# Multifractal Analysis of Particle Dispersion and Interphase Percolation in Nanocomposites

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The dispersion of nanoparticles in nanocomposites of an epoxy matrix reinforced with alumina (10nm) and zinc oxide (100nm) is analyzed using FIB/FESEM images, varying the volumetric fraction of fillers from 0.2 % to 6.0 %. The nanofillers dispersion images were transformed to binary files and the multifractal spectrum was calculated. From these data the relation between agglomerate and individual particle dimensionalities related to the interphase percolation was investigated. Interphase percolation of nanocomposites should be achieved when the dimensionality of agglomerations is greater than the dimensionality of individual particles. The actual percolation state of the interphase is determined, matching the experimental nanocomposites behavior for electrical behavior at AC and dielectric breakdown at DC.

Keywords: Nanocomposite, Percolation, Interphase, Multifractal.

### 1. Introduction

One of the most important issues related to nanocomposites is the interphase. It is a region around the nanoparticles where properties are somehow different from the matrix and from the nanoparticle. At a very low volumetric fraction of nanoparticles, this region can be percolated the material. For instance, in polymeric matrices with carbon nanotubes, percolation can be reached at 0.1 %. Aspect ratio is an important issue for 1-D tubular structure such as carbon nanotubes. It is also interesting to see recently the use of tomography to study the percolation threshold in nanocomposites<sup>1-3</sup>.

In general, interphases have at least two layers, the first is tightly bonded to the nanoparticle and the second is more loosely connected<sup>4</sup>. At the interphase, molecules or chains can have steric confinement reducing their mobility and dipoles mobility. Also, at the interphase, we can have alterations in crystallinity and chain network density alterations<sup>5-7</sup>. It is well known from colloid science that a diffusive double layer is present in any nanocomposite where an electric field is applied. Some potential barriers are present at the interphase trapping electric charges and reducing their mobility when the nanoparticles are present<sup>8-10</sup>.

Increasing the fraction of nanoparticles at a constant volume, the interphase around of different nanoparticles will approach each other. After a critical value, there will be an overlap of this region through the bulk of the material, thus the interphase is percolated. The percolation of the interphase in nanocomposites is very sensitive to the processing technique. Dielectric breakdown, glass transition temperature and tensile strength are typical examples of properties where the dispersion state of nanoparticles are very important. One of the key issues in nanodielectric materials is related to the dispersion state of the reinforcements. Several special issues of specialized journals only accepted for peer review process works having micrographs from any electronic microscopy technique regarding the dispersion state of nanofillers. If we consider that nanoparticles are randomly distributed into the matrix, the volume of interphase converges up to a critical value where percolation is reached. Thus, the volume of interphase can be characterized as a fractal object<sup>11</sup>.

The multifractal formalism have been used to correlate fracture toughness as a function of fracture surface roughness in composites materials. Zhang and collaborators12,13 observed that the width of multifractal spectra is related to competition between ductile fracture and brittle fracture, consequently the width of multifractal spectra could be used to characterize the surface morphology and mechanical properties quantitatively. Pérez and collaborators<sup>14</sup>, noticed that the regularity of the topography morphology of fractured surfaces can be related to the variation of the singularity width in PP/CaCO<sub>3</sub> composites. In another work15, the fracture surfaces analysis of PP/Quartz composites allows correlating multifractal spectra and material toughness. However, the authors suggested that the experimental procedure of multifractal theory should be improved to define the most sensitive parameter. Starch/ PCL blend reinforced with distinct nanoclays clearly showed variations in the width of the multifractal spectra<sup>16</sup>. These variations suggested that, the fracture surfaces indicated to be more irregular in the toughest nanocomposites. It should be pointed out that the presence of brittle and ductile mechanisms is related to more regular or irregular surfaces, respectively. Mills and co-workers17 applied multifractal analysis of SEM

images to improved method for the dispersion assessment of flame retardant fillers in EVA. The results related the effect of different filler surface treatments on dispersion quality and flame retardant effectiveness. Another example<sup>18</sup> was in the pharmaceutical industry and it requires the development of complex formulations of lipophilic and hydrophobic compounds. Multifractal analysis showed that the nature of interparticle interactions in the inorganic carrier as well as the presence of amorphous  $\beta$ -Carotene had an influence on the microstructure and thus on the mechanical performance of the polyvinylpyrrolidone-vinylacetate. The use of multifractal analysis and the study of the mechanical properties can be connected to better characterize and understand complex formulations obtained, since it can help to tailor the final dosage form according to desired product quality attributes.

