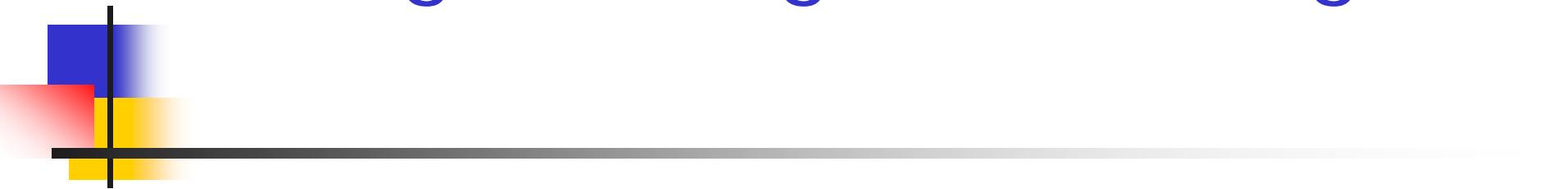
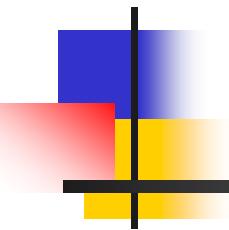


# Digital Image Processing



*Special topic:*  
*Image Editing*



# Lecture Notes: Pixelization and Quantization



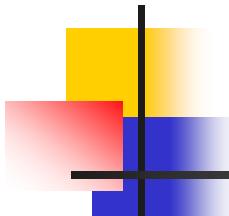
This work is licensed under the Creative Commons Attribution-Noncommercial 2.5 License. To view a copy of this license, visit <http://creativecommons.org/licenses/by-nc/2.5/> or send a letter to Creative Commons, 543 Howard Street, 5th Floor, San Francisco, California, 94105, USA.

# Pixelization ...



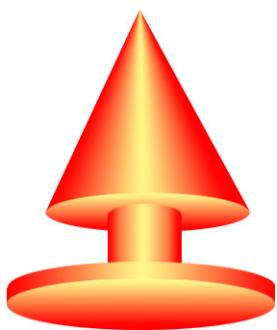
... is a special effect often used to hide identities ...

How to do it?

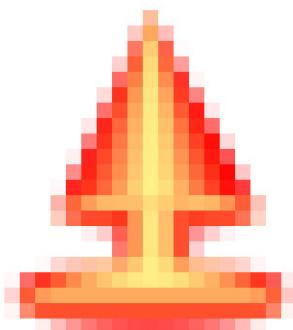


# Pixelization and Quantization

---



high-res image



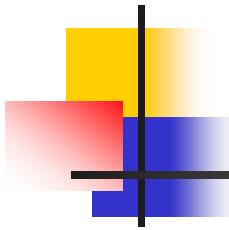
pixelated



quantized

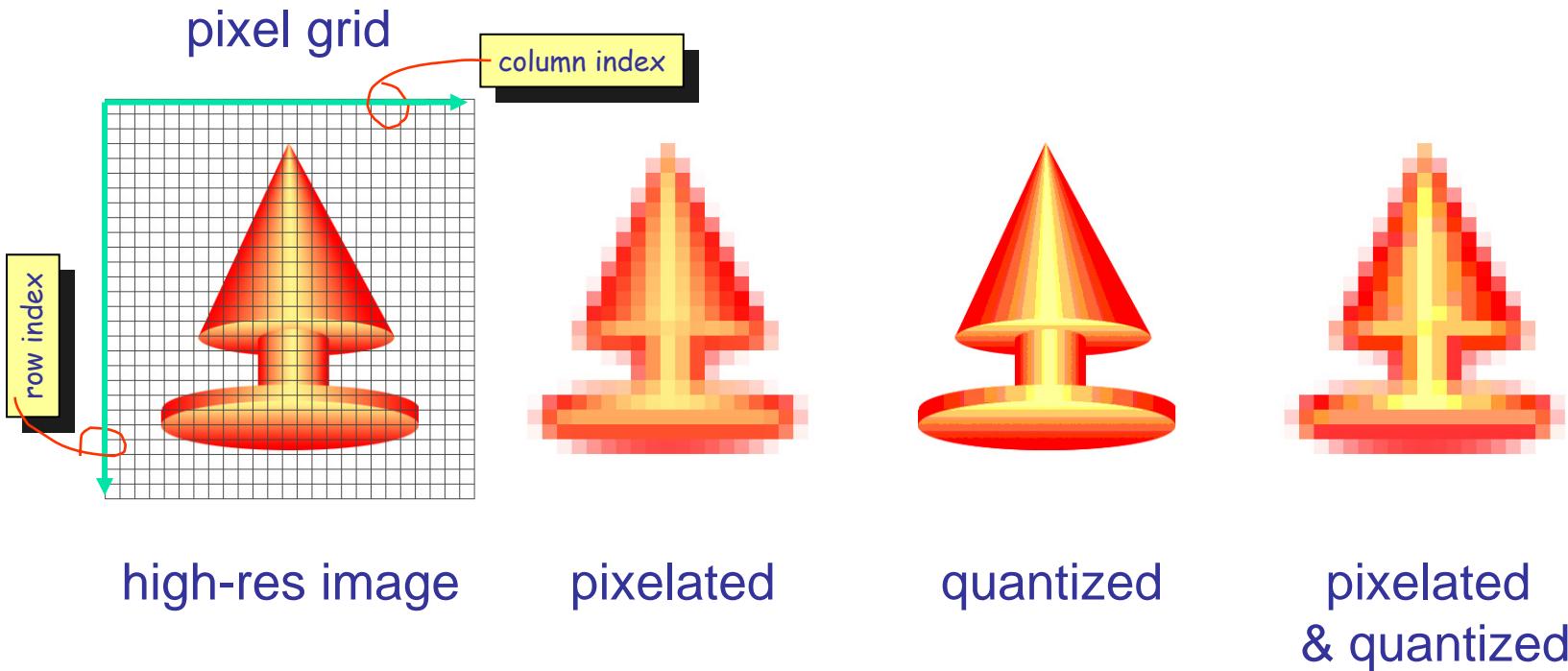


pixelated  
& quantized

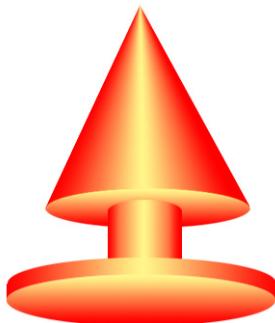


# Pixelization and Quantization

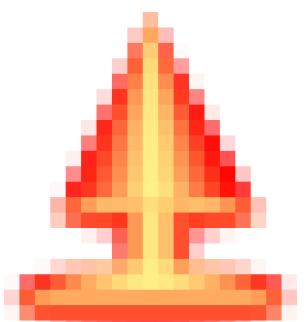
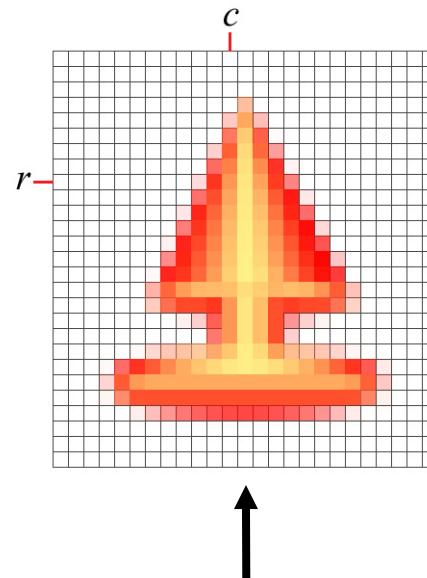
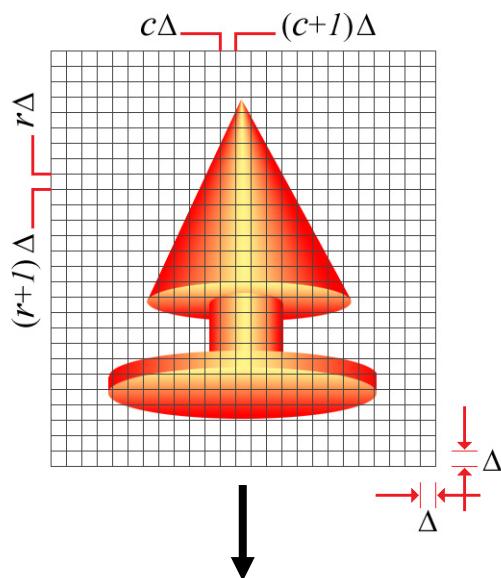
---



# Pixelization



$I(\rho, \chi)$



$I_P(r, c)$

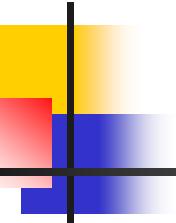
high-res image

$$I_{DS}(r, c) = \frac{1}{\Delta^2} \sum_{\rho=r\Delta}^{(r+1)\Delta-1} \sum_{\chi=c\Delta}^{(c+1)\Delta-1} I(\rho, \chi); \quad I_P = I_{DS} \uparrow \Delta$$

