

# Detecting Carbon Nanotube Orientation with Topological Data Analysis of SEM Images

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High-performance carbon nanotube (CNT) materials are in high demand as a result of their extraordinary mechanical, electrical and thermal properties.

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It is fundamentally important to evaluate and quantify the degree of alignment using various characterization methods.

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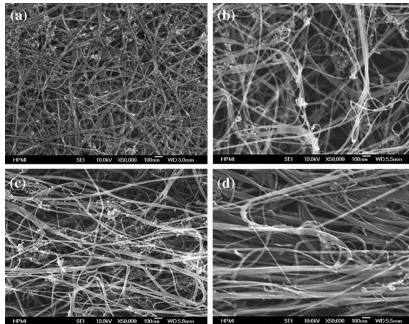
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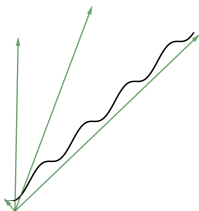
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# What does orientation alignment mean?

Following figure shows SEM (scanning electron microscope) images of some sample CNT materials.

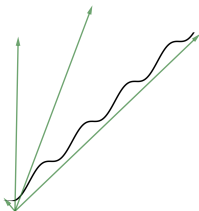


**Goal:** To develop effective ways of quantifying the degree of alignment using **topological data analysis**.



The length of each vector fits our intuition about how well the tube is oriented in that direction.

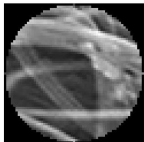
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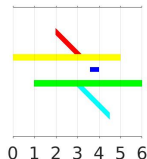
We apply a Canny edge detector whose output is a binary image, as illustrated in Fig. 8 (ii). Fig. 8 (iii) is a “cartoon” of a nanotube array.



(i)



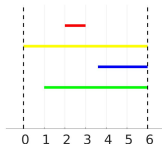
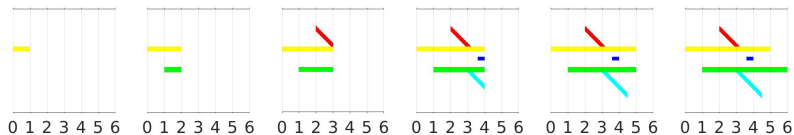
(ii)



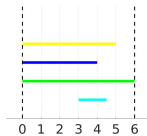
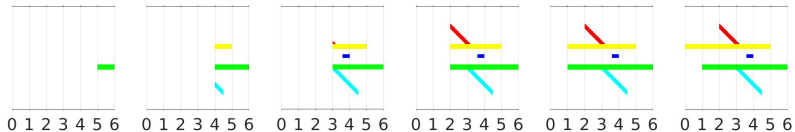
(iii)



# An explanation of Persistent Homology Barcode



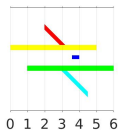
Roughly speaking, a bar in a barcode records information such as when a new component appears, when it merges into another component while the space grows.



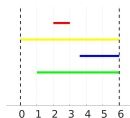
# Variation Function

In the following tabular  $V$  represents horizontal extension of each branch of  $X$ ;  $L_a$  represents length of each bar in barcode (a);  $L_b$  represents length of each bar in barcode (b).

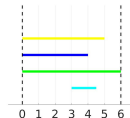
Branch	$V$	$L_a$	$L_b$	$L_a + L_b - V$
Red	1	1	0	0
Yellow	5	6	5	6
Blue	0.5	2.5	4	6
Orange	5	5	6	6
Cyan	1.5	0	1.5	0



X



(a)

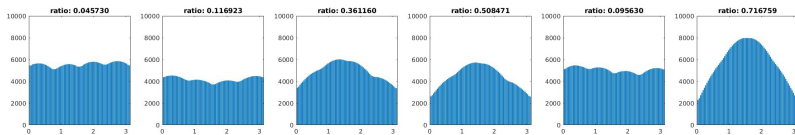
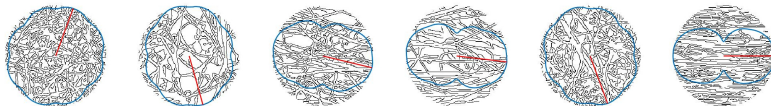
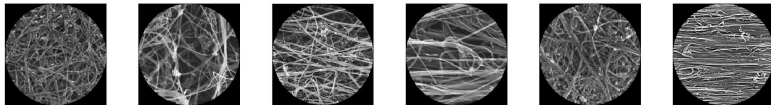


(b)

- 1  $L_a + L_b - V$  always equal to 6 or 0;
- 2  $L_a + L_b - V = 6$  iff. the branch does not merge in both filtrations;
- 3 6 equals the total horizontal scan range of those filtrations;
- 4 The number of branches for which  $L_a + L_b - V$  exceeds 6 equal  $b_0(X)$ .

$$V(X, \theta) := \sum_{i=1}^m \ell(I_i) + \sum_{j=1}^n \ell(J_j) - b_0(X)(M - m), \quad (1)$$

# Results



Thanks for Your Attention!