

# CS 414 – Multimedia Systems Design

## Lecture 9 – JPEG 2000

### Compression (Part 4)

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# Administrative

- **MP1 deadline today, February 9**
- **Demonstrations**, Monday, February 9, 5-7pm in 0216 SC
- **MP2** will be posted tonight, February 9
- **MP2 deadline, Monday, March 2**

# JPEG-2000

Original (uncompressed TIF 116KB)



JPEG-2000 (8:1, 14KB)



JPEG (8:1, 14KB)



<http://www.photographical.net/jpeg2000.html>

# JPEG-2000

- Created in 2000 by JPEG committee
- File extension:
  - jp2 for ISO/IEC 15444-1 conforming files
  - image/jp2 for MIME type

# JPEG-2000 Features

## ■ Low bit rate compression performance

- Current standards offer excellent rate-distortion performance in mid and high bit rates
- Low bit rate distortions become unacceptable

## ■ Lossless and lossy compression

- Current standard does not provide superior lossless and lossy compression in a single code-stream

# JPEG-2000

## ■ Large Images

- Current standard does not allow for images larger than 64Kx64K pixels without quality degradation

## ■ Single decompression architecture

- Current standard has 44 modes (application specific, and not used by majority JPEG coders)
- Single common decompression architecture can provide greater interchange between applications

# JPEG-2000 Features

- **Transmission in noisy environment**
  - Current standard has provision for restart intervals, but image degrades badly when bit errors occur.
- **Computer generated imagery (Graphics)**
  - Current standard is optimized only for natural imagery
- **Compound documents**
  - Current standard is not applied to compound documents because of its poor performance when applied to text imagery

# JPEG-2000 Criteria

- Superior **low bit rate performance**
  - Below **0.25 bits per pixel** for highly detailed grey-scale images
- Lossless and lossy compression
  - Lossless compression uses **progressive decoding** (i.e., difference image encoding) for medical imaging
- Progressive transmission by pixel accuracy and resolution
  - Reconstruction of images is possible with different resolutions and pixel accuracy for different target devices

# JPEG-2000 Criteria

## ■ Random code-stream access and processing

- Needed in case images have parts that are more important than others
- User defines “regions-of-interest” in the image to be randomly accessed and/or decompressed with less distortion than the rest of images
- random code-stream processing allows operations: rotation, translation, filtering, feature extraction, scaling,...

# Methods of Compression

- **DCT-based coder**

- ☐ New baseline JPEG algorithm required for backward compatibility with existing JPEG