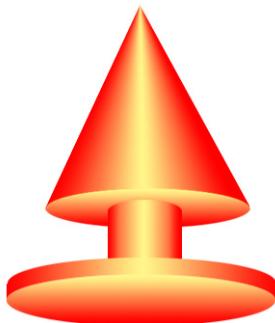
*(upsampled)*

pixelated image

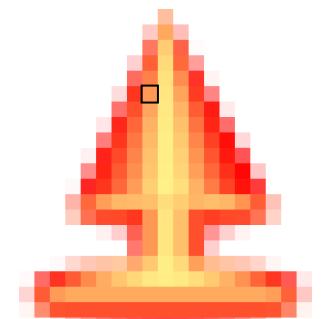
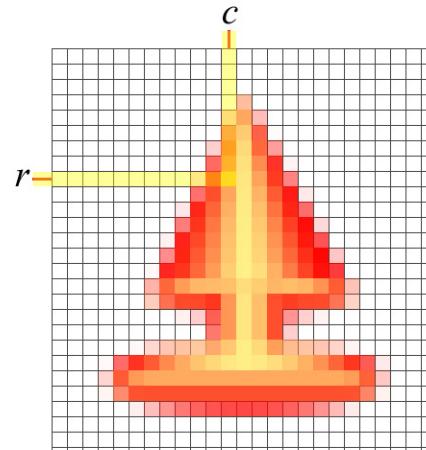
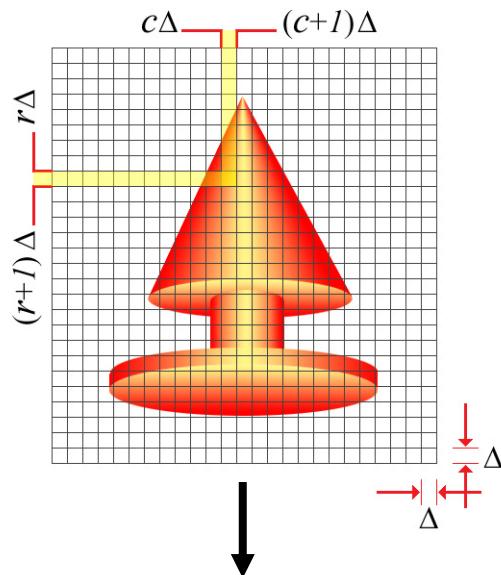
# Pixelization



Take the average  
within each square.



$I(\rho, \chi)$



$I_P(r, c)$

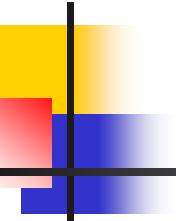
high-res image

$$I_{DS}(r, c) = \frac{1}{\Delta^2} \sum_{\rho=r\Delta}^{(r+1)\Delta-1} \sum_{\chi=c\Delta}^{(c+1)\Delta-1} I(\rho, \chi); \quad I_P = I_{DS} \uparrow \Delta$$

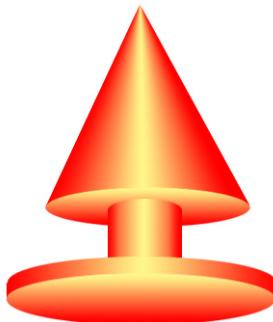
*(upsampled)*

pixelated image

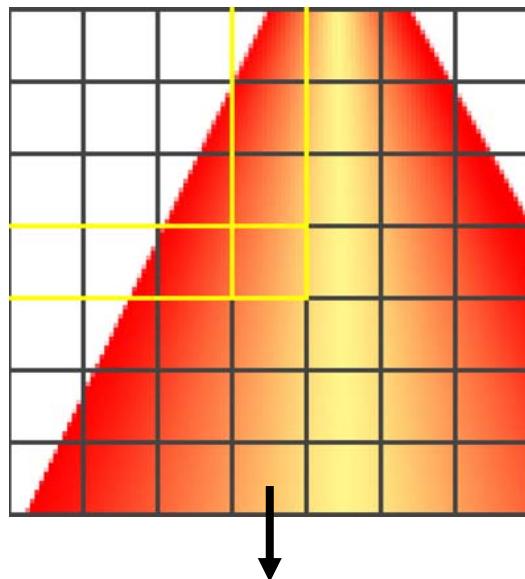
# Pixelization



Take the average  
within each square.



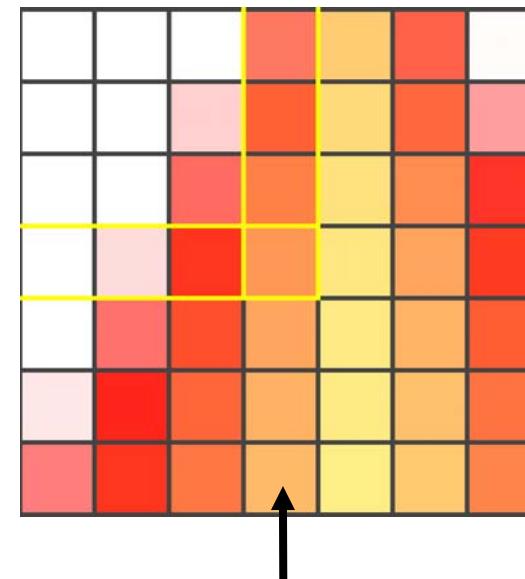
$I(\rho, \chi)$



high-res image

$$I_{DS}(r, c) = \frac{1}{\Delta^2} \sum_{\rho=r\Delta}^{(r+1)\Delta-1} \sum_{\chi=c\Delta}^{(c+1)\Delta-1} I(\rho, \chi); \quad I_P = I_{DS} \uparrow \Delta$$

(upsampled)



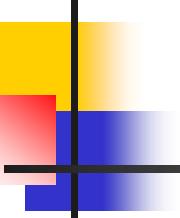
$I_P(r, c)$

pixelated image

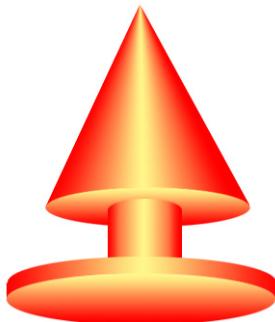
Take the average  
within each square.



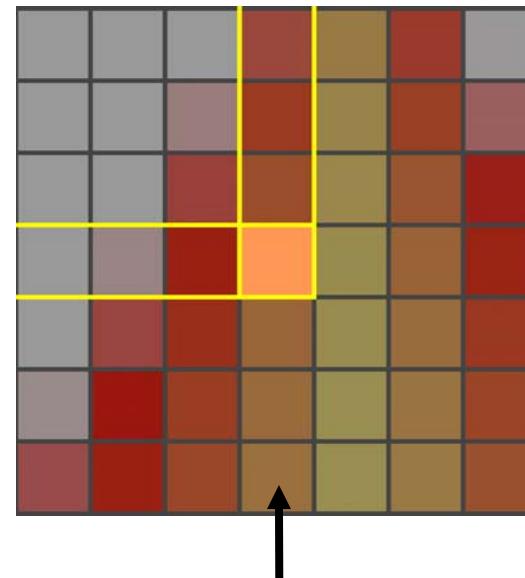
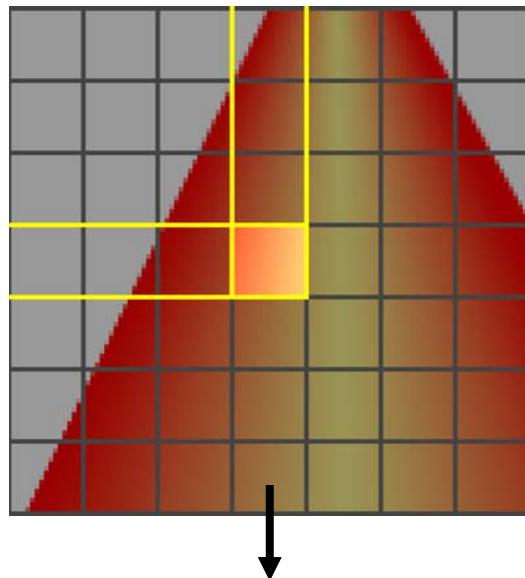
# Pixelization



Take the average  
within each square.



$I(\rho, \chi)$



$I_p(r, c)$

high-res image

$$I_{DS}(r, c) = \frac{1}{\Delta^2} \sum_{\rho=r\Delta}^{(r+1)\Delta-1} \sum_{\chi=c\Delta}^{(c+1)\Delta-1} I(\rho, \chi); \quad I_p = I_{DS} \uparrow \Delta$$

