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1 Oriented granulometry to quantify fibre orientation distributions in synthetic and

## 2 plant fibre composite preforms

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- 4 Victor Gager <sup>1,2</sup>, David Legland <sup>3</sup>, Alain Bourmaud <sup>1</sup>, Antoine Le Duigou <sup>1</sup>, Floran Pierre
- 5<sup>2</sup>, Karim Behlouli<sup>2</sup>, Christophe Baley<sup>1</sup>
- 6
- 7 <sup>(1)</sup> Univ. Bretagne Sud, UMR CNRS 6027, IRDL, F-56100 Lorient, France
- 8 <sup>(2)</sup> Eco-technilin SAS, ZA Caux Multipôles, 76190 Valliquerville, France
- 9 <sup>(3)</sup> UR1268 Biopolymères Interactions Assemblages, INRA, F-44316 Nantes, France

#### 10 Corresponding author: alain.bourmaud@univ-ubs.fr

11

## 12 Abstract

13 Fibre orientation is an essential factor governing the mechanical properties of composite 14 materials. This study proposes an original method based on gray-level granulometry to 15 analyse the fibre orientation distribution (FOD) of synthetic and natural fibre 16 reinforcements aiming composite applications. An orientation maps is computed from 17 SEM images and frequency of fibre orientation is graphically illustrated for each 18 angular direction. First, glass fibre nonwoven and unidirectional preforms were 19 analysed as a model to validate the method before testing their flax fibre counterparts. 20 Differences in structural organisations were found between flax and glass fibre 21 reinforcement FOD due to the specific structure and mechanical behaviour of plant 22 fibres but also to the preform manufacturing process. Promising results were obtained 23 confirming the reliability of this novel numerical method for fibre orientation 24 determination.

26 Keywords: Biocomposites; Preforms; Fibre Orientation Distribution; Flax fibre,

#### 27 Microstructure analysis; Nonwovens;

28

#### 29 **1. Introduction**

30 Flax fibres are now widely used as reinforcements for semi-structural and structural 31 composite applications (Shah et al., 2013). Their specificities (low density, good 32 mechanical properties, particular structure, low environmental impact, etc.) make them 33 a very attractive alternative to synthetic fibres (Bourmaud et al., 2018). Flax fibres are 34 commercially available for extrusion, injection moulding or as structured preforms for 35 infusion and compression moulding such as unidirectional, multi-directional woven 36 fabrics and also nonwoven mats. Selection of preforms can be managed depending on the properties and expected end applications. Nonwoven composites are mainly used in 37 38 the automotive industry as interior parts because they combine good mechanical and 39 acoustic properties (Merotte et al., 2016) but also thanks to their low manufacturing cost 40 compared to fabrics. Composites performances are usually defined by the 41 reinforcement, matrix and fibre/matrix interface properties (Jones, 1999). In terms of 42 mechanical properties, additional parameters such as fibre volume ratio, fibre 43 architecture and individualisation, porosity content as well as fibre orientation are of 44 great importance. For this later, it is even more true when dealing with nonwoven 45 biocomposites where the fibre orientation distribution can be considered as quasi 46 isotropic (Gnaba et al., 2018). Still, depending on the manufacturing method and 47 especially with carding process, they can highlight preferred orientations (Miao and 48 Shan, 2011; Russell, 2007). Also, during a mechanical loading, fibres will be loaded 49 differently depending on the orientation distribution. Due to their structure, flax fibres 50 highlight high anisotropic properties and longitudinal, transverse and shearing 51 properties of flax elementary and technical fibres (bundles) (Baley et al., 2006;

52 Thomason et al., 2017) that could greatly influence the overall composite's behaviour

53 and properties (Gager et al., 2019; Merotte et al., 2018).

54 Through research work around the world, there is now a good knowledge based on 55 nonwoven composites, particularly in terms of the influence of the type of 56 reinforcement, their microstructure and their various properties (Martin et al., 2016; 57 Merotte et al., 2016; Mieck et al., 1996). However, to allow optimised structural and 58 semi-structural applications, modelling and designing tools of these materials are 59 required. In terms of modelling mechanical properties, one of the major challenges to be 60 addressed is the implementation of fibre orientation and curvature. To do this, it is 61 necessary to rely on trusted data that can only be determined experimentally from 62 existing preforms.