The aim of this work is to quantify the dispersion of nanoparticles in polymeric matrices using a multifractal analysis and propose an adequate parameter to identify the interphase percolation.

# 2. Materials and Methods

### 2.1 Preparation of the nanocomposites

In this work was used an epoxy system diglycidyl ether of bisphenol-A (DGEBA) commercial name NPES 903H-NanYa and *o*-tolyl biguanidine (OTBG) commercial name Aradur 2844-Huntsman. The proportion of hardener/resin is 5.7 %. The density of the epoxy polymer was 1.2 g cm<sup>-3</sup>. Al<sub>2</sub>O<sub>3</sub>-filler was used with a density of 2.8 g cm<sup>-3</sup> and surface area of 231 m<sup>2</sup> g<sup>-1</sup> (BET method). ZnO-filler was used with a density of 5.6 g cm<sup>-3</sup> and surface area of 12 m<sup>2</sup> g<sup>-1</sup> (BET method). Both nanoparticles were supplied by Nanum and used as-received.

All nanocomposites and the neat epoxy were prepared in a twin-screw extruder DCT19-Tecktril using a screw speed of 490 rpm and temperature of 90 °C in all zones. A calender at 10 °C was used for cooling, and subsequently, the material was ground and sieved. Two cycles of extrusion were employed for the preparation of all nanocomposites aiming to obtain a more homogeneous fillers distribution. All materials studied were cured at 200 °C for 10 min. We will designate the respective compositions used in this work as: pristine epoxy - P; epoxy filled with Al<sub>2</sub>O<sub>3</sub> - A; and epoxy filled with ZnO - Z, following by its nominal volumetric fraction, e.g. Z0.2 is the nanocomposite reinforced by 0.2 % in volume of the ZnO and A0.4 is the nanocomposite reinforced by 0.4% in volume of Al<sub>2</sub>O<sub>2</sub>. The compositions prepared in this work were eight in total: A0.4; A1.2; A2.4; A6.0; Z0.2; Z0.6; Z1.2 and Z3.0.

### 2.2 Multifractal analysis of fillers dispersion

By applying focused ions beams (FIB) in a sample, an area was sliced in five distinct regions of the each sample

revealing the soaked fillers. Images were collected from backscattered electrons for higher contrast between matrix and fillers using field emission scanning electronic microscopy (FESEM) Auriga Compact-Zeiss device.

The collected SEM images are converted to a binary representation, where the nanoparticle sites are represented by black pixels and white pixels representing matrix regions, as shown in Fig.1.We have applied the counting box method to scaling of the clusters distribution regarding the length scale using a square grid.

The nonlinear systems can often be characterized by multifractal formalism<sup>19</sup>. In the square grids with boxes of size *L* it is calculated the probability for an occupied site by nanoparticles in the image and later it is possible to connect it to the multifractal spectrum. As usual, it is defined the probability distribution in the box (i,j) by :

$$p_{ij}(L) = \frac{n_{ij}(L)}{\sum n_{ij}(L)} \tag{1}$$

Where  $n_{ij}(L)$  is the number of black pixels (nanoparticles) in a given length scale counted for the box (i,j). Then we can define an exponent singularity strength  $(\alpha)^{20}$ ,<sup>21</sup> according to Eq. 2.

$$p_{ij}(L) \approx L^a \tag{2}$$

If we count the number of boxes  $N_a(L)$  where the probability distribution has singularity between  $\alpha$  and  $\alpha$ +d $\alpha$ , then the Hausdorff dimension  $f(\alpha)$  can be defined as the fractal dimension of the set of boxes with same singularity<sup>20,21</sup> by Eq. 3.

$$N_{\alpha}(L) \approx L^{-f(\alpha)} \tag{3}$$

The generalized fractal dimension  $D_q$  which correspond to scaling exponents for the *q*th moments of the measure, provide an alternative description of the singularity measure<sup>20, 21</sup>. They are defined by Eq. 4.

$$D_{q} = \frac{1}{q-1} \lim_{L \to 0} \frac{\log \sum p_{ij}^{q}(L)}{\log L}$$
(4)



Figure 1. Treatment of an electronic microscopy image for a nanocomposite to make binary images

This reflects a connection with the thermodynamic formalism<sup>22</sup>, where *q* is the moment order and  $\tau(q)$  is the mass exponent. They are conjugate variables to the fractal dimension *f*(*a*), and it can be obtained from the partition function  $\chi_{e}(L)$  given in Eq. 5.

$$\chi_{q}(L) = \sum p_{ij}^{q}(q) = L^{\tau(q)}$$
(5)