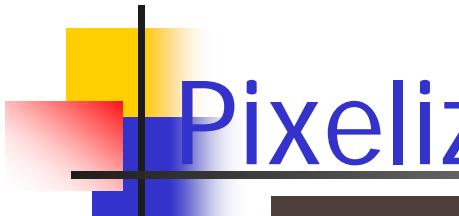
*(upsampled)*

pixelated image

# Pixelization

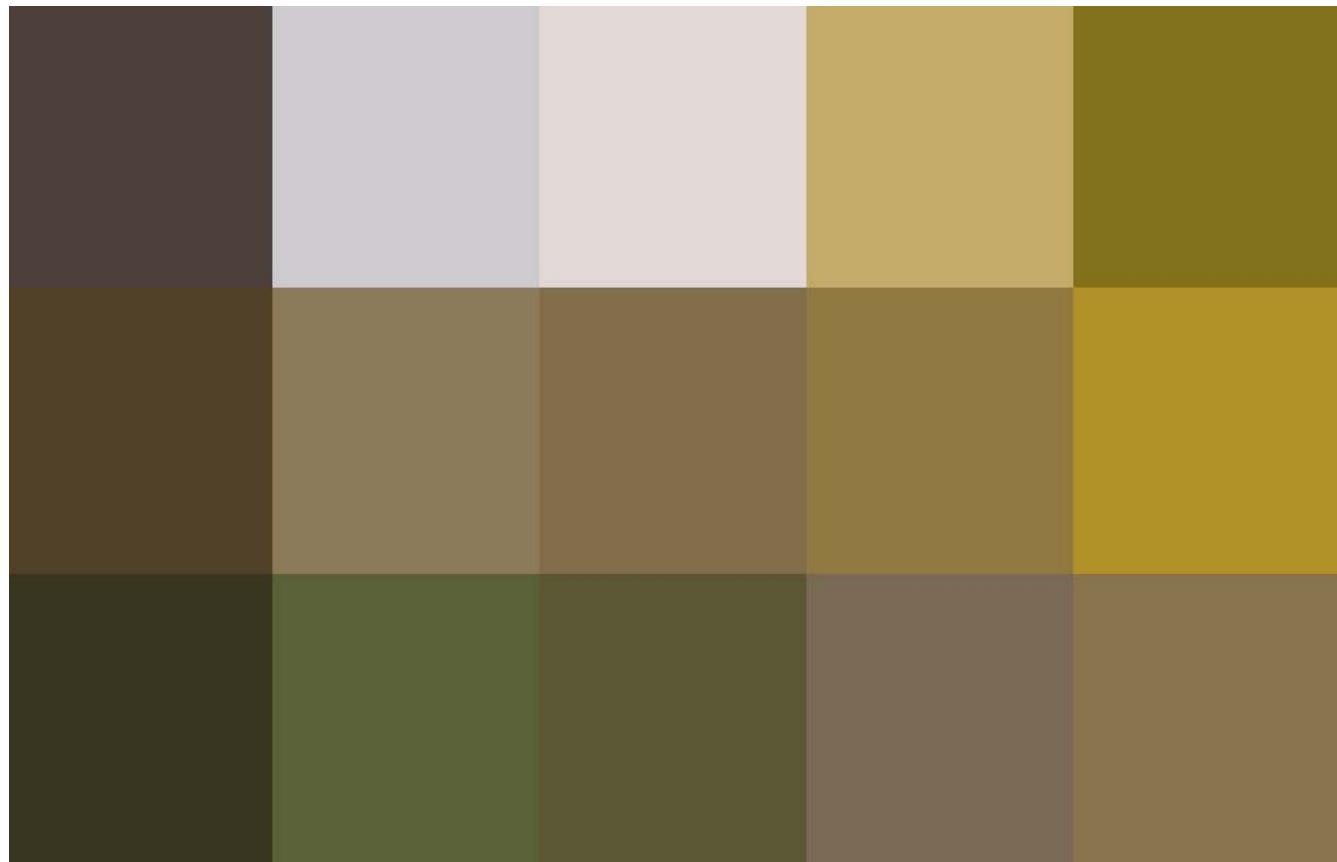


original image



# Pixelization

8 of 8: 256x256





# Pixelization

7 of 8: 128x128



# Pixelization

6 of 8: 64x64



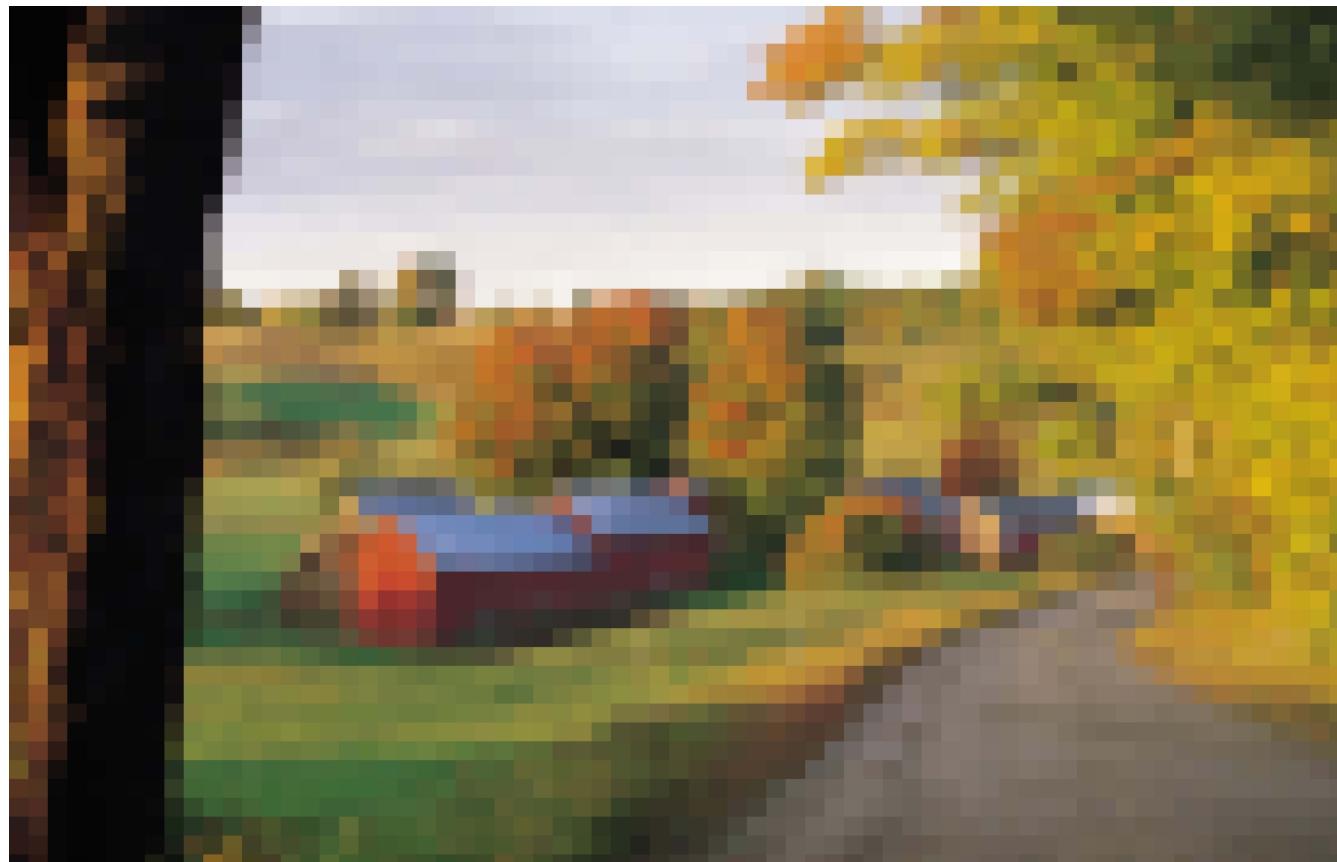
# Pixelization

5 of 8: 32x32



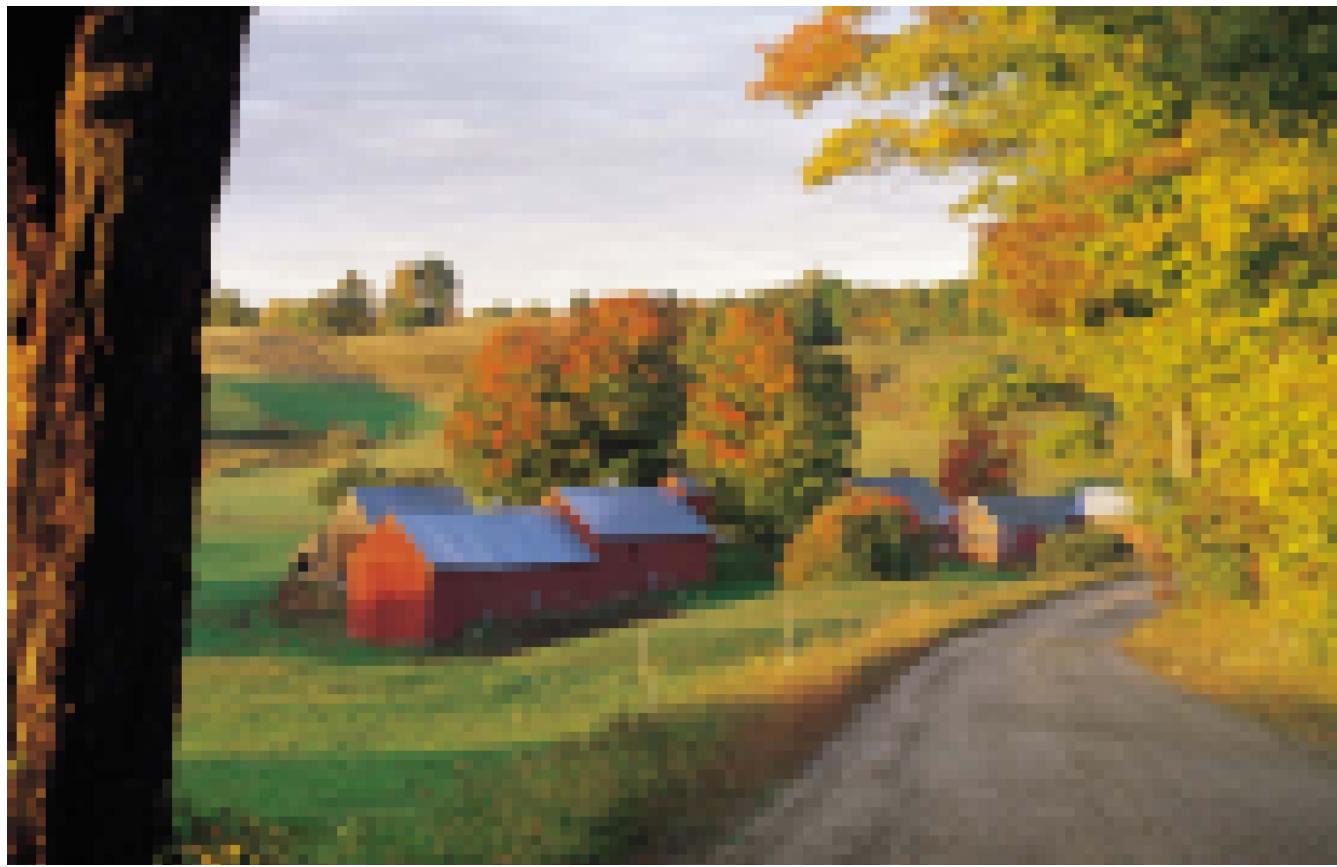
# Pixelization

4 of 8: 16x16



# Pixelization

3 of 8: 8x8



# Pixelization

2 of 8: 4x4



# Pixelization

1 of 8: 2x2



# Pixelization : cross-fade



original image

Cross-fade:  $a * \text{mask} + (1-a) * \text{original}$

# Pixelization by Factor 32

Cross-fade,  $a=5/5$