63 Several studies have focused on the determination of the fibre orientation distribution 64 for various materials including fabrics, paper or fibre reinforced polymers. Acquisition 65 of images with digital cameras, optical, electronic or confocal microscopes are the most commonly used (Enomae et al., 2006; Erdman et al., 2016; Koh and Madsen, 2018). 66 67 Miao and Shan (Miao and Shan, 2011) have studied the relationship between fibre 68 orientation and mechanical properties of flax nonwoven composites thanks to optical microscopy imaging and then analysis Fiji<sup>®</sup> image processing software. Other methods 69 70 such as ultrasound scanning and X-ray Computed tomography were used by Smith et al. 71 to create 3D representations of carbon fibre composite plates (Smith et al., 2015). From 72 synchrotron radiation-based micro-computer tomography, Graupner et al. (Graupner et 73 al., 2016, 2014) characterised the fibre orientation of cellulose fibre-reinforced 74 polylactide composites by analysing the in-plane fibre orientations of several slices 75 through the thickness of the composite. All acquisition techniques can be justified 76 depending on the aim of the observation afterward. Indeed, different methods will allow 77 to get 2D or 3D images, characterise diverse surface areas from micro to macro scale,

78	with more or less precision and contrasts. Some techniques are also more suitable for
79	the analysis methods through which they will then be computed to determine the
80	orientation of the fibres (i.e. gray level or colour images) (Syerko et al., 2019).
81	Methods applicability must also be evaluated depending on the morphology of the
82	reinforcing fibres. Depending on the required performances and on their final use
83	application, composites can be reinforced with short or continuous fibres. For the first
84	category, the fibre orientation will mainly be a result of the flow of the suspension
85	within the polymer during the process. For long, continuous fibre composites, the
86	orientation will be given by the structure of the preform (i.e. woven fabrics, nonwoven
87	preforms etc) as well as the structure of the long fibres which will govern their
88	straightness. Plant fibre reinforcement potentially being made of both bundles or
89	individual fibres (Baley et al., 2019); diameters are also of great importance. Thus, to be
90	consistent, fibre orientations quantification methods must correctly identify the
91	reinforcing elements (individual fibres, bundles) as well as their curvature and take the
92	fibre morphological characteristics (diameter and length) into account.
93	The main method used to determine the fibre orientation distribution in long fibre
94	reinforced composites is the Fast Fourier Transform (FFT) whose efficiency is
95	discussed in the literature (Ghassemieh et al., 2002; Pourdeyhimi and Kim, 2002). Due
96	to the periodic character of the Fourier transformation, this method is useful to describe
97	regular patterns in woven fabric where information is concentrated in the Fourier
98	spectrum in the vertical or horizontal direction, respectively. In contrast, purely random
99	orientation of fibres causes the frequency components in the power spectrum to be
100	approximately isotropic and possess a nearly circular shape (Yousfani et al., 2012).
101	Tunák et al. (Tunák et al., 2014; Tunák and Antoch, 2018) highlighted that the "global"
102	approach commonly used was not suitable enough to analyse nonwoven textiles or
103	nanofibrous layers, which often present non-homogeneity as well as anisotropy, and that

104 further detailed analysis were more convenient. By automatically splitting the image 105 into several small sub-images and analysing them, they increased the efficiency of the 106 determination of the (fibre orientation distribution) FOD for textiles with several peaks 107 of orientations. However, results obtained with FFT based methods are very dependent 108 of the applied algorithms and smoothing filters (Kratmann et al., 2009). Furthermore, 109 this method needs a strong contrast between the background and the fibres which works 110 relatively well with fibres such as polymeric or metallic and synthetic fibres. In the case 111 of natural fibres, contrast can vary significantly, even one a singular fibre, because of its 112 structure and biochemical composition which may bias the results. Other methods such 113 as the stereological method can be used; the composite is observed in its crossed 114 direction and the orientation of a circular fibre is determined from the ratio of the 115 ellipse formed by the orientation of a fibre (Eberhardt and Clarke, 2001; Jeon et al., 116 2014; Yurgartis, 1987). This method does work for circular diameter fibre such as a 117 glass fibre but it cannot be applied to plant fibres which present complex heterogeneous 118 structures. Furthermore, as it is only at one location in the in-plane direction, curvature 119 of the fibre cannot be determined. Local gradient orientation method can also be used 120 but this way is questionable as only fibre edges are detected by filtering operators which 121 means fibre widths are not taken into account and this is a predominant information 122 when dealing with plant fibres. Other methods such as structure tensor (Krause et al., 2010; Van Kempen et al., 1999) or mean intercept length (Luo et al., 1991; Sander and 123 124 Barocas, 2009) methods were also applied on composite materials and each of them has 125 its own benefits and drawback from the complexity to the accuracy of the method 126 (Syerko et al., 2019).