In this case, the fractal dimension  $f(\alpha)$  and generalized fractal dimension  $D_q$  can be easily transformed into the other from a Legendre transformation<sup>20,21</sup>, according to Eq. 6, Eq. 7 and Eq. 8.

$$D_q = \frac{\tau(q)}{q-1} \tag{6}$$

$$f(\alpha) = \alpha q - \tau(q) \tag{7}$$

$$\alpha = \frac{\mathrm{d}\tau(q)}{\mathrm{d}q} \tag{8}$$

Apart from a slight variation of the moment order, the extent of variation in the data set of the fractal dimension is negligible. A range of  $-10 \le q \le 10$  was used. The multifractal spectra were calculated with the plugin Fraclac of the ImageJ software.

## 3. Results and Discussion

#### 3.1 Multifractal analysis

Very briefly, we are going to introduce some important concepts of the percolation theory<sup>23,24</sup> for this work. When there are no distance between two or more black pixels which representing the nanoparticles on images, they constitute a cluster. The probability that a black pixel is observed in a reference lattice converge exponentially to percolation threshold. Above the percolation threshold, large clusters will be observed homogeneously in all lattice, and their size is proportional to the length of scale. Bellow the percolation threshold the size of the finite clusters have fractal dimension smaller than the dimension observed in the reference lattice, the cluster density is not uniform. Indeed, the fractal behavior of a system contains information about the internal structure of clusters depending of the probability of a site is occupied. The percolation is the probability for one site to belong to an infinite cluster. For multifractal analysis of the images, an agglomerate of nanoparticles can be described as a cluster, in this case, the volumetric fraction of fillers is similar to the probability for an occupied site or black pixel in treated image. As exposed in introduction, some papers <sup>13-15</sup> show that the regularity of filler dispersion can be related to the variation of the singularity width. Therefore, multifractal analysis can be used to describe the dispersion state of nanofillers and it will be applied here to determine the percolation of the interphase.

Aiming to help the reader to understand the multifractal spectra it is important to state that two regions are important, the region of minimum and maximum singularity, in Fig. 2 they are represented by  $a_{min}$  and  $a_{max}$ , being singularity width  $\Delta \alpha = \alpha_{max} - \alpha_{min}$ . The region of maximum singularity is related to the smaller probabilities of distribution, and the region of minimum singularity is related to the higher probabilities<sup>20</sup>,<sup>21</sup>. The variation in the dimensionality is given by  $\Delta f(\alpha) = f(\alpha_{max}) - f(\alpha_{min})$  and indicates the corresponding variation in the number of boxes with minimum and maximum probability of distribution. According to literature decreasing the difference  $f(a_{max}) - f(a_{min})$  decrease the multifractal character of the system. When q = 0 we do have a unique fractal dimension at  $f_{n}(\alpha)$  for the data, and when compared different spectra for the same material at different content of a nanofiller the maximum, when  $\Delta f(\alpha) \approx 0$ , value can be related to the percolation threshold. As very well pointed out by Blacher and co-workers<sup>25</sup> at q = 0,  $f(\alpha) = \alpha$ , and this is the maximum possible value of  $f(\alpha)$ .

In Fig. 3 is presented the FIB/FESEM images of one slice for epoxy/ZnO nanocomposites. In Fig. 4 is presented multifractal spectra for epoxy/ZnO nanocomposites, the results and errors bars from averages over five different sliced regions of each sample. As shown in Fig. 4, the average value of  $f(\alpha_{min})$  follow an increase from approximately 0.1 at 0.2% v/v to 0.6 at 3.0% v/v of the volumetric fraction. This is an indication that higher the volumetric fraction, higher the state of agglomeration. It should be noted that average  $f(\alpha_{max})$  is in the region about of 0.7 at any volumetric fraction.

It is not observed significant variations in the singularity width  $\Delta \alpha$  because this parameter have been correlated to fracture surface roughness in composites. Therefore, mechanism of loss energy in material fracture are involved leading to  $\Delta \alpha$  increase. To analyze the filler dispersion this parameter must be unappropriated, and other quantity need be used.