Cross-fade:  $a \cdot \text{mask} + (1-a) \cdot \text{original}$

# Pixelization by Factor 32

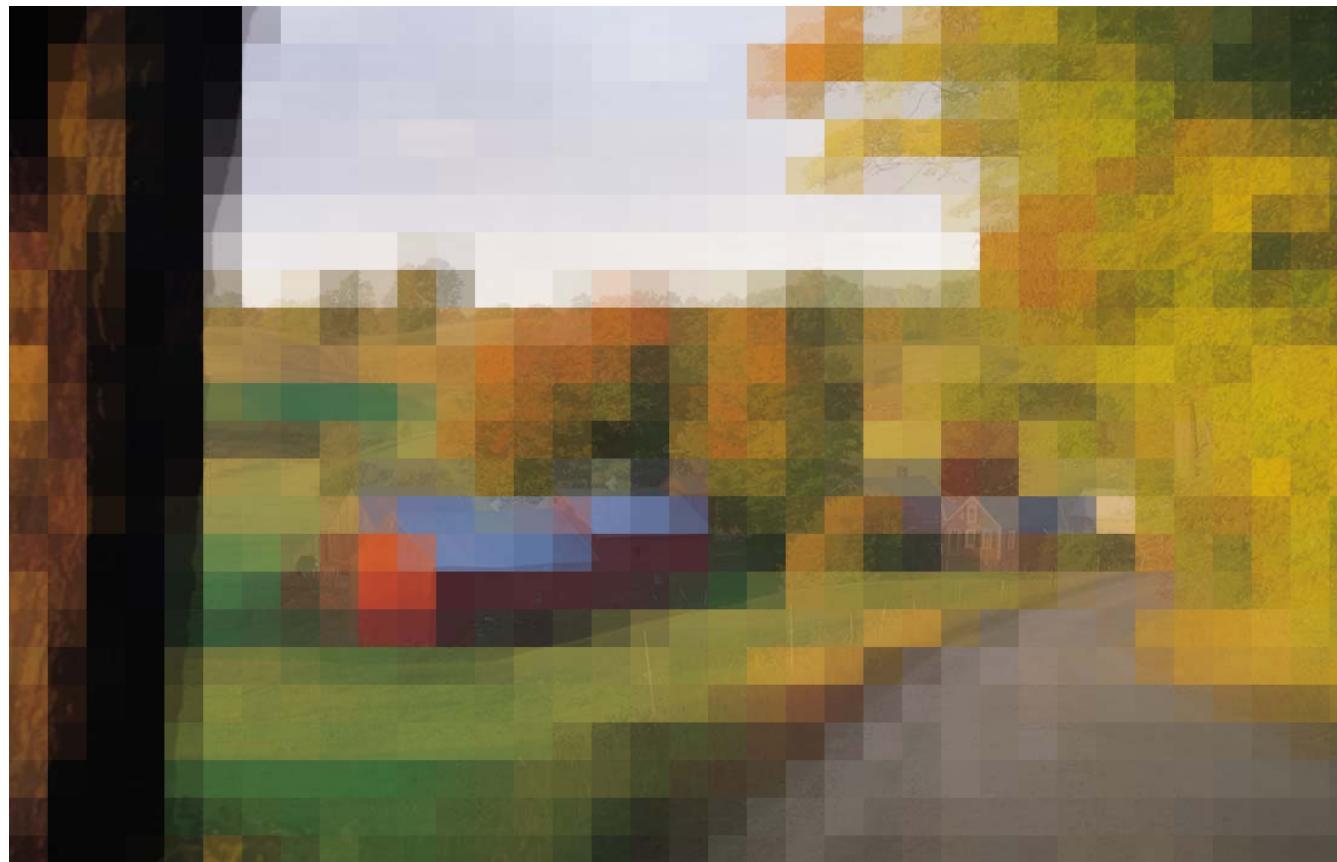
Cross-fade,  $\alpha=4/5$



Cross-fade:  $a * \text{mask} + (1-a) * \text{original}$

# Pixelization by Factor 32

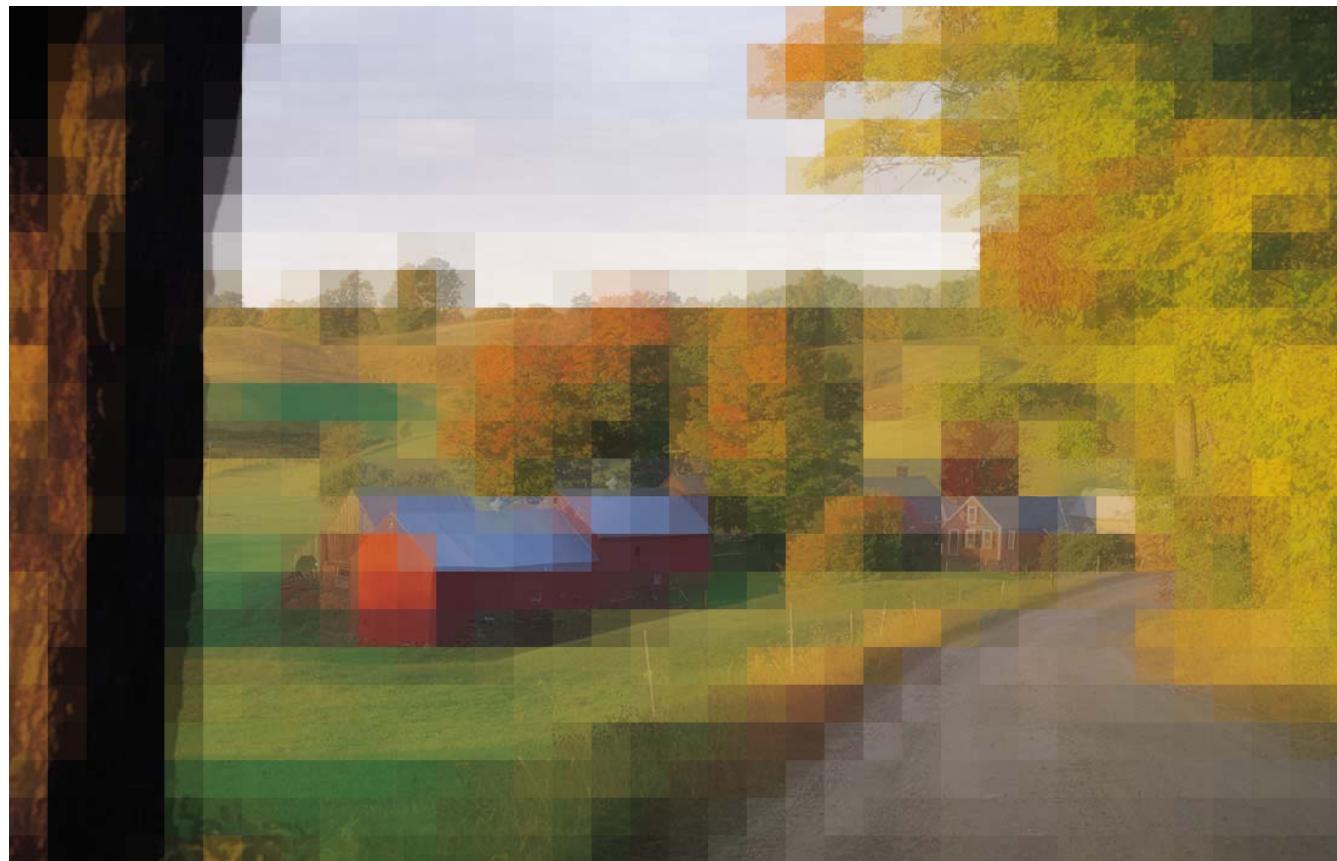
Cross-fade,  $\alpha=3/5$



Cross-fade:  $\alpha * \text{mask} + (1 - \alpha) * \text{original}$

# Pixelization by Factor 32

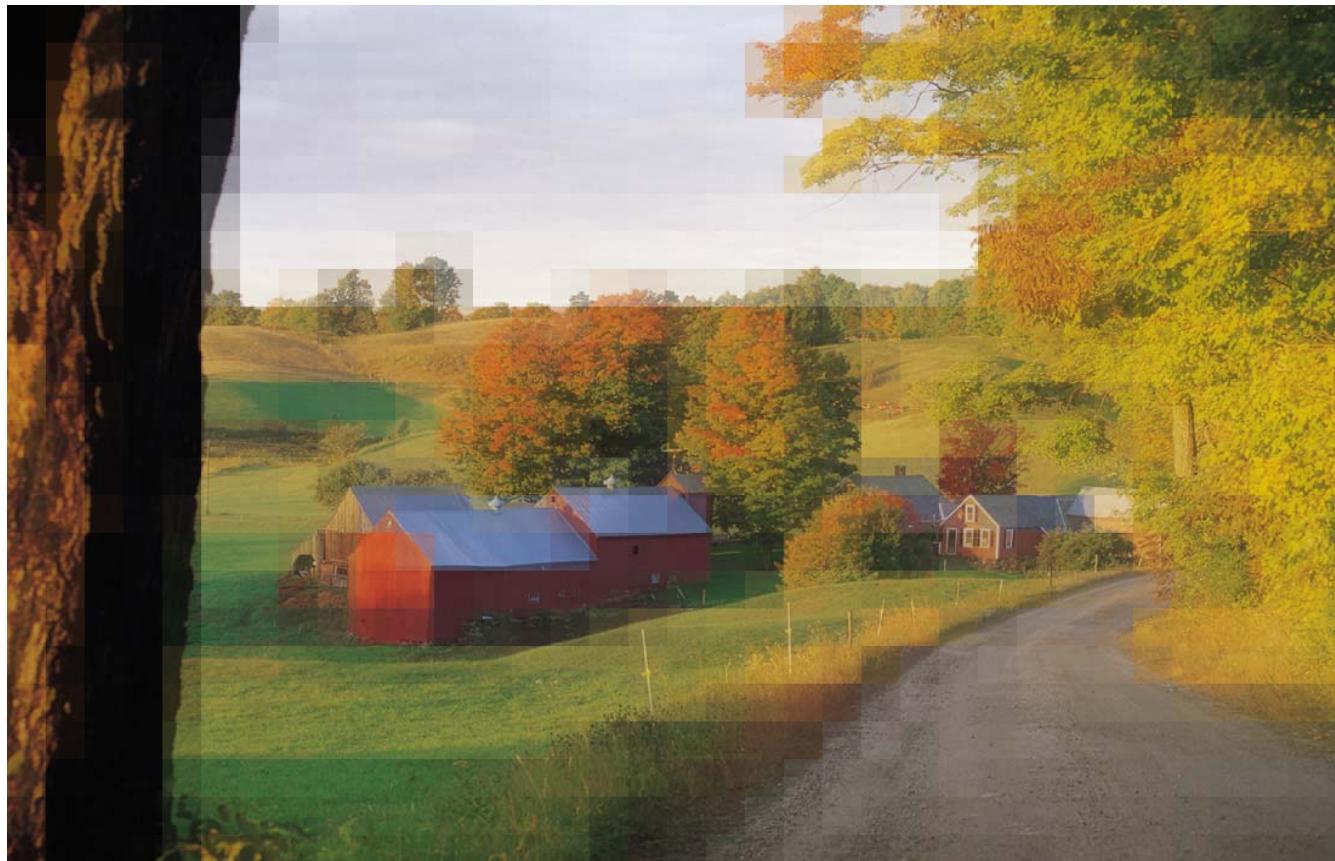
Cross-fade,  $\alpha=2/5$



Cross-fade:  $a * \text{mask} + (1-a) * \text{original}$

# Pixelization by Factor 32

Cross-fade,  $a=1/5$



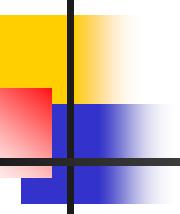
Cross-fade:  $a \cdot \text{mask} + (1-a) \cdot \text{original}$