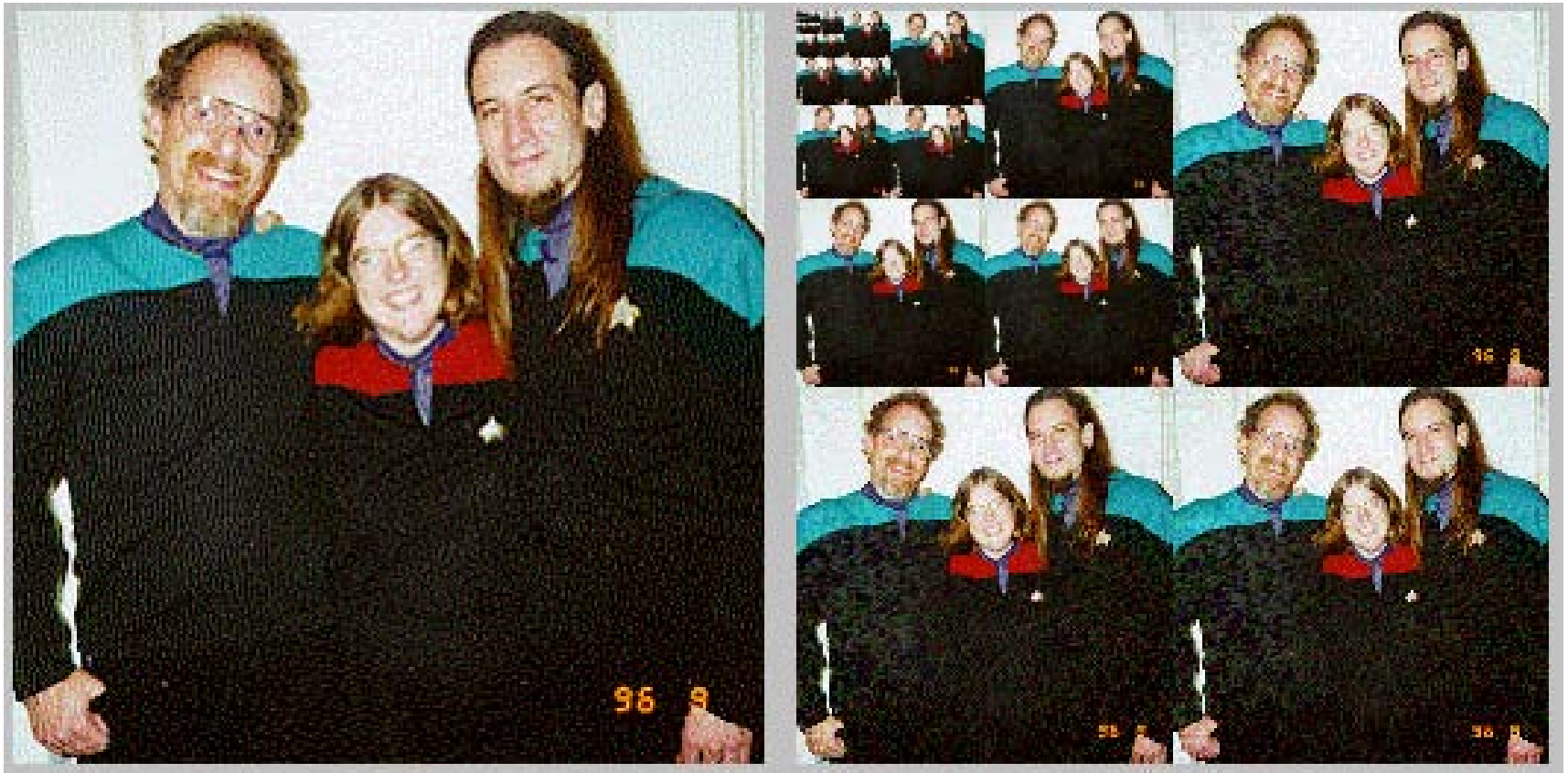
- **Wavelet-based coder**

- ☐ This method permits coding of still images with high coding efficiency as well as spatial and SNR (signal-to-noise ratio) scalability at fine granularity

# Wavelet Transform

- JPEG-2000 uses two different wavelet transforms:
  - **Irreversible:** it introduces quantization noise that depends on precision of the decoder
  - **Reversible:** it uses only integer coefficients, so the output does not need quantization (used in lossless coding)

# 2D Wavelet Transform for Image Progressive Transmission



# Wavelet Transform

- DWT (Discrete Wavelet Transform) extracts information from the source image at **different scales, locations and orientations**
- JPEG-2000 uses **2D wavelets and multi-scale transforms**
- Wavelet is defined as a **set of basic functions**, derived from the same prototype function
- Prototype function is known as “**mother wavelet**”
  - Examples: “**Mexican Hat**” wavelet, Haar wavelet

# Wavelet Coding Method

Integral 1D wavelet transform defined as :

$$W(a, b) = \frac{1}{\sqrt{a}} \int_{-\infty}^{+\infty} f(x) \psi^* \left( \frac{x - b}{a} \right) dx$$

