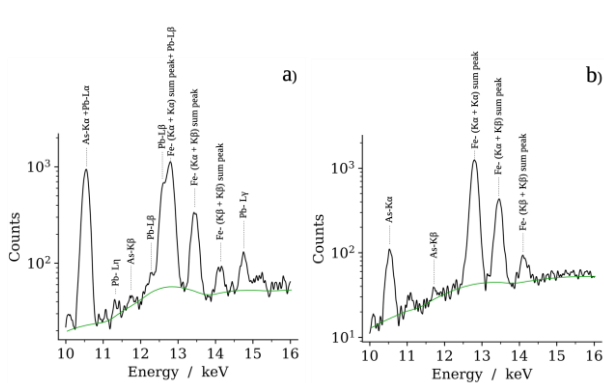


Figure 3. Comparison of two spectra acquired on different pulleys: on the left, the spectrum corresponding to 'Pulley 6', where lead and arsenic are present; on the right, spectrum acquired on one of the remaining pulleys, characterized by the presence of arsenic but not lead. Only the energy interval from 10 keV to 16 keV is reported. The black line is the acquired spectrum, while the computed baseline is in green.

It is worth noticing that for the three points of analysis acquired on one of the metallic pulleys (referred in the next section as 'Pulley 6'), a different spectrum was obtained. The material can be identified as an iron alloy, characterized by the additional presence of lead. In Figure 3a a detail of a spectrum obtained from this pulley is reported. Lead can be identified considering different features. First, it is possible to notice that the arsenic $K\beta$ over $K\alpha$ ratio is not respected, thus deducing that the peak at 10.55 keV is due to the overlapping of both the $Pb-L\alpha$ and $As-K\alpha$ lines. Furthermore, it is possible to notice the presence of a left shoulder on the sum peak of iron ($K\alpha + K\alpha$) at 12.61 keV, corresponding to the $Pb-L\beta$ line. Other characteristic Pb lines are identified at 11.35 keV and 14.76 keV, being the $Pb-L\eta$ and $Pb-L\gamma_1$ respectively. A spectrum showing the same energy interval acquired on one of the pulleys without lead is reported in Figure 3b; in this case, the left shoulder on the sum peak of iron at 12.61 keV is not present.

In Figure 2c the spectrum acquired on the wheel of one of the metallic pulleys is shown. It is possible to describe the material as a lead bronze, i.e., an alloy containing copper, tin, and lead. Most of the peaks previously described for Figure 2a are present also in this spectrum, except for the escape and sum peaks of iron. Moreover, there is the additional presence of the characteristic peaks of lead ($L\alpha$ -10.55 keV, $L\eta$ -11.35 keV, $L\beta_6$ -12.14 keV, $L\beta_4$ -12.31 keV, $L\beta_1$ -12.61 keV, $L\beta_5$ -13.01 keV, $L\gamma_1$ -14.76 keV, $L\gamma_6$ -15.18 keV), silver ($K\alpha$ -22.16 keV), tin ($K\alpha$ -25.27 keV, $K\beta_1$ -28.48 keV and $K\beta_2$ -29.11 keV), and antimony ($K\alpha_1$ -26.36 keV). The remaining peaks can be identified as sum peaks, e.g., 16.06 keV ($Cu-K\alpha + Cu-K\alpha$), 16.67 keV ($Cu-K\alpha + Zn-K\alpha$), 16.97 keV ($Cu-K\alpha + Cu-K\beta$), and 18.61 keV ($Pb-L\alpha + Cu-K\alpha$).

An interesting case study is then represented by the two turnbuckles, which are of great importance both from the technical and historical points of view. These tools constituted a great innovation that allowed to lift heavy loads in a smooth and controlled way. Moreover, they substituted steel rods for the stone positioning, reducing the risk of chipping them during this operation. Their historical importance is then testified by their representation in different collections of drawings in the Renaissance era, as an example in the 'Taccuino senese' by Giuliano da Sangallo [22].

As can be seen in Figure 1a and Figure 1b, turnbuckles are composed of different parts, namely the central screw, the nut,