Figure 2. Multifractal spectrum indicating the principal amounts involved in the analysis of particle dispersion



**Figure 3.** Images obtained by field emission scanning electronic microscopy with backscattered electrons and voltage 5 kV in an area sliced with focused ions beam of the nanocomposite DGEBA/OTBG filled with zinc oxide with a) 0.2 %, b) 0.6 %, c) 1.2 % and d) 3.0 % all nominal volumetric fractions



**Figure 4.** a) Multifractal spectrum of the particle dispersion for ZnO reinforced epoxy matrix nanocomposites Z, followed by its respective volumetric fraction of particles. b) The exponent of mass and fractal dimension generalized against the moment of order, calculated by the transformation of Legendre with the method of the counting of boxes. The error bars were calculated by average of five distinct spectra obtained from different slices

Another important feature of the multifractal analysis is when the value of  $\Delta f(\alpha)$  is zero. In this situation, the agglomerates present similar divergence than individual particles since  $f(\alpha_{max}) = f(\alpha_{min})$ . For the Z0.2 nanocomposite, the average value of  $\Delta f(\alpha)$  is 0.5 indicating a predominance of individual nanoparticles over agglomerates about the dispersion state. The value where  $\Delta f(\alpha) = 0$  is crucial for understanding the percolation of the interphase. At this point, we are proposing that the predominance of divergence of the agglomerates over the individual nanoparticles is an indication that interphase has percolated.

In the case of nanocomposite reinforced with ZnO, the critical volume fraction of particles to interphase percolation must be approximately 3.0 %, and the fractal dimension of fillers dispersion is  $f_p(\alpha) = 1.42$  according to figure 4. It should be pointed out that percolation of interphase is different from percolation of nanoparticles. The first percolation to appear is the percolation of the interphase, increasing the volumetric fraction of nanoparticles. After that, if one continues to increase the fraction of reinforcements, the percolation of nanoparticles will appear. As mentioned in introduction, the interphase must be a matrix region extended from interface with particles which the materials properties is altered. Due to extremely high interfacial area in nanocomposites, the interphase can be predominant over the material behavior. The interphase influence will be directly related to filler

dispersion state, therefore is essential have an adequate parameter to quantify the fillers dispersion in nanocomposites.

It is possible to find in the literature for percolation of sites in 2D that critical fractal dimension is  $D_c = 1.89^{23,24}$ . If the fraction of reinforcements continued to be increased in nanocomposites, then particle percolation would have been resolved probably at the dimensionality of 1.89. In Fig.4b, for the nanocomposite Z3.0, D(q) = 1.92 in asymptote to  $q \rightarrow -\infty$ . This value indicates that, if were present only the biggest agglomerations, the fractal dimension of the composite would be similar to the respective theoretical value at the critical percolation threshold.

In Fig. 5 is presented the FIB/FESEM images of one slice for epoxy/Al<sub>2</sub>O<sub>3</sub> nanocomposites. Multifractal spectra for nanocomposites with Al<sub>2</sub>O<sub>3</sub>, are presented in Fig. 6, a similar behavior to nanocomposites reinforced with ZnO is observed. There is an increase in the fractal dimension with increasing the volumetric fraction of nanoparticles. For instance in the sample A0.4, average  $f(\alpha_{min}) = 0.2$ , increase for an average  $f(\alpha_{min}) = 0.6$  at A2.4 sample. The value  $f(\alpha_{max}) = 0.8$  is almost constant in all epoxy/Al<sub>2</sub>O<sub>3</sub> samples, as in the samples with ZnO.

The increase of values of the general fractal dimensions of the nanocomposites reinforced with Al<sub>2</sub>O<sub>3</sub>, compared to nanocomposites reinforced with ZnO, occurred due to the higher agglomeration state which was expected, since this nanoparticle had a much higher surface area. For example,



Figure 5. Images obtained by field emission scanning electronic microscopy with backscattered electrons and voltage 5 kV in an area sliced with focused ions beam of the nanocomposite DGEBA/OTBG filled with aluminum oxide with a) 0.4 %, b) 1.2 %, c) 2.4 % and d) 6.0 % all nominal volumetric fractions

the sample A2.4 whose particle fraction is lower than in Z3.0, the fractal dimension of the set is higher  $f_n(\alpha) = 1.53$ .

If the percolation of the interphase should be achieved in the condition where  $\Delta f(\alpha) = 0$ , according to our proposal, in sample A2.4 must not have occurred percolation of interphase, as pointed out by the multifractal spectrum where is about  $\Delta f(\alpha) = 0.2$ . Only, to sample A6.0 it can be seen  $\Delta f(\alpha) = 0$ . In the first fraction particles in which  $\Delta f(\alpha) = 0$ , the dimensionality of higher agglomerates should be about 1.89, as described above. Nevertheless, the calculated value of the generalized dimension to A6.0 sample, D(q) = 2.36the asymptotic behavior in  $q \rightarrow -\infty$ , observing Fig.6b. In this case, the dimensionality of agglomerate exceeds the scaling for a set of two-dimensional data. We anticipated that the filler fraction for critical percolation is located around 3.5 % to the alumina-nanocomposites, but, it was not produced nanocomposites at this fraction.