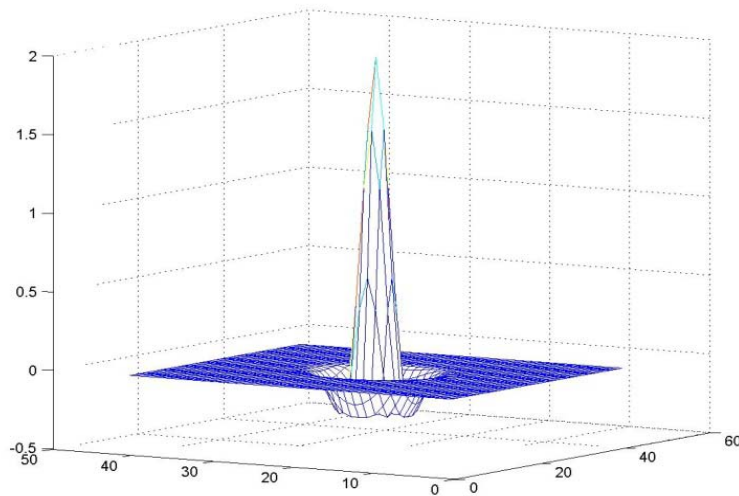
- $W(a, b)$  is the wavelet coefficient of the function  $f(x)$
- $\psi(x)$  is the analyzing wavelet
- $a (> 0)$  is the scale parameter
- $b$  is the position parameter

<http://jstarck.free.fr/transf.htm>

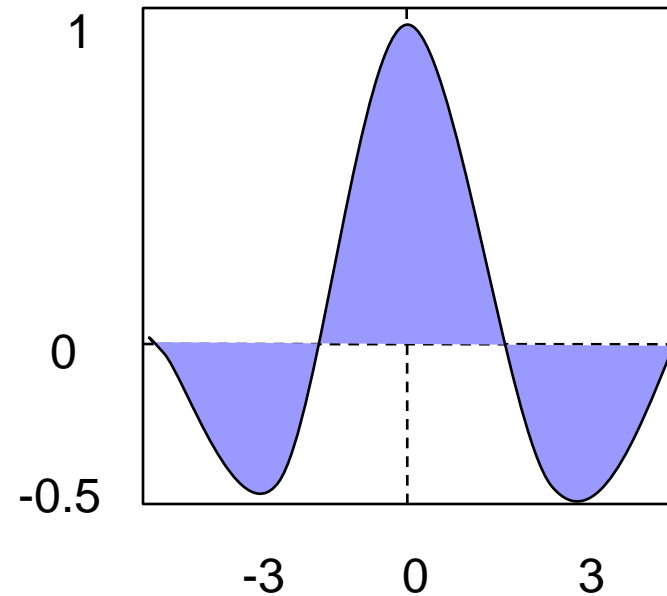
# 1D/2D Mexican Hat wavelet

Time domain

$$\Psi(x, y) = (x^2 + y^2 - 2)e^{-\frac{1}{2}(x^2 + y^2)}$$



$$\psi(x) = \left(1 - \frac{x^2}{\sigma^2}\right)e^{-\frac{x^2}{2\sigma^2}}$$



# Wavelet Transform Properties

- Wavelet transform coders process **high and low frequency parts of image independently**
  - DCT methods have difficulties with high-frequency information
- Wavelet method **transforms image as a whole** (not subdivided into pixel blocks)
  - No blocking artifacts occur
  - Wavelet coders degrade gracefully

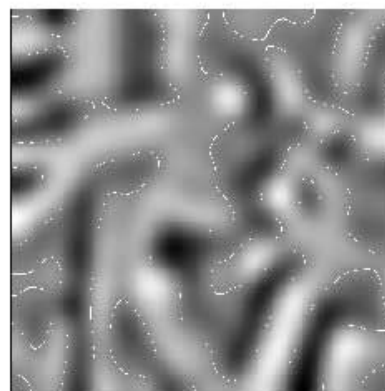
# Example of artifacts produced by wavelet transform