# Pixelization by Factor 32

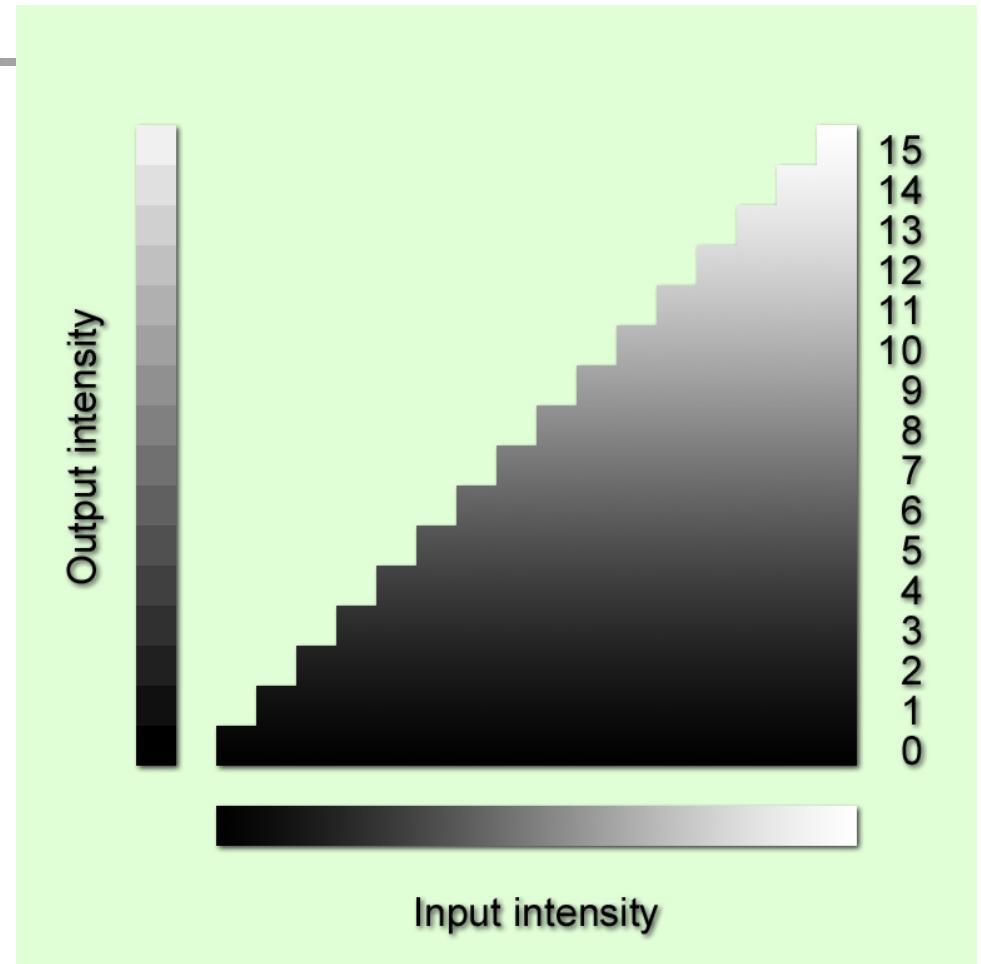
original image



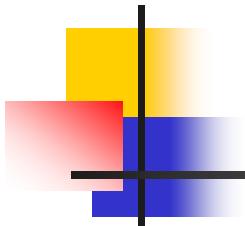
# Quantization



16 colors



# Quantization



8 bits 256 levels



7 bits 128 levels

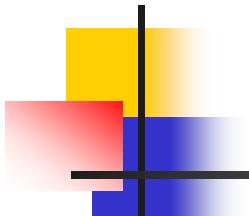


6 bits 64 levels



5 bits 32 levels





# Intensity Quantization

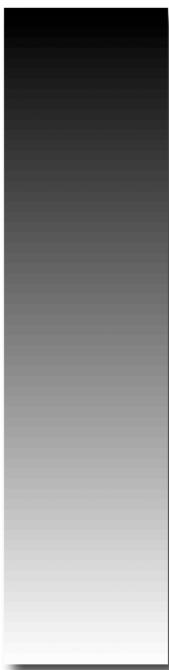
256



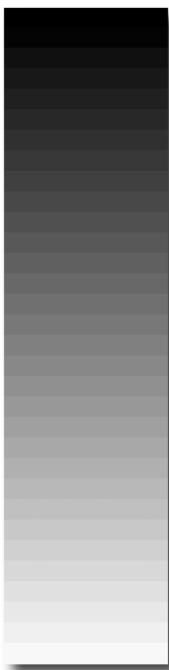
128



64



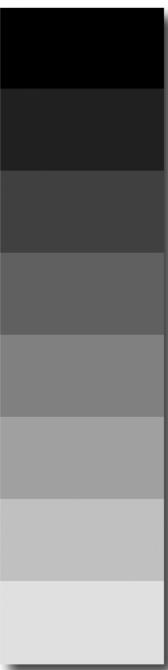
32



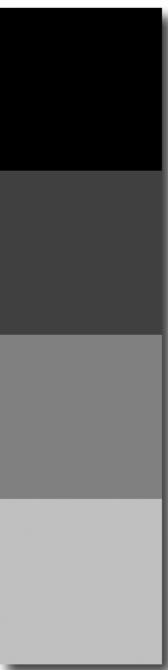
16



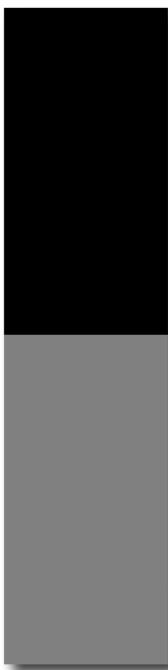
8



4



2



8 bits

7 bits

6 bits

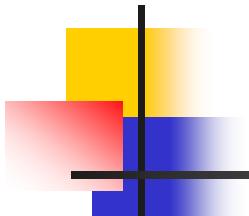
5 bits

4 bits

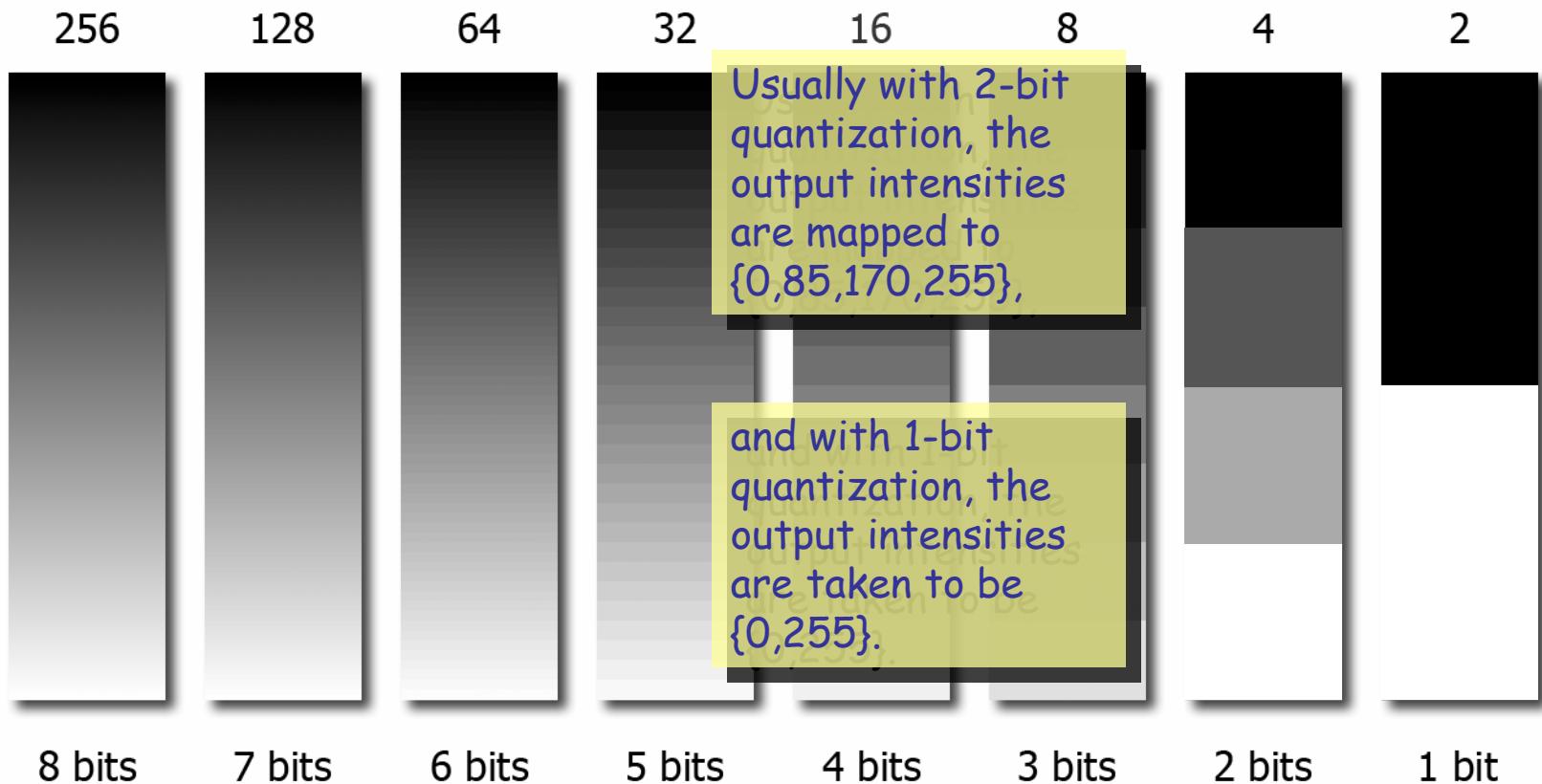
3 bits

2 bits

1 bit



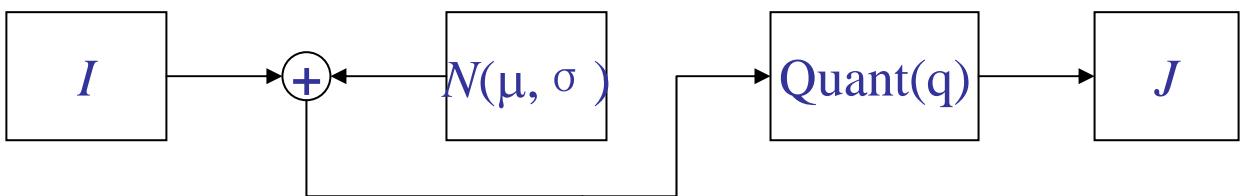