127 Despite their applicability to analyse composite materials, the methods previously 128 enounced are usually programmed in operating systems/software for which it is not 129 possible to manage settings such as the time of calculation and the accuracy of the 130 results. Also, depending on the applications, there is a need of a method where such

131 parameters can be managed. For scientific matters, the accuracy of the results is 132 prevalent. From an industrial point of view, a method quantifying the fibre orientation in a preform directly after the production in order to control its conformity might be of 133 134 great interest. For this purpose, even if accuracy is important, the time of calculation is a 135 predominant factor if there is a large area to analyse. Moreover, by developing a method 136 for which there is a full understanding of the protocol, it is easier for the developers to 137 modify calculation algorithms to make them more efficient according to the material 138 characteristics.

This paper presents an original method based on gray-level granulometry to analyse the fibre orientation distribution of both synthetic and flax preforms for composite reinforcement. After a validation of the method developed on glass fibres unidirectional (UD) and nonwoven preforms, results obtained with similar flax fibre preforms are shown and discussed.

144 **2.** Materials and methods

#### 145 2.1 Materials

146 Flax (Linum usitatissimum) tows and scutched fibres grown in Normandy (France) were 147 used to produce the nonwoven and the unidirectional tape (Martin et al., 2014). Natural 148 fibre nonwovens were manufactured according to the carding/over-lapping/needle 149 punching technology (Russell, 2007) whereas the unidirectional tape is produced by a 150 specific process well described by Khalfallah et al. (Khalfallah et al., 2014). The materials (i.e. nonwoven and UD tape), coming from Eco-Technilin SAS<sup>®</sup>, have an 151 areal weight of respectively 70 g.m<sup>-2</sup> and 110 g.m<sup>-2</sup>, respectively. E-Glass fibre mat and 152 153 unidirectional fabric made respectively following air blowing (Russell, 2007) and 154 weaving technologies were also studied to validate the method. They were supplied by Composite Distribution and have both an areal weight of 200 g.m<sup>-2</sup>. The unidirectional 155

156 fabric is not a pure UD fabric as it presents a few fibres in the weft direction (weight

- 157 fraction around 0.4%). Names and properties related to the different preforms are given
- in table 1.
- 159

## Table 1. Characteristics of the various preforms analysed.

Name	Туре	Fibre type	Areal weight (g/m <sup>2</sup> )	Preform thickness (μm)	Fibres/bundles length (mm)	Preferred orientation (°)
Flax UD	Unidirectional	Flax	70	150 ± 20	Bundles assembly	Longitudinal
Flax NW	Nonwoven	Flax	110	200 ± 10	50-200	Cross direction (CD)
Glass UD	Unidirectional	Glass	200	190 ± 20	continuous	Longitudinal
Glass mat	Nonwoven	Glass	200	460 ± 40	40-70	None

160

161 2.2 Scanning Electronic Microscope Imaging

162 SEM observations were performed on glass and flax preforms. Rectangular samples

163 (60x40 mm) were sputter-coated with a thin layer of gold in an Edwards Sputter Coater

and analysed with a Jeol JSM 6460LV SEM at 20 kV.

165 2.3 Images Analysis Methodology

166 Images were analysed by computing the histogram of the preferred orientation of pixels.

167 The preferred orientation is computed by applying gray-level granulometry curves with

168 various orientations, computing a typical size in each direction, and estimating the

169 preferred orientation from typical sizes.

170

## Figure 1.

171 Gray-level granulometry is an approach for image texture analysis based on the

172 application of morphological filters (typically opening or closing) of increasing size

- 173 (Devaux et al., 2008; Soille, 2003). Gray-level morphological opening is an operation
- 174 that removes bright structures that are smaller than the structuring element. Let us denote
- 175 by  $\gamma_B(I)$  the result of morphological opening with structuring element  $B_{\lambda}$  of size  $\lambda$  on the
- 176 image I. The computation of granulometry involves a family of structuring elements