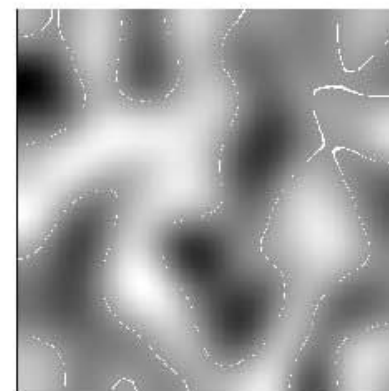
Raw data



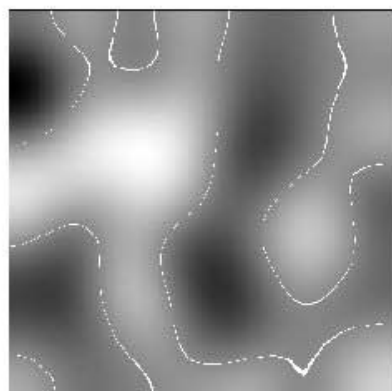
$a'=0.035156$



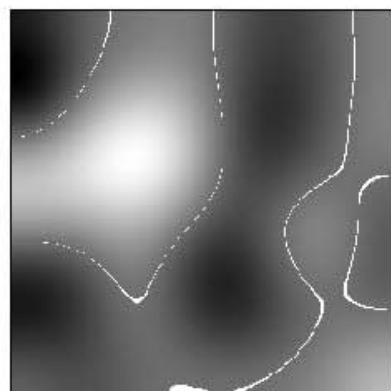
