# ECE 468: Digital Image Processing

Lecture 18

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#### **Outline**

- Multiresolution image processing (Textbook 7.1)
- Image Pyramids (Textbook 7.1.1)

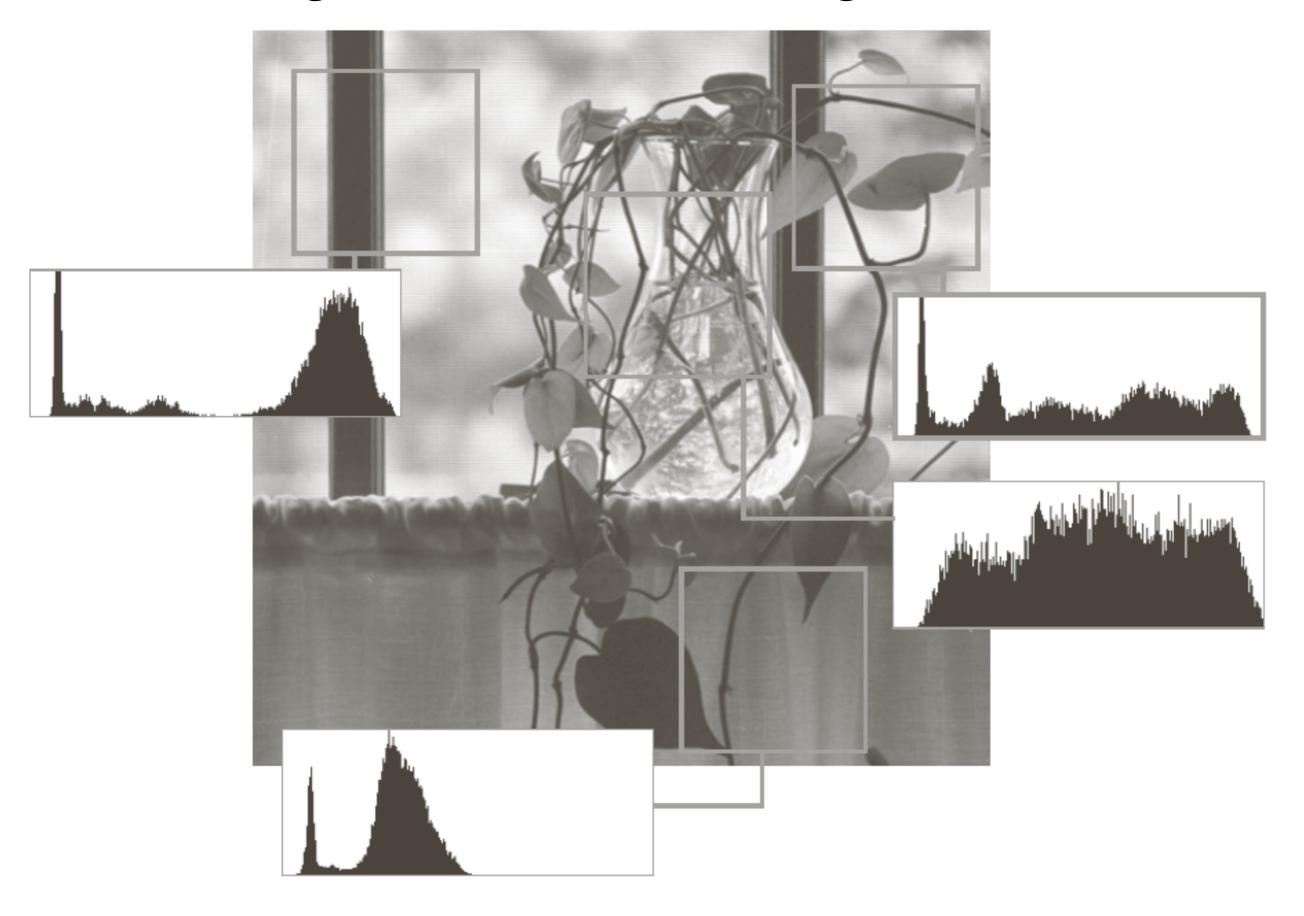
#### **Multiresolution Image Processing**

- Informal motivation:
- Images may show both very large and very small objects.
- It may be useful to process the images at different resolutions.

