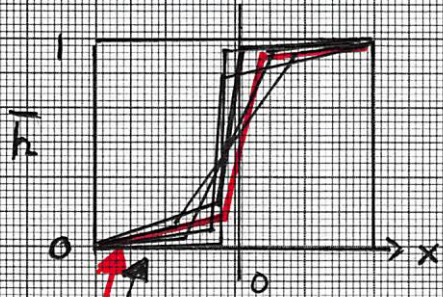


Stratoran

CUMULATIVE DISTRIBUTION FUNCTIONS -

PCA, BEST APPROXIMATION, CLASSIFICATION



• black: cumulative distrib. fcts. of histograms of SAME MATERIAL (from different "segments")

• red: (piecewise linear representation of) MOST IMPORTANT "EIGEN-DISTRIBUTION" (with largest eigenvalue)

1) Apply PCA to cumulative distr. fcts. (with  $x$ -direction being the function direction), using a piecewise constant representation.

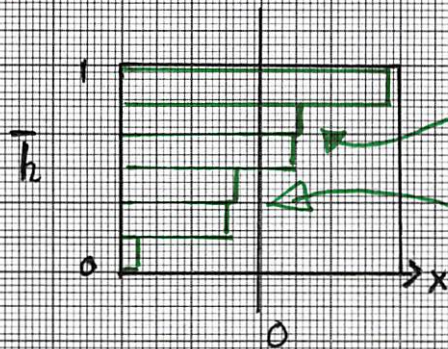
2) Using the piecewise constant representation of the  $x(\bar{h})$  fcts, view each fct. as a point/vector in  $K$ -dim. space (and perform PCA for  $N$  such fcts.).

3) There are  $N$   $x(\bar{h})$  fcts., each approximated by  $K=N$  constant segments.

4) PCA produces  $K$  eigenvalues with associated eigenvectors - "EIGEN-DISTRIBUTIONS" - sorted based on absolute eigenvalue magnitude. THUS, the most important (or small set of most important) eigen-distribution(s) can be selected.

5) PROBLEM: Given a new cumulative distr. fct. of a newly scanned object/segment, does it represent an instance of THIS MATERIAL?

# CUMULATIVE DISTRIBUTION FUNCTIONS - ... Cont'd.



• green; piecewise constant approx. of  $x(h)$  function of a newly scanned object/segment (approximating the cumulative distrib. fct. with  $K$  segments)

6) Compute best approximation of  $x(h)$  using small set of most important eigen-distribution fcts. for the specific material [done ONLY for a newly scanned object/segment with a mean that is "very close" to the mean of this specific material]: COMPUTE BEST APPROXIMATION

$$\underline{a = \sum_{i=1}^L c_i \cdot e_i}$$

where the  $L$  most important eigen-distribution fcts.  $e_i$ ,  $i=1, \dots, L$ , are used to define least squares  $a$ :

mutually orthogonal

$\langle \cdot, \cdot \rangle$  inner product

$$\begin{pmatrix} \langle e_1, e_1 \rangle & \dots & \langle e_1, e_L \rangle \\ \vdots & & \vdots \\ \langle e_L, e_1 \rangle & \dots & \langle e_L, e_L \rangle \end{pmatrix} = \begin{pmatrix} \langle e_1, e_1 \rangle & 0 & \dots & 0 \\ 0 & \ddots & & \\ 0 & & \ddots & \\ 0 & \dots & 0 & \langle e_L, e_L \rangle \end{pmatrix}$$

since  $\langle e_i, e_j \rangle = 0$  for  $i \neq j$

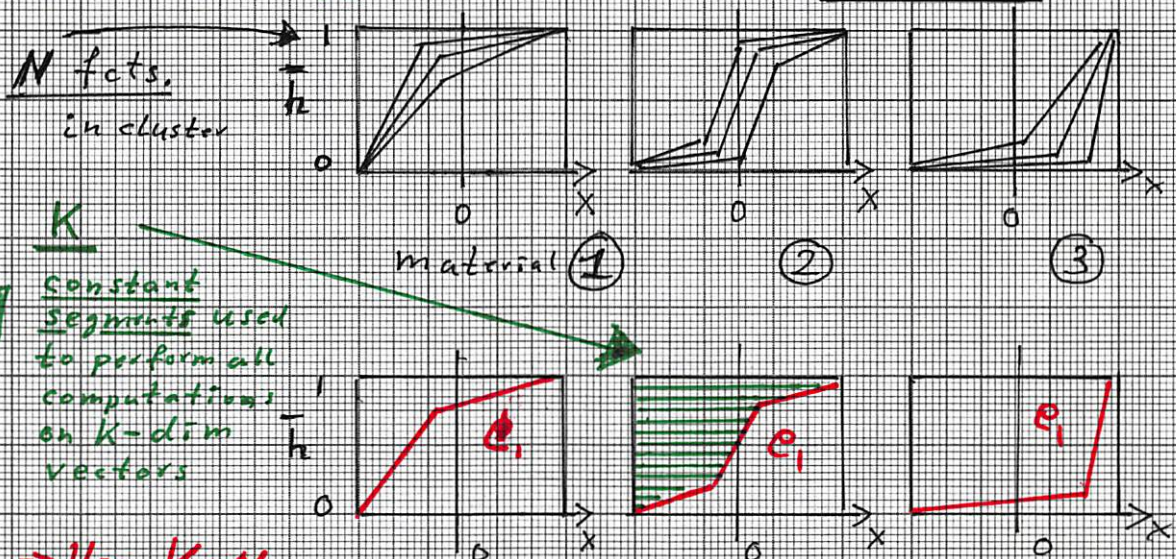
$$\Rightarrow \underline{c_i = \langle e_i, x \rangle}$$

•  $\Rightarrow$  THE "SPECTRUM" of resulting  $|c_i|$  values used to DETERMINE WHETHER  $x(h)$  belongs to THIS MATERIAL.

## ■ CUMULATIVE DISTRIBUTION FUNCTIONS - CONT'D.

- IDEA: If  $x(\bar{h})$  can be "very well approximated" by  $a$ , i.e.  $\|x(\bar{h}) - a\| \ll 1$ , then  $x(\bar{h})$  is well approximated by a small number of (principal) eigen-distributions and  $x(\bar{h})$  therefore represents another instance of this specific material.

- Example: 3 cumulative distrib. fcts. clusters for 3 materials  $\Rightarrow$  3 clusters:



most important eigen-distribution fcts.  
for materials ①, ②, ③

- 7) CLASSIFICATION:  $x(\bar{h})$  approximated well by expansion  $a$  using eigen-distrib. fcts. of material  $M \Leftrightarrow x(\bar{h})$  represents  $M$ .

- NOTE: Using INDEPENDENT COMPONENT ANALYSIS (ICA) could be used as well.