177  $\{B_{\lambda_i}\}_{i=1,...,n}$  of increasing sizes  $\lambda_i$ . The result obtained with each size  $\lambda_i$  is summarised by 178 the image volume curve  $V_i$ , that corresponds to the sum of the gray level values in the 179 corresponding result of opening. The derivative of the image volume curve results in 180 granulometric curves that can be interpreted in terms of size distribution:

181 
$$G_i = \frac{V_{i+1} - V_i}{V_{\infty} - V_0}$$

Figure 1 presents an example of granulometric curve computed on a sample image of a flax fibres nonwoven. A peak can be noticed around 5 pixels, that corresponds to the thickness of the majority of fibres visible in image. Another peak can be noticed around 15 pixels, corresponding to thicker fibres. The corresponding fibres are visible on the top images.

187 A granulometric curve can be summarised by a gray-level mean size that depicts the

188 typical size of the structures within the image. The geometrical mean  $m_G =$ 

189  $\exp[\sum_i \log \lambda_i G_i]$  was considered, which resulted in values closer to the centre of the peak

190 than the mean or the median (Devaux et al., 2008).

191 Gray-level granulometry is typically computed using structuring elements with square or

192 disk shapes. In order to assess the preferred orientation of texture, linear structuring

193 elements with various orientations may be used (Devaux et al., 2008; Legland et al.,

194 2012; Soille, 2003). Families of linear structuring elements were considered; they are

195 obtained by identifying the pixels around the line with orientation  $\theta$  containing the origin,

196 and keeping the number of pixels that best approximates the expected length. The

197 computation of granulometric curves on the whole image using linear structuring

198 elements with various orientations results in a granulometric curve for each orientation.

199 The computation of geometric means results in a function  $m_G(\theta)$  that depicts the typical

200 size depending on the orientation.

201

#### Figure 2.

In order to compute preferred orientation for a given pixel, it is necessary to compute 202 203 locally (i.e. for each pixel) the functions  $m_G(\theta)$ . In practice, this requires to replace the 204 computation of global image volumes  $V_i$  by their local counterparts  $V_i(x, \theta)$ , where x 205 corresponds to the pixel position and  $\theta$  corresponds to the orientation. Resulting 206 granulometric curves  $G_i(x, \theta)$  can be summarised by computing for each pixel and for each orientation the local oriented gray-level mean size  $m_G(x, \theta)$ . Fig. 2.B and Fig. 3.C 207 208 show examples of local gray-level mean size maps for orientations corresponding to 0, 209 45, 90, and 135 degrees computed on a synthetic image (Fig. 2.A) and on a cropped image of flax fibres (Fig. 3.A). The elongated regions result in a large mean size value 210 211 when the orientation corresponds to the orientation of elongation. 212 For each pixel, the function  $m_G(x, \theta)$  exhibits one or several maxima for orientations 213 corresponding to the presence of fibre. Fig. 2.C represents this function for point located 214 in a vertically oriented region, shown as a red cross in Fig. 2.A. The best orientation 215  $\theta^*(x)$ , corresponding to the most prominent fibre direction for the pixel x, is computed 216 by integrating the function  $m_G(x,\theta)$  over the circular domain  $[0; 2\pi]$ . The resulting map 217 of orientation is represented using a colour map depending on the orientation: the red colour corresponds to a horizontal orientation, and the light blue colour corresponds to a 218 219 vertical orientation (Fig. 2.D).

The estimate of local orientation is computed for all pixels. However, as the dark pixels correspond to background, it is relevant to consider only the orientation of the bright pixels. Therefore, parametric maps of local orientation are represented using a colour coding that takes into account both the orientation and the local intensity of the pixel (Fig. 3.C). For the same reason, the histogram of preferred orientations is obtained by computing the histogram of the values  $\theta^*(x)$  weighted by I(x), the intensity of *x* in the original image (Fig. 3.D).

227

#### Figure 3.

- 228
- **3. Results and discussion**

#### 230 3.1 Validation of the method

This method was originally developed to estimate the fibre orientation distribution (FOD) of flax fibre nonwovens. These materials can be considered as complex materials. Indeed, in the stem, flax fibres are arranged in bundles and are then more or less individualised during the processes they undergo (retting, scutching, carding, etc.) resulting in individual fibres and bundles with heterogeneous diameters and lengths. Also, flax fibres and bundles are flexible enough to bend and therefore, the analysis is more complicated than if the fibres remained straight as it is the case for glass fibre.