$a'=0.426125$



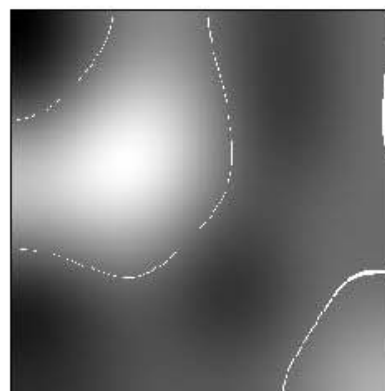
$a'=0.821094$



$a'=1.214063$

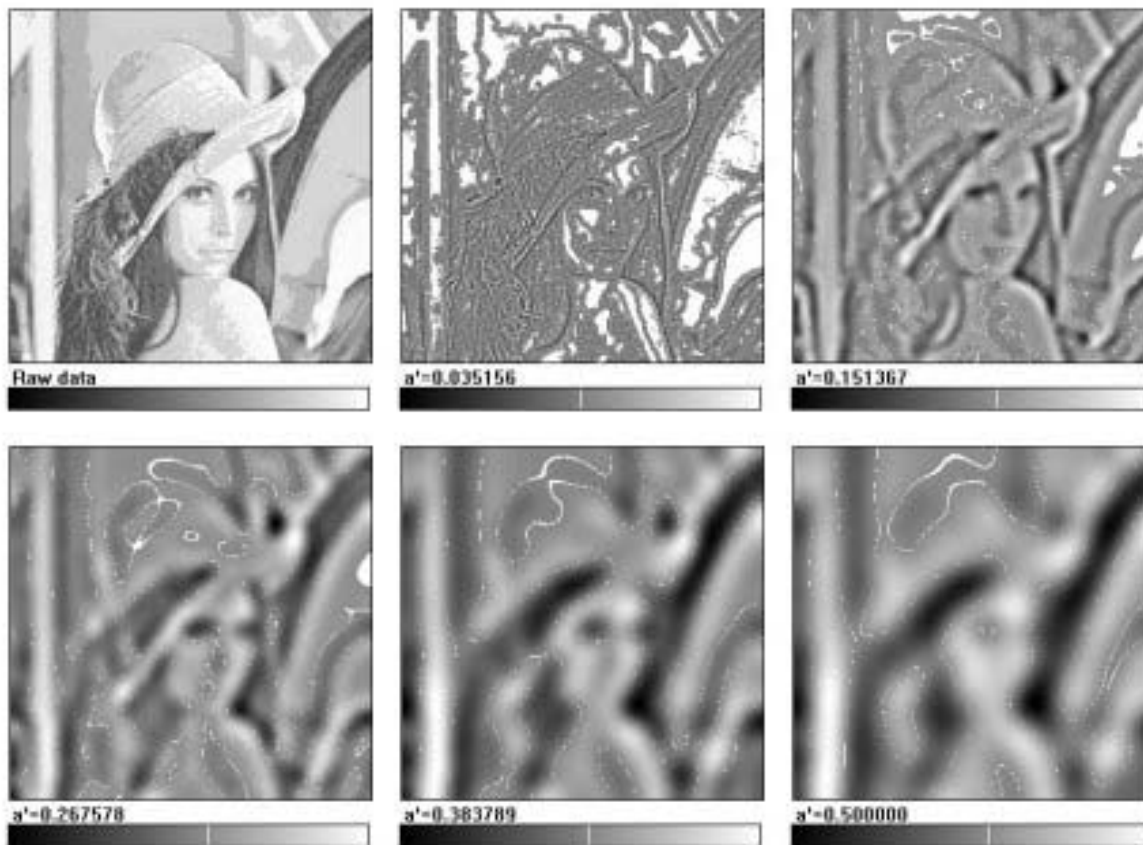


$a'=1.607031$