### **Multiresolution Image Processing**

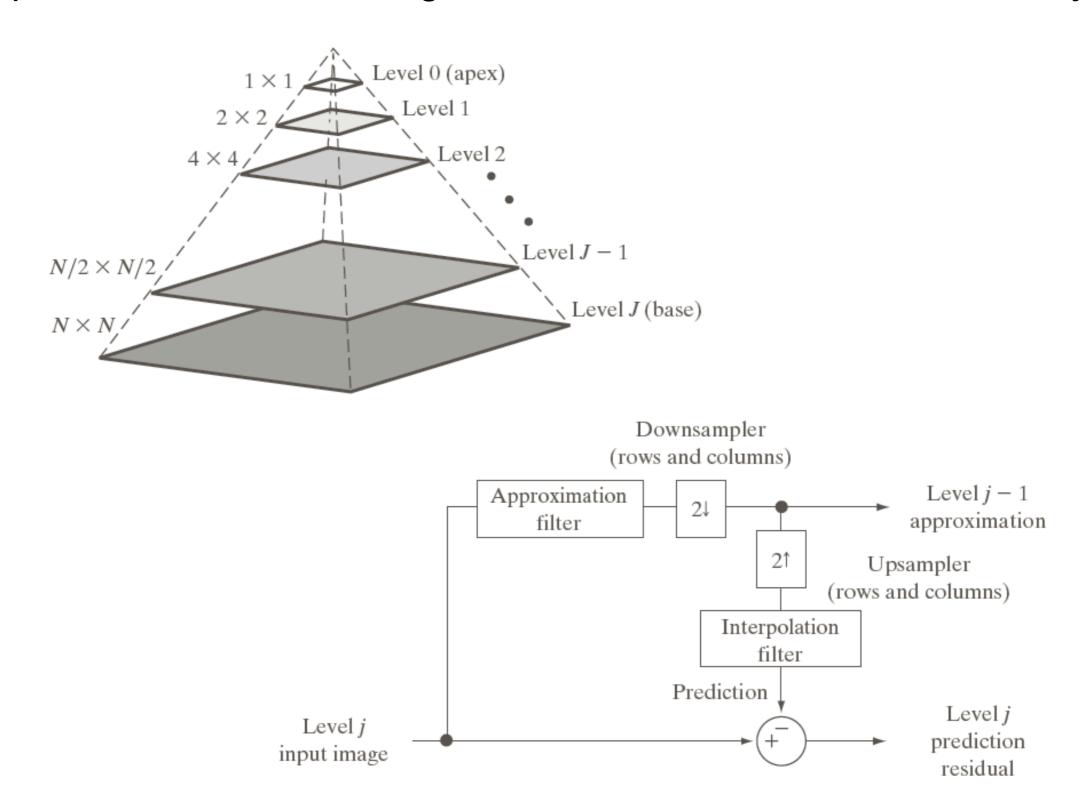
- A more formal motivation:
- An image is a 2D random process with locally varying statistics of pixel intensities
- Analysis of statistical properties of pixel neighborhoods of varying sizes may be useful