238

## Figure 4.

239 For all these reasons, the method is validated with more conventional materials before 240 testing flax fibre webs. Figure 4 A, B and C show SEM images of three reference 241 materials: Glass fibre mat, glass fibre UD fabric and UD flax tape, respectively. The 242 computed preferred orientation maps are also represented in Figure 4 D, E and F where a 243 colour represents an orientation; thus, a random orientation is presumed to give a large 244 range of colours whereas a reduced colour shade is expected when a unidirectional 245 preform is analysed. The trends shown in Figures 4 D, E and F are clearly in this 246 direction and are confirmed with the results shown in Fig.4 G). Indeed, the glass fibre 247 mat FOD exhibits a quasi-monotonous line fluctuating between 0.4 and 1% highlighting the random in-plane orientation of fibres. On the contrary, glass fibre unidirectional 248 249 fabric FOD shows a thin peak between orientations ranging from 80 to 100° and displays 250 a maximum value at 89° (longitudinal axis). If the curve is compared with the one of flax 251 fibre unidirectional tape, the peak is higher and thinner. Indeed, for flax, a peak is also present with a maximum at 90° but it only represents 5% of the fibres (13% for glass) and 252 it is also more scattered with orientations ranging from 75° to 105°. As glass 253

254 reinforcement is made of continuous individual fibres assembled in 2 mm wide bundles, 255 it is less likely to bend due to its higher moment of inertia compared to flax individual 256 fibres and bundles (Tanguy et al., 2018), with diameters varying from 15 to 100 µm (Charlet et al., 2010; Haag and Müssig, 2016). Also, bundles may have been damaged 257 258 during the mechanical scutching process and the manufacturing process of unidirectional flax tapes (Khalfallah et al., 2014), where some individual fibres can break up from the 259 260 bundle and become disoriented, this is visible on Fig. 4.C and 4.F) with some small diameter bent fibres. On this point it should be kept in mind that the production of flax 261 262 fibre reinforcements is a much more complex process than for glass fibres; the glass 263 fibres are extruded and calibrated in an industrial way then directly assembled into roving 264 and preforms. In the case of flax, they are mechanically extracted from a plant, then 265 aligned and ribboned with all the risks involved in these successive operations, with new 266 possibilities for creating defects at each stage.

From figure 4. F. it can be observed that on large flax fibre bundles, there is a variation in 267 268 colour for the same element that can be explained by the fact that the method detects 269 elements crossing each other and for the area where fibres are overlapping, it gives a 270 mean orientation of these later. Also, if the fibres are too wide, the method can hardly recognize them as a single element and thus it gives two symmetric orientations for this 271 272 element. This later can be resolved by adjusting the image analysis settings with the increase of the morphological filter size which will give a more accurate result but needs 273 274 a longer time to process.

275 3.2 Application to flax fibre nonwoven preforms

276

#### Figure 5.

Similar analyses were performed on flax nonwoven (Figure 5). Referring to the fibre
orientation distribution curves, there is a preferred orientation around 90°. This was not
reported for glass fibre mats (Fig. 4.G) and this phenomenon can be explained by the

280 manufacturing process of nonwovens which are different for the two materials. Indeed, 281 the glass fibre mat studied here is made by air blowing where fibres are randomly 282 dispersed in the plane whereas flax fibre nonwovens were produced by carding 283 technology with a roller card; fibres are conveyed by several rolls to be disentangled and 284 mixed in order to form homogeneous web of uniform weight per unit area. Fibres are thus 285 more oriented in the machine direction (Van De Velde and Kiekens, 2003). During the overlapping step, the web is reoriented almost perpendicularly to the machine direction 286 allowing a preferred orientation in the cross direction (CD) (90° in figure 5 and 6). Same 287 288 observations as for unidirectional flaxtape with the fibres overlapping each other can be 289 reported for nonwovens.