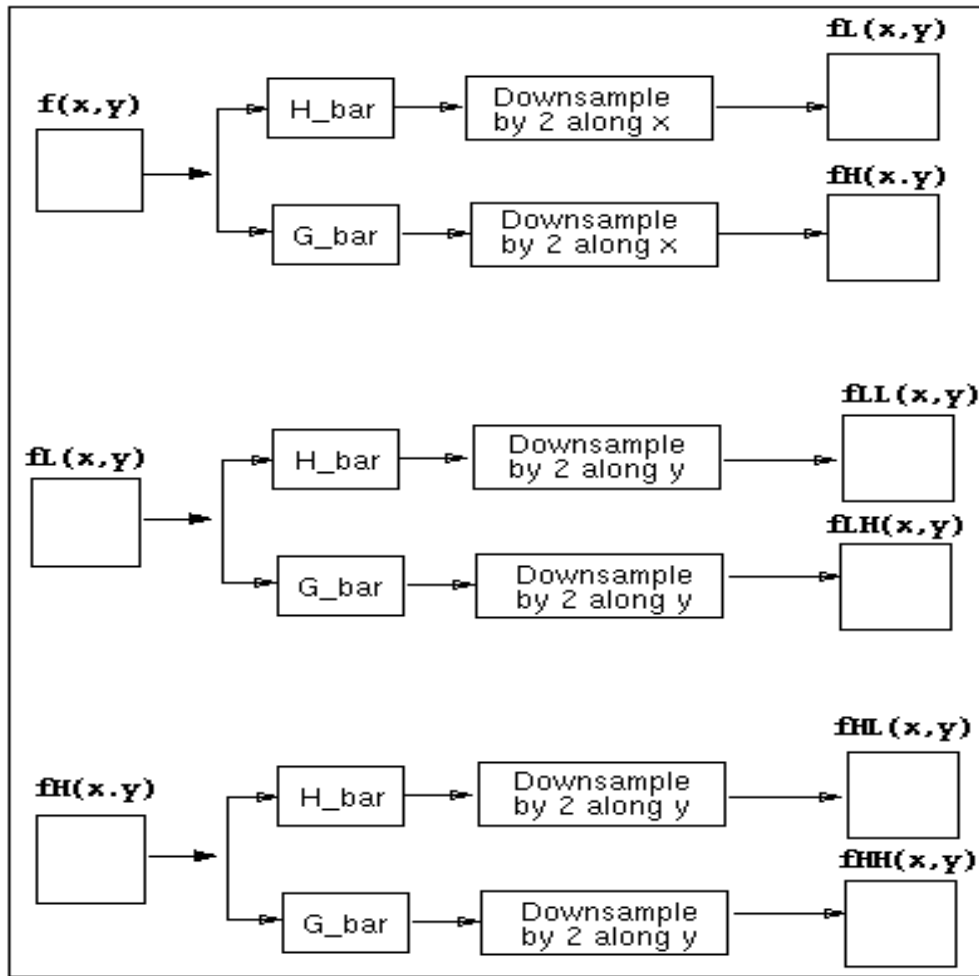


$a'=2.000000$

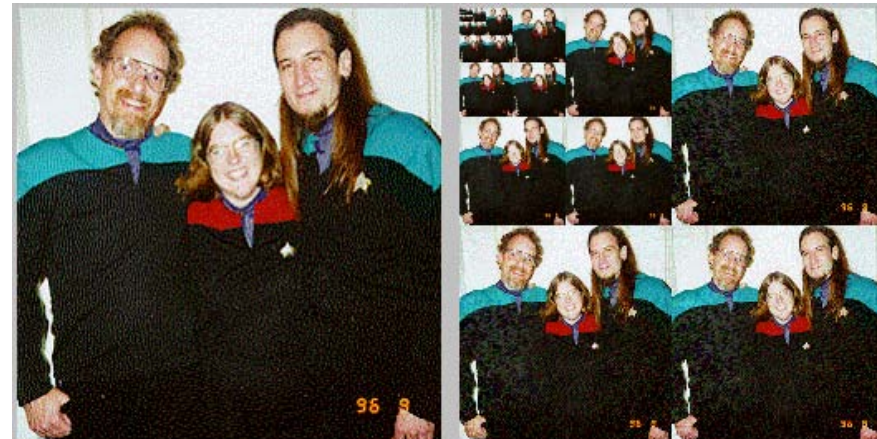
# Example of artifacts produced by wavelet transform