## **Histogram of Small Pixel Neighborhoods**

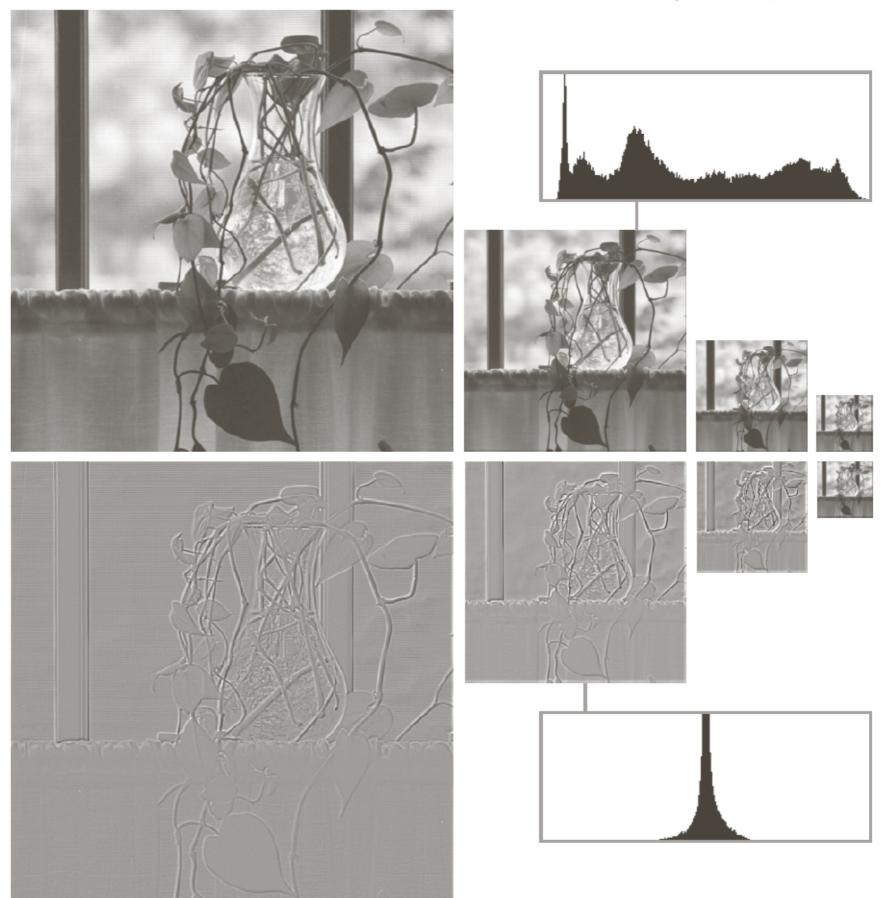


#### **Image Pyramids**

A representation of the image that allows its multiresolution analysis



## **Example: Image Pyramids**

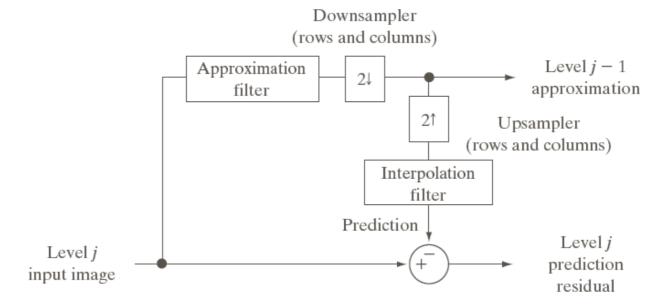


a b

#### FIGURE 7.3

Two image pyramids and their histograms:
(a) an approximation pyramid;
(b) a prediction residual pyramid.

### Steps to Construct the Image Pyramid



- 1. Given an image at level j
- 2. Filter the input and and downsample the filtered result by a factor of 2; This gives the image at level j-1
- 3. Goto 1
- 4. Upsample and filter the image at level j-1; this gives an approximation of the image at level j
- 5. Subtract this result from the image at level j; this give the prediction residual at level j

6. Goto 1

#### **Typical Filters**

- For the multiresolution pyramid, we use spatial filters:
  - Neighborhood averaging
  - Lowpass Gaussian filter

- For the residual pyramid, we use interpolation filters:
  - bilinear
  - bicubic

### **Upsampling/Downsampling**

Upsampling = Inserting zeros

$$f_{2\uparrow}(x,y) = \begin{cases} f(x/2,y/2) &, x,y \text{ are even} \\ 0 &, \text{ o.w.} \end{cases}$$

Downsampling = Discarding pixels

$$f_{2\downarrow}(x,y) = f(2x,2y)$$

#### **Next Class**

• Haar Transform (Textbook 7.1.3)