290

#### Figure 6.

Fig. 6 represents an analysis of the fibre orientation distribution for four different 291 292 locations on the nonwoven. Trends are found to be quite similar for areas 1, 2 and 3 with 293 a preferred orientation at 90° whereas for the fourth location, the peak is wider and 294 shifted to 70° values and this is likely due to the size of the analysed area. The 295 observation scale is a key point for the accurate analysis of the fibre orientation 296 distribution because if the latter is too small then there are not enough fibres analysed and the distribution thus obtained will not be representative of that of the whole material. On 297 298 the contrary, if it is too large, the smallest elements may not be detected due to a lack of 299 image quality, leading to an error in determining the orientation of the fibres. With the 300 magnification used here, smaller diameter fibres are detected and by analysing over 301 several areas, it is possible to obtain a precise and representative fibres orientation 302 distribution within the nonwoven. By automating the image analysis, it would then be 303 possible to analyse a very large surface of a sample that can then be mechanically tested 304 and thus verify the actual orientation distribution of the fibres and the impact this will have on the mechanical properties; on the other hand, these data could make it possible to 305

306 implement a mathematical model to predict the properties of nonwoven composites 307 reinforced by plant fibres. Particular attention should be paid to the fact that with this 308 method, only a surface analysis is performed. This corresponds well for so-called lightweight preforms since the majority of the fibres are analysed here. That said, the 309 310 increase in weight will affect the thickness of the preform with more fibres in the 311 background that may not have the same orientation as those analysed. Additionally, in the 312 special case of needle-punched nonwovens with higher thickness, the needle punching step drives few fibres through the thickness of the material resulting in a three-313 314 dimensional orientation of the fibres. From these points, a three-dimensional image 315 acquisition method and analysis may be required to ensure a reliable fibre orientation 316 characterisation on the entire material.

317

#### 318 **4.** Conclusion

319 This paper presents a new method to analyse the fibre orientation distribution (FOD) of 320 both synthetic and flax preforms for composite reinforcement. Preforms images were 321 obtained by scanning electronic microscopy (SEM) and analysed by computing the 322 histogram of pixels preferred orientations by using gray-level granulometry. Gray-level 323 granulometry is an approach for image texture analysis based on the application of 324 morphological filters (typically opening or closing) of increasing size which results in 325 granulometric curves that can be interpreted in terms of size distribution. The method 326 computes a parametric map of local orientation using a colour coding taking into account 327 both the orientation and the local intensity of the pixel. It also gives a histogram 328 representing the preferred orientations of the analysed elements.

Originally developed for flax fibre nonwovens, the method is first validated with moreconventional materials such as unidirectional glass fabric, UD flax tapes as well as glass

fibre mat. The results obtained are in accordance with those expected with significant differences between the FOD of the different preforms highlighting the influence of parameters such as the intrinsic characteristics of the materials and their production methods. Similar analyses were performed on different locations of a flax nonwoven which highlighted a preferred orientation around 90°. Due to the reduced size of the analysed area, it is necessary to process to image analysis on different location and arithmetically average the values to assure reliable material fibre orientation distribution.

338 This method could be combined with several image acquisition techniques (SEM,

339 tomography) both at the preform and composite level offering a large range of

340 applications including composite materials. Potential improvements of the method can be

341 imagined with the quantification fibres and bundles diameters or determination of the

342 orientation in the three dimensions. Finally, it provides interesting perspectives for

343 numerical modelling of biocomposite mechanical properties.

344

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495 Figure 1. Computation of granulometric curves using morphological opening. Top row:
496 sample results of morphological opening using square structuring elements of increasing
497 sizes. Bottom: resulting granulometric curve. The dots on the curve correspond to the
498 stages shown on the first row.

499 Figure 2. Computation of preferred orientation map on a synthetic image. A) Original 500 image. B) Results of local mean size for different families of linear structuring element 501 oriented with 0, 45, 90 and 135 degrees. C) Mean size function for a single pixel and the 502 whole range of orientations. D) Synthetic map of preferred orientation represented using 503 colour.

**Figure 3.** Computation of local orientation map from granulometry curves obtained by analysis on a flax nonwoven. A) Original image (inverted) B) Granulometric size obtained with various orientations of structuring elements C) Colour representation of preferred orientation map. D) Histogram of preferred orientations.

**Figure 4.** Original SEM images of A) glass fibre mat, B) glass fibre unidirectional preform and C) flax fibre unidirectional tape. D), E) and F) are the computed preferred orientation maps of glass fibre mat, glass UD and flax UD, respectively. G) is the comparison of the fibre orientation distribution (FOD) of the preforms.

Figure 5. Original SEM image of flax fibres nonwoven A). B) is the computed preferred
orientation maps of A) and C) shows the histogram representing the fibre orientation
distribution.

Figure 6. Original SEM image of a larger area of flax fibres nonwoven divided in four
areas A). The histogram represents the fibre orientation distribution of each area analysed
B).



## Figure 2.



## Figure 3.







Figure 5.



Figure 6.