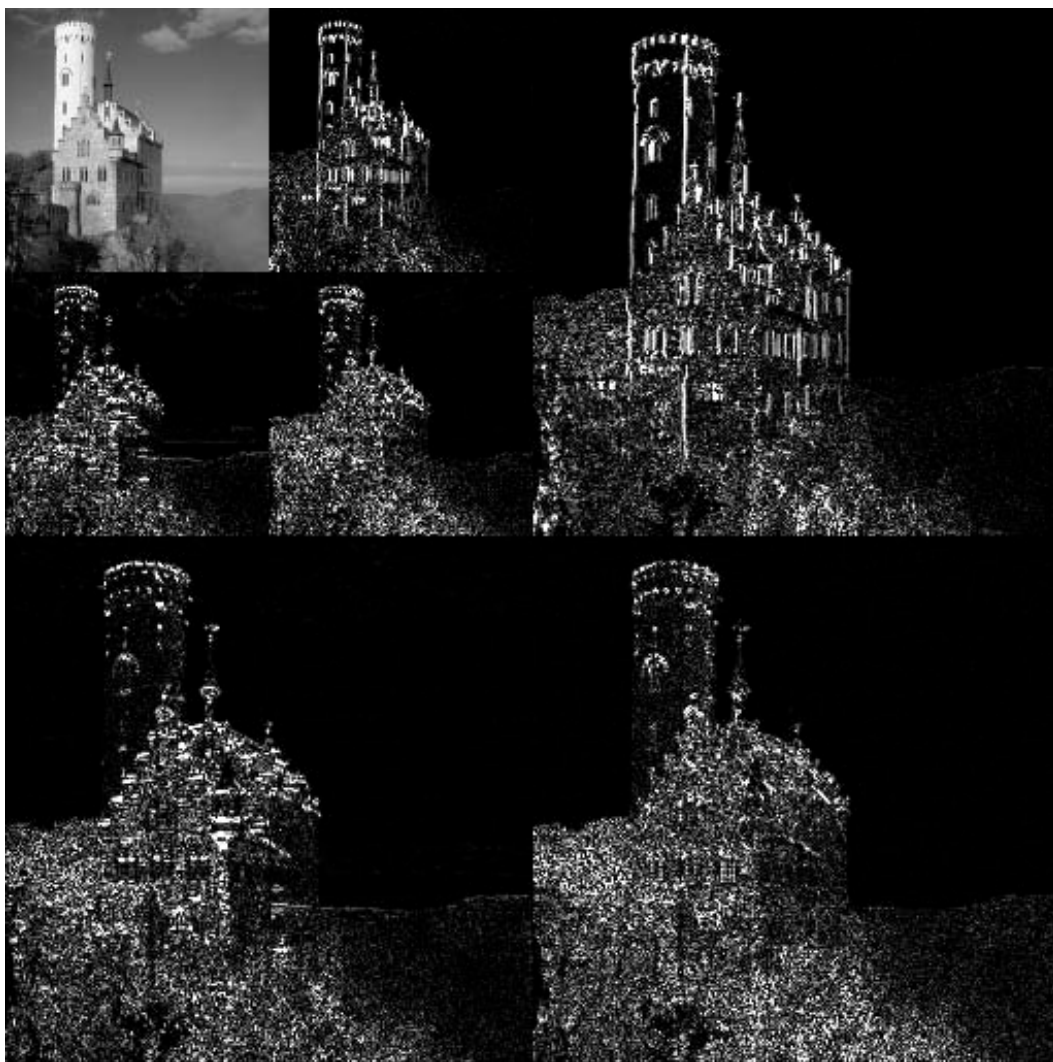


# Forward Wavelet Transform



- Image is **first filtered along the x dimension**, resulting in low-pass and high-pass image
- Since bandwidth of both low pass and high pass image is now half that of the original image, **both filtered images can be down-sampled by factor 2 without loss of information**
- Then both filtered images are **again filtered and down-sampled** along the y dimension resulting in four sub-images