# Intensity Quantization



# Dithering(抖动): Noise Improves Quantization

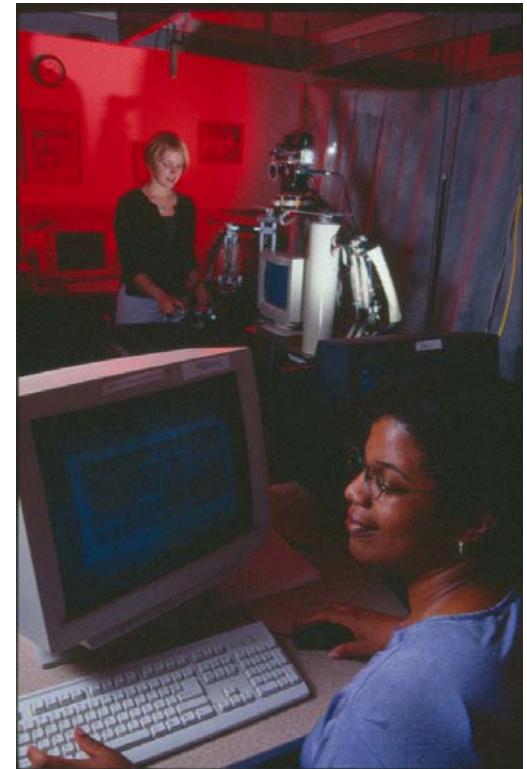
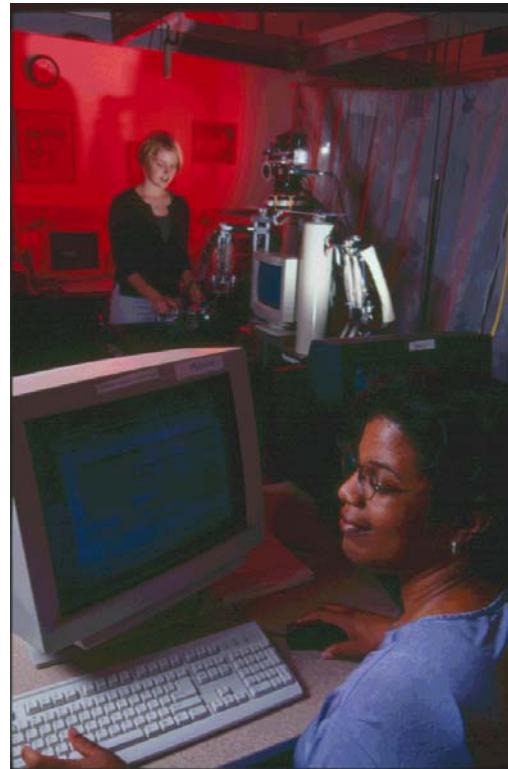
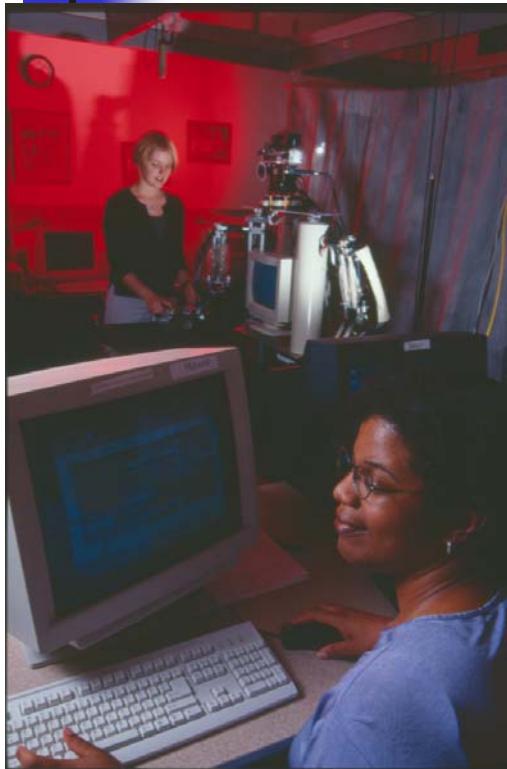


- Quantizing an image into 1, 2, or 3 bits can introduce false contours.
- The addition of signed noise to the image before quantization can improve the appearance of the result. This is called *dithering*.
- The noise usually should have  $\mu = 0$ .
- The  $\sigma$  of the noise must be determined through experimentation since it depends on the image being quantized. A reasonable first choice for uniformly distributed noise is  $\sigma = \frac{1}{4}M/q$ , where  $M$  is the maximum intensity value in the image (e.g. 255) and  $q$  is the number of bits in the quantized image.