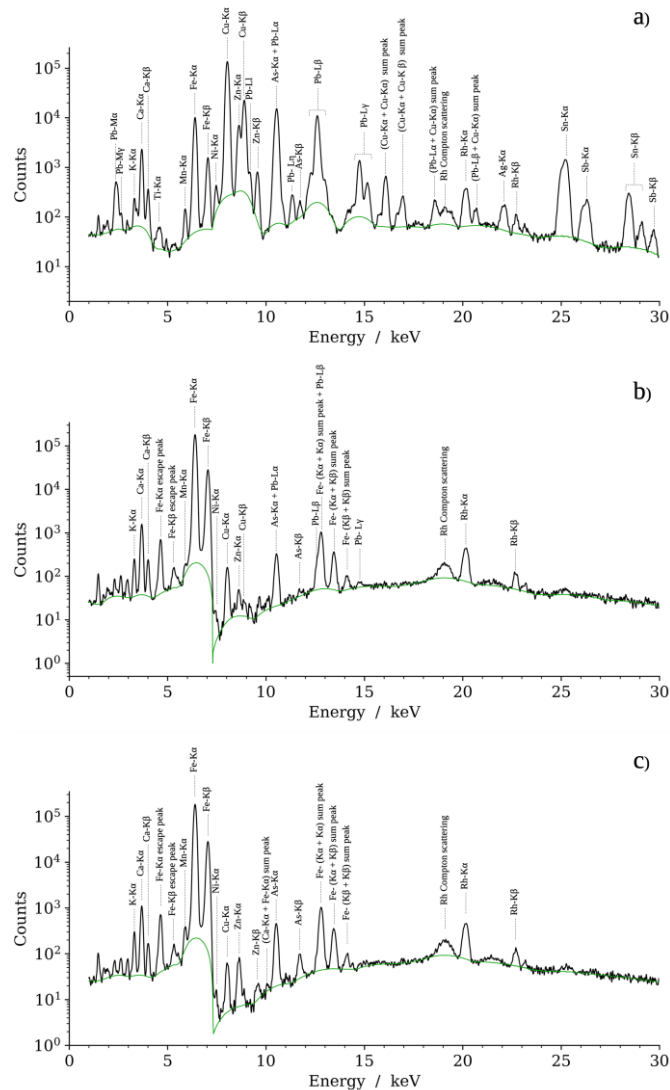


Figure 4. XRF spectra collected on the two turnbuckles: nut of Turnbuckle1 (a), one of rods on Turnbuckle1 (b), nut of Turnbuckle 2 (c). The black line is the acquired spectrum, while the computed baseline is in green.

the hook, and two connecting rods. Threaded components are particularly important in this investigation as they can give new insights on the production routes typical of the Renaissance era and can provide hints to date the objects. During that period threaded parts were mainly realized in bronze, as this alloy has good machinability using steel tools. For this reason, threaded components made in iron should belong to a later period. The most representative spectra collected on the two turnbuckles are shown in Figure 4. The nut of the 'Turnbuckle1' (Figure 1a) is constituted by a bronze alloy. This was identified by the presence of the major elements as copper ($K\alpha$ -8.05 keV and $K\beta$ -8.90 keV), tin ($K\alpha$ -25.27 keV, $K\beta_1$ -28.48 keV and $K\beta_2$ -29.11 keV), zinc ($K\alpha$ -8.64 keV and $K\beta$ -9.57 keV), and lead. Lead can be identified through several peaks in the spectrum: $M\alpha$ -2.34 keV, $M\gamma$ -2.65 keV, $L\eta$ -9.18 keV, $L\alpha$ -10.55 keV, $L\eta$ -11.34 keV, $L\beta_6$ -12.14 keV, $L\beta_4$ -12.30 keV, $L\beta_1$ -12.61 keV, $L\beta_5$ -13.01 keV, $L\gamma_1$ -14.76 keV, $L\gamma_6$ -15.17 keV. Other elements are present too, such as iron ($K\alpha$ -6.40 keV and $K\beta$ -7.06 keV), nickel ($K\alpha$ -7.48 keV), antimony ($K\alpha_1$ -26.35 keV and $K\beta_1$ -29.71 keV), arsenic ($K\alpha$ -10.54 keV and $K\beta$ -11.72 keV), manganese ($K\alpha$ -5.90 keV), calcium ($K\alpha$ -3.69 keV and $K\beta$ -4.01 keV), and potassium ($K\alpha$ -3.31 keV).

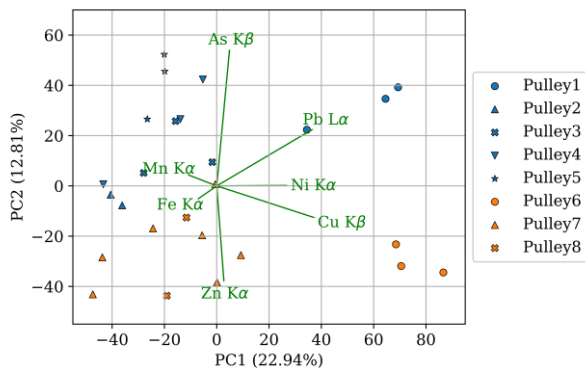


Figure 7. Score and loading plot of the first two components (PC1-PC2) calculated from XRF spectra acquired on pulleys. Pulleys labelled from 1 to 5 are 'wooden' pulleys (see Figure 1e), while those from 6 to 8 are the 'metallic' ones (see Figure 1d). Percent variance captured by each PC is reported in parenthesis along each axis.

characterized by higher values of arsenic and manganese. On the other hand, metallic pulleys are characterized by lower values for PC2, due to higher concentration of zinc.