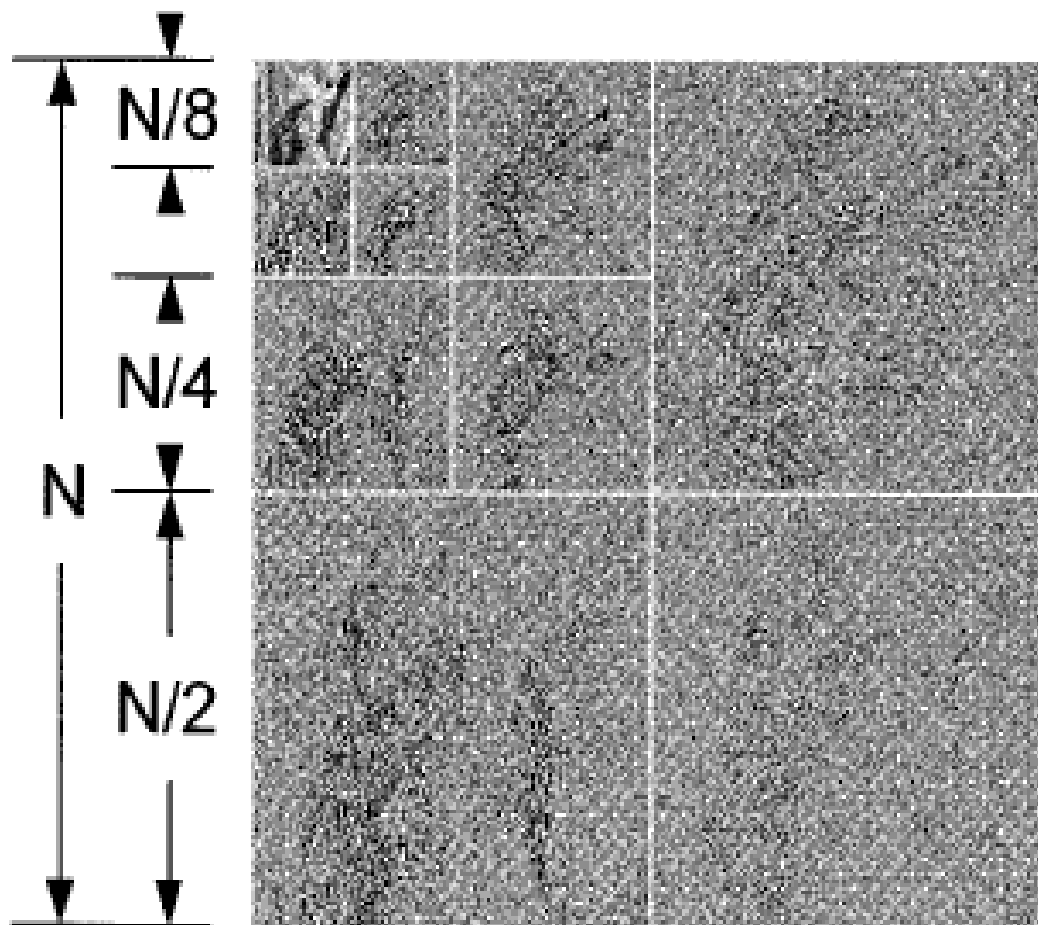




An example of the 2D discrete wavelet transform that is used in [JPEG2000](#). The original image is **high-pass filtered**, yielding the three large images, each describing local changes in brightness (details) in the original image. It is then **low-pass filtered** and **downscaled**, yielding an approximation image; this image is high-pass filtered to produce the three smaller detail images, and low-pass filtered to produce the final approximation image in the upper-left.


(Source: wikipedia)

# Result of Lena Image after 3-level 2-D DWT



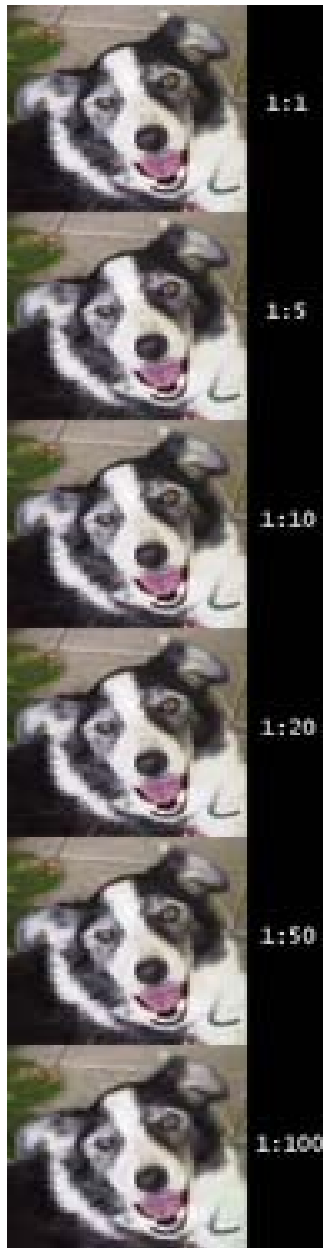
# JPEG-2000 Performance

- Gain up to about **20% compression** performance to the first JPEG standard
- Applications of JPEG-2000
  - Large images
  - Images with low-contrast edges (e.g., medical images)
  - In printers, scanners, facsimile
  - HD satellite images



# Applications of Motion JPEG2000

- Leading digital film standard
- Supported by Digital Cinema Initiatives for storage, distribution and exhibition of motion pictures
- Considered by Library of Congress to be the digital archival format



## Conclusion

### Artifacts of JPEG-2000 Compression

- Compression 1/20 size is without incurring visible artifacts
- If artifacts occur they can be seen as Smoothing rather than squares or mosquito noise