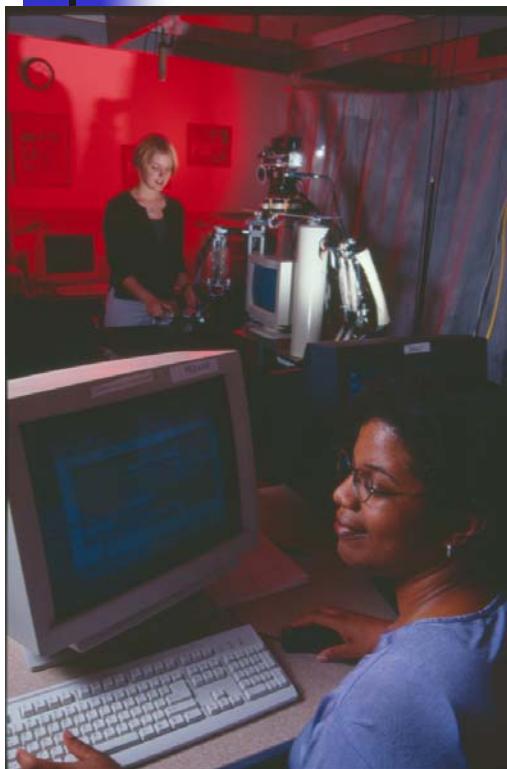


# Dithering:

use noise to reduce quant. error



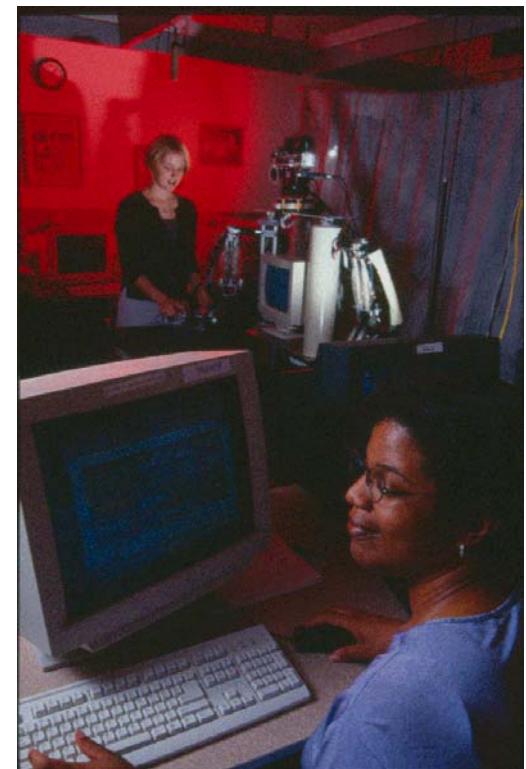
# Dithering: use noise to reduce quant. error



8 bits

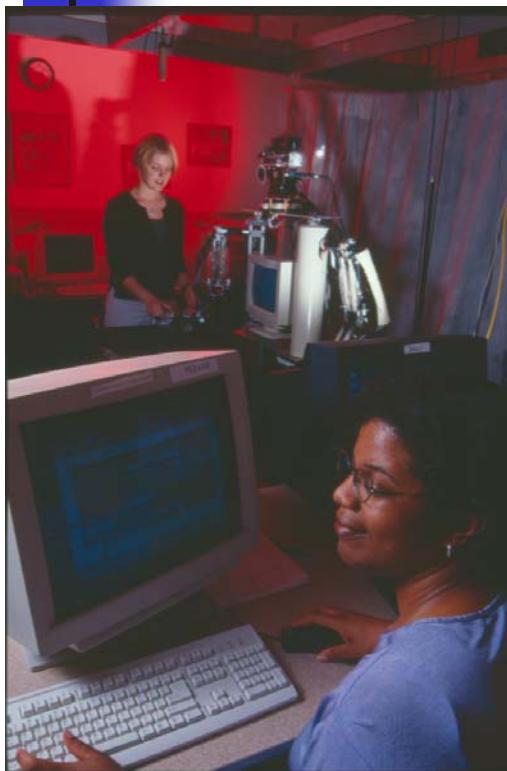


3 bits



3 bits + noise

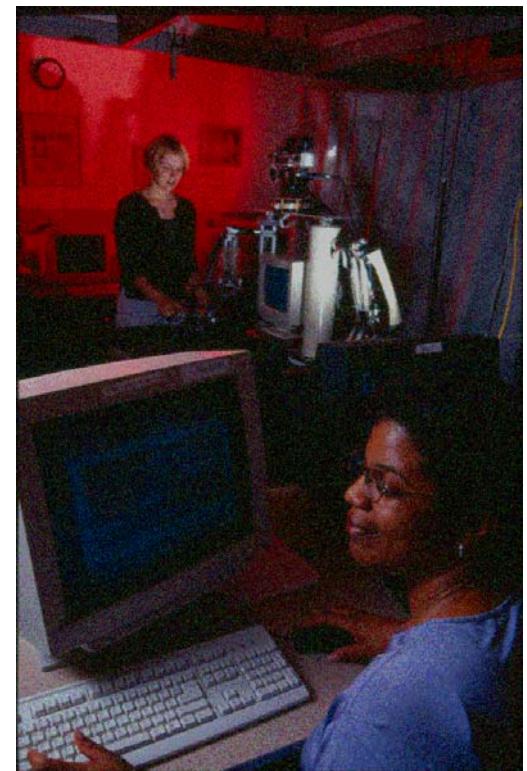
# Dithering: use noise to reduce quant. error



8 bits

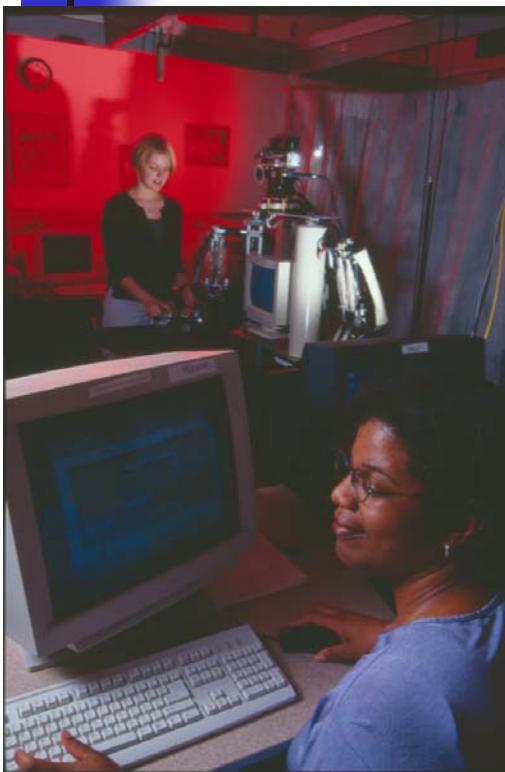


2 bits

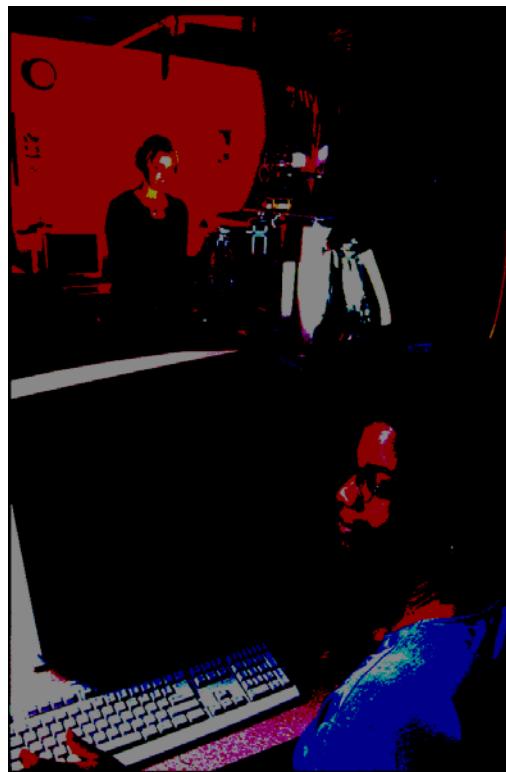


2 bits + noise

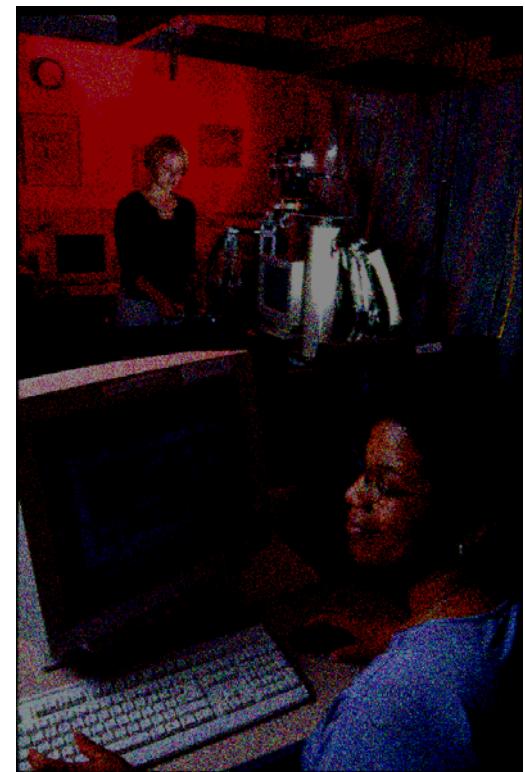
# Dithering: use noise to reduce quant. error



8 bits



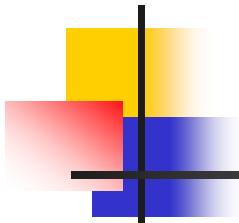
1 bit



1 bit + noise

# Dithering: Matlab demo

## -- Grayscale image



```
clear all; close all;  
iptsetpref('ImshowBorder','tight');
```

```
I = imread('cameraman.tif');  
figure, imshow(I);
```

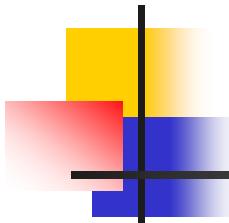
```
BW1 = im2bw(I,0.5);  
figure, imshow(BW1);
```

```
BW2 = dither(I);  
figure, imshow(BW2);
```