PCA processing was then performed on spectra acquired on bronze components (see Figure 8). As it is possible to observe, in this case a clear clustering was found, as highlighted by the confidence ellipses drawn according to the Gaussian mixture model for probability distribution. Spectra acquired on the wheels of the metallic pulleys are characterized by a higher amount of zinc, tin and nickel. On the contrary the bronze used for the nut of the 'Turnbuckle1' has a higher concentration of lead, antimony and iron. This is an important finding because the drawing of a turnbuckle noticeably similar to 'Turnbuckle1' is present in the 'Taccuino senese' by Giuliano da Sangallo [22]. So, if we assume that the metallic pulleys presumably do not belong to the Renaissance era, as can be argued considering their design, this clear difference in the bronze composition can be taken as a confirmation for the attribution of this turnbuckle to the Brunelleschi era.

Finally, last PCA processing was performed on the iron alloy spectra collected on the two turnbuckles in order to investigate possible similarities or differences among their constituent materials; the result is presented in Figure 9. As can be seen, it is possible to draw two confidence regions. The first one, smaller, contains the spectra collected on 'Turnbuckle1' except those acquired on the hook and on the arch where the two connecting

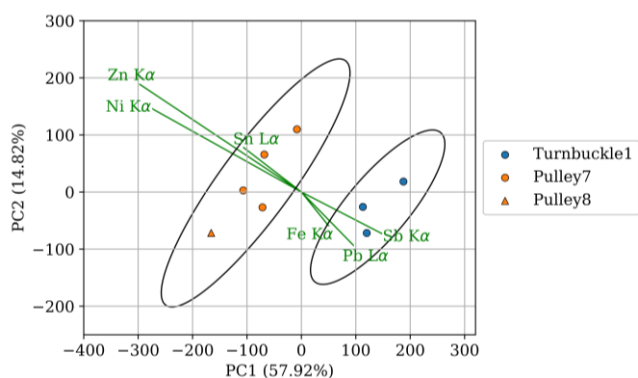


Figure 8. Score and loading plot of the first two components (PC1-PC2) calculated from XRF spectra acquired on bronze components. Percent variance captured by each PC is reported in parenthesis along each axis.

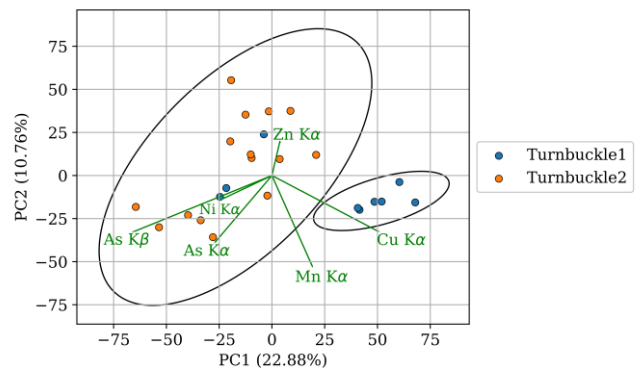


Figure 9. Score and loading plot of the first two components (PC1-PC2) calculated from XRF spectra acquired on iron parts of the two turnbuckles. Percent variance captured by each PC is reported in parenthesis along each axis.

rods are nailed. Actually, these three spectra fall in the other confidence region, which includes all points of analysis taken on 'Turnbuckle2'. The alloy used for 'Turnbuckle1' is richer in copper and manganese, while the other has a higher relative concentration of zinc, arsenic and nickel. This particular clustering can be explained considering that investigated objects were tools used in everyday works, so it was not uncommon to perform repairs or to substitute broken parts. Thus, it is possible to conclude that the two components (the hook and the arch) belonging to 'Turnbuckle 1' but falling in the 'Turnbuckle 2' confidence ellipse could have been substituted in a more recent period, using an alloy similar to the one constituting 'Turnbuckle 2'.

Analysing by means of PCA also the remaining tools, it was not possible to highlight any relevant clustering; the only observable grouping was related to spectra collected on the same object. So, no other analogies were found among alloys.

4. CONCLUSIONS

This study analysed some of the tools employed in the construction of the Santa Maria del Fiore Cupola. Thanks to X-Ray Fluorescence measurements, it was possible to investigate, for the first time and with a totally non-invasive approach, the composition of the alloys constituting these objects, which have a primary importance both from the technical and historical point of view. Then, thanks to chemometric analysis, analogies and differences among alloys were examined. It was possible to discriminate between the different iron alloys employed for the pulleys, which can be discriminated in two typologies belonging to different historical times. The use of PCA allowed also to highlight the presence of two bronze alloys (one used for threaded components and one for the wheels of the metallic pulleys) and two iron alloys used for the turnbuckles. The use of XRF analysis does not allow to draw univocal conclusions on dating of these objects, as this technique is not even specifically intended for this purpose. Anyway, these findings, if supported also by historical sources and by the work of curators, can give new insights on the world of technology in the Renaissance era.

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