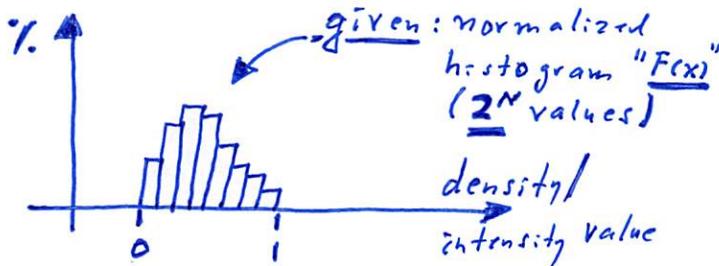


■ Wavelets: A Tool for Improving Computational Efficiency - And Possibly Classification & Detection?

→ ISSUE: Histograms are represented as power-of-2 "bar diagrams" = piecewise-constant functions.

⇒ Haar wavelets are ideal to represent these histograms/functions - and approximate them at a desired/necessary degree of precision.

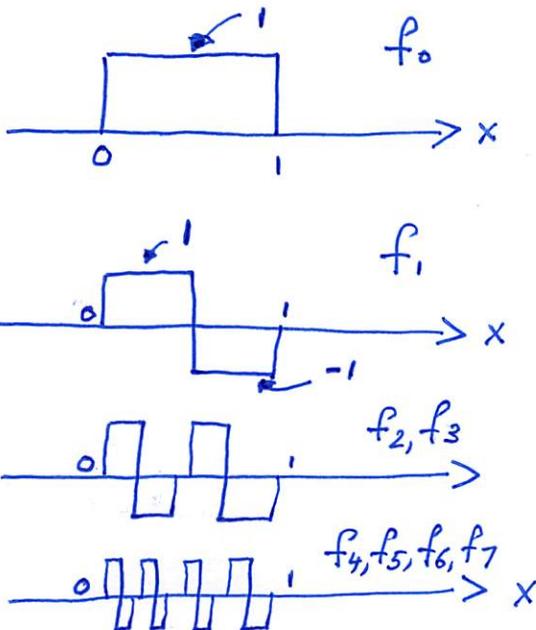
→ Illustration: [1D case; normalized histogram and basis functions defined over domain [0,1]]



(i) Basis functions  $f_i$  are normalized and mutually orthogonal to each other:

$$\langle f_i, f_j \rangle = \begin{cases} 1 & \text{if } i=j \\ 0 & \text{otherwise} \end{cases}$$

• Haar wavelet basis functions:



(ii) Calling the original histogram " $F$ " and the independent variable " $x$ ", one can write  $F(x)$  as:

$$F(x) = \sum_{i=0}^{2^N-1} c_i f_i(x), \text{ where}$$

$$c_i = \langle F, f_i \rangle = \int_0^1 F \cdot f_i dx, \text{ see}$$

Stollnitz, DeRose, Salesin...

## ■ Haar Wavelets (cont'd.)

Thoughts: 1) Haar wavelets decompose the histogram of an object/material type into a set of increasingly higher-frequency basis functions.

2) The projection of an original histogram onto the set of Haar wavelet functions produces a spectrum of coefficients  $c_i$  for the expansion  $\sum_{i=0}^{2^N-1} c_i f_i(x)$ ;

question: DOES A SMALL SUBSET OF THESE COEFFICIENTS SUFFICE TO 'CAPTURE' THE IMPORTANT INFORMATION DEFINING AN OBJECT/MATERIAL TYPE?

3) CHALLENGE: One must determine the minimal set of wavelet coefficients  $c_i$  that uniquely defines an object/material type (well enough) to allow one to perform correct classification and detection.

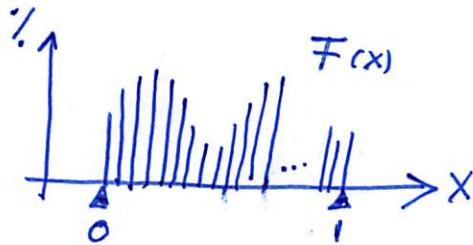
• WHY? → Computational complexity will depend on the resolution  $N$  of a 'binned' 1D, 2D, multi-D histogram. Complexity could be  $O(N)$ ,  $O(N^2)$ , ...

→ IF  $K$  WAVELET COEFFICIENTS ( $K \ll N$ ) SUFFICE TO REPRESENT AN OBJECT/TYPE, COMPUTATIONAL COST WILL DECREASE.

■ Wavelets... (cont'd.)

[Reference: Eric Stollnitz, Tony DeRose, David Salesin -  
Wavelets for Computer Graphics: A Primer, Part 1]

• Given histogram

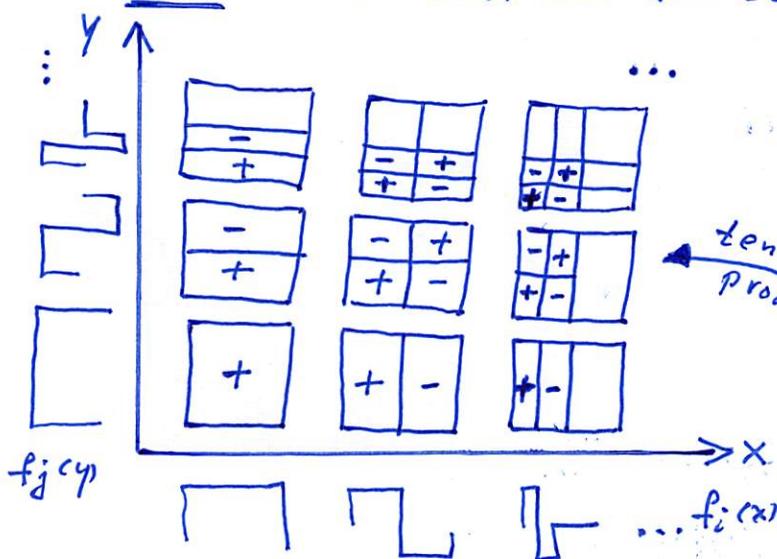


• Wavelet representation

$$f(x) = \sum_{i=0}^{2^N-1} c_i \cdot f_i(x)$$

⇒ How to use the coefficients  $c_i$ ?

- 1) Order coefficients  $c_i$  by absolute magnitude and use only that subset of that ordered set of coefficients that "suffices for correct classification and detection."
- 2) Use only the subset of coefficients that belongs to a (or several) specific frequency(ies)/band(s) that "suffices for correct..."
- 3) Determine the minimal subset of coefficients that "suffices for correct..."



• 2D case:

(i) Use basis functions  $f_i(x)$  and  $f_j(y)$  to define bivariate basis functions:

$$f_{i,j}(x,y) = f_i(x) \cdot f_j(y)$$

(ii) 2D wavelet representation:

$$F(x,y) = \sum_i \sum_j c_{i,j} \cdot f_{i,j}(x,y)$$