#### 3.2 Interphase percolation

To connect our methodology to real experiments, data previously published from<sup>26</sup> will be evocated. In that work spectroscopy of impedance and dielectric strength were measured for all eight nanocomposites which images were analyzed here in this work. The main difference between nanodielectrics and neat epoxy is the location/polarization of spatial charges. For the neat epoxy, the process of conduction is using hopping. After the addition of nanoparticles, there is a clear effect of interfacial polarization. This leave to the slope of permittivity in nanocomposites with A0.4 and Z0.2 is much higher than the neat epoxy<sup>26</sup>. Observing the dielectric losses, it is possible to see a quasi-DC behavior of the samples Z0.2 and A0.4<sup>26</sup>. Quasi-DC conduction process means that charges have limited mobility, in general following tortuous paths, but they can not go through the whole material<sup>27</sup>. There is evidence that residual water has a role in this scenario<sup>28</sup>. Also, there is the formation of a diffusive double layer at interfaces.

The multifractal analysis for sample A2.4 indicated a situation near percolation. In the work<sup>26</sup> the quasi-DC effect could not be characterized in sample A2.4, although a smooth relaxation peak is presented, characterizing relaxation attributed to spatial charges. When interphase is percolated, there is, at least, one physical path for conduction through the material besides hopping, this behavior is well known as conductivity-DC. As exposed in<sup>26</sup> the Z3.0 sample show conductivity-DC. According to our analysis percolation was reached in Z3.0 sample. In this case, the percolation and overlap of interphase are well established in the material, corroborate to multifractal analysis of percolation.



Figure 6. a) Multifractal spectrum of the particle dispersion for alumina reinforced epoxy matrix nanocomposites A, followed by its respective volumetric fraction of particles. b) The exponent of mass and fractal dimension generalized against the moment of order, calculated by the transformation of Legendre with the method of the counting of boxes. The error bars were calculated by average of five distinct spectra obtained from different slices

Data from dielectric strength<sup>26</sup> measured for the same samples described in this work give us more evidence of percolation. In the A0.4 nanocomposites with a low fraction of nanoparticles, there is an increase of 50% in dielectric strength compared to the neat epoxy<sup>26</sup>. From this, the values of dielectric breakdown presented a sharp decrease due to interphase overlapping<sup>26</sup>. At the critical fraction where percolation is supposed to be reached, the values of dielectric breakdown are lower than pristine epoxy<sup>26</sup>. These data corroborate for our ideas of the percolation of interphase.

The Fig. 7a summarizes illustratively the exact interphase percolation threshold when  $\Delta f(\alpha) = 0$ , representing the critical fractal dimension of fillers  $f_c(\alpha)$ , the critical theoretical dimension for percolation of interphase  $D_c = 1.89$ . In Fig. 7b is represented interphase on a binary image for the nanocomposite Z0.2. The interphase zones are quite far apart, and there is no overlap of the interphase. Fig.7c shows the same schematic illustration, however, on a binary image of the Z1.2 sample. In this case, the material is not percolated, although some overlap interphase zones. The Fig. 7d shows the Z3.0 nanocomposite with percolated interphase, i.e. interphase is superimposed forming paths all length of material. The Fig. 7e illustrates the interphase for the nanocomposite A0.4, similar to the sample Z0.2.



**Figure 7.** Interphase illustrations on nanocomposites. a) Exact percolation threshold showing particle and interphase dimensionalities, b) representation for sample Z0.2, c) representation for sample Z1.2, d) representation for sample Z3.0, e) representation for sample A0.4 and f) representation for sample A2.4

Finally, the Fig. 7f illustrates the interphase to A2.4 sample. This material composition is not percolated, however, is in a state very close to the percolation threshold. This enables that charges may hop overlapping regions of interphase.

# 4. Conclusion

Quantify the degree of particles dispersion in nanocomposites is very important to predict their properties. Therefore, the multifractal analysis can offer an adequate method to correlate the final performance of nanocomposites to interphase percolation. Using scanning electronic micrographs it is possible to point out where the interphases reached percolation for nanocomposites. The null value of variation in the dimensionality given by  $\Delta f(\alpha) = f(\alpha_{max}) - f(\alpha_{min})$  connected to the maximum value of  $f(\alpha)$  according to our experimental results allowed the determination of the percolation threshold. Data from electrical properties for this system indicated that our hypothesis of percolation of the interphase is attained.

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