# Dithering: Matlab demo

## -- Color image



```
rgb = imread('onion.png');
height = size(rgb,1); width = size(rgb,2);
figure, imshow(rgb);

map = colormap(colorcube(64));
BWrgb = rgb2ind(rgb, map, 'nodither');
figure, imshow(BWrgb, map);

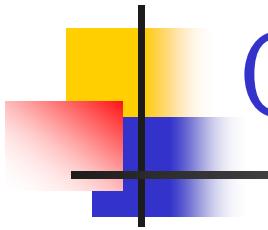
noise = 30.0 * randn(height, width, 3);
rgbnoise = uint8(double(rgb) + noise);
BWrgbnoise = rgb2ind(rgbnoise, map, 'nodither');
figure, imshow(BWrgbnoise, map);
% The following two lines are equivalent
% DITrgb = rgb2ind(rgb, map, 'dither');
DITrgb = dither(rgb, map);
figure, imshow(DITrgb, map);

[X_no_dither, map] = rgb2ind(rgb, 64, 'nodither');
figure, imshow(X_no_dither, map);

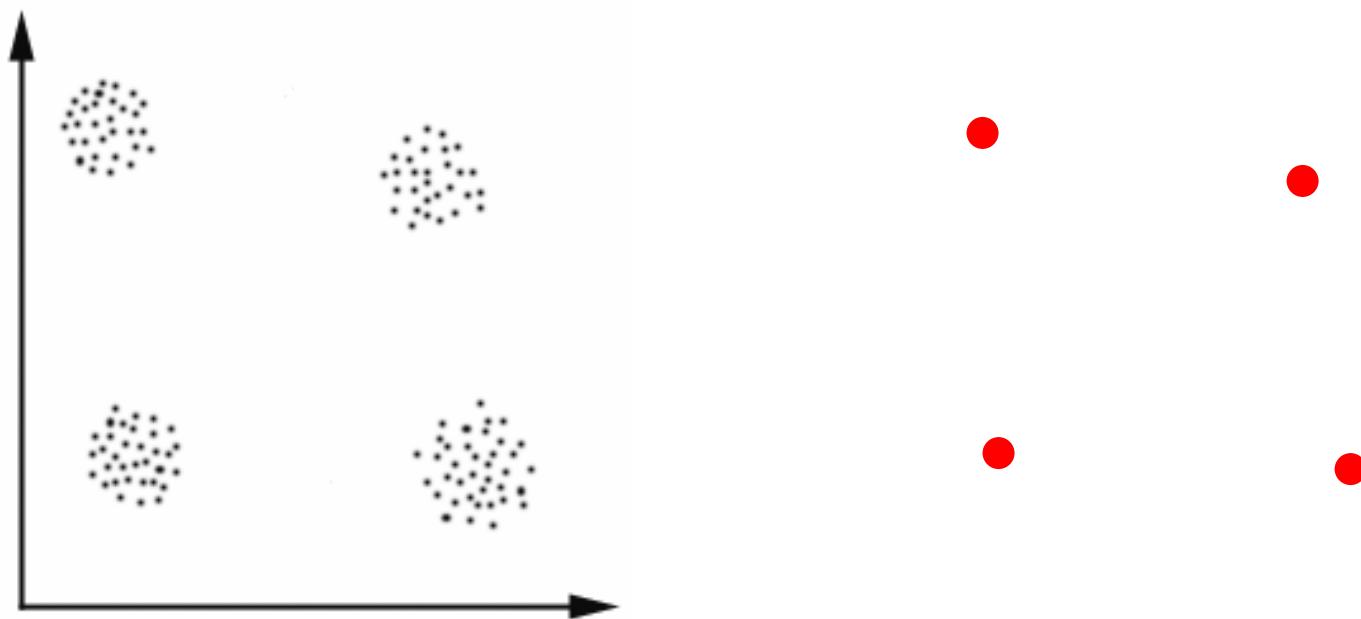
[X_dither, map] = rgb2ind(rgb, 64, 'dither');
figure, imshow(X_dither, map);
```



How to choose optimal index colors ?



# Clustering Principle



8-bit-per-band, 3-band,  
"original" image

# Application of Quantization: Steganography(信息隱藏)



Pieter Bruegel (the Elder, ca. 1525-69), *The Peasant Dance*, 1568, Oil on oak panel, 114x164 cm, Kunsthistorisches Museum Wien, Vienna

If an image is quantized, say from 8 bits to 6 bits and redisplayed it can be all but impossible to tell the difference between the two.

# Application of Quantization:

## Steganography

6-bit-per-band, 3-band,  
quantized image

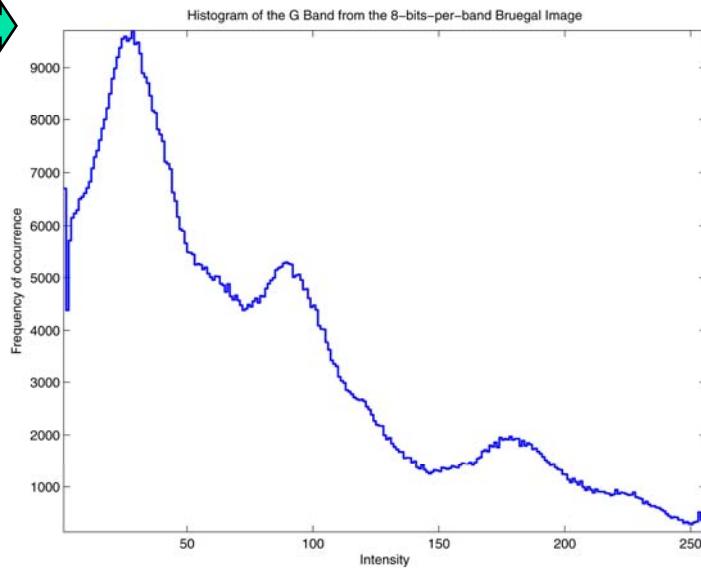


Pieter Bruegel (the Elder, ca. 1525-69), *The Peasant Dance*, 1568, Oil on oak panel, 114x164 cm, Kunsthistorisches Museum Wien, Vienna

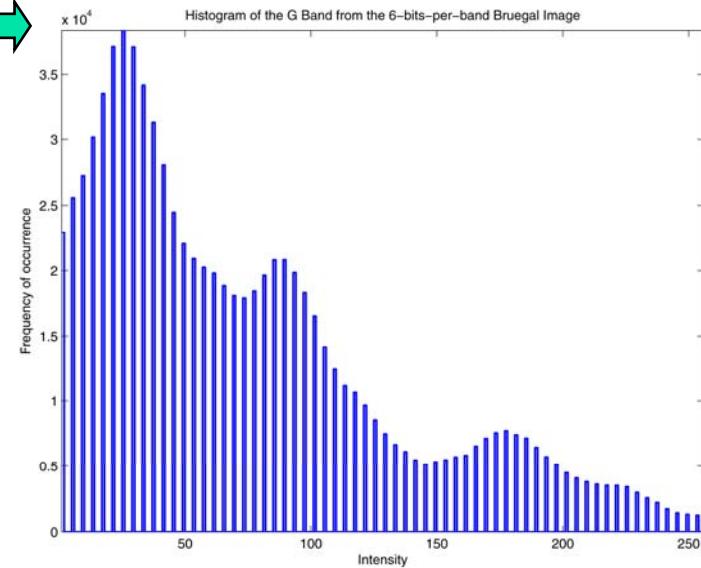
If an image is quantized, say from 8 bits to 6 bits and redisplayed it can be all but impossible to tell the difference between the two.

# Application of Quantization: Steganography

green-band histogram of 8-bit image



green-band histogram of 6-bit image



The histograms of the two versions indicate which is which. If the 6-bit version is displayed as an 8-bit image, it has only pixels with values  $0, 4, 8, \dots, 252$ .

$0, 4, 8, \dots, 252$



# Application of Quantization: Steganography

If the 6-bit version is displayed as an 8-bit image then the 8-bit pixels all have zeros in the lower 2 bits:

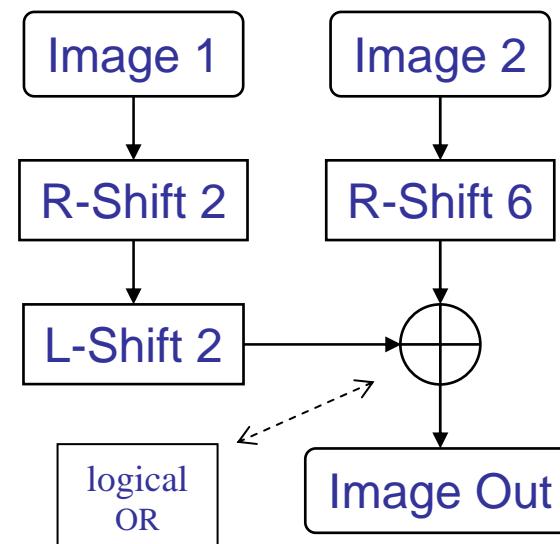
b	b	b	b	b	b	0	0
---	---	---	---	---	---	---	---

$b = 0 \text{ or } 1$

always 0

This introduces the possibility of encoding other information in the low-order bits.

That other information could be a message, perhaps encrypted, or even another image.



X-Shift  $n$  = logical left or right shift by  $n$  bits.

# Application of Quantization: Steganography

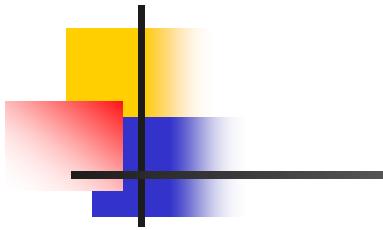


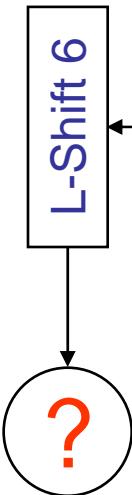
Image 1 in upper 6-bits.  
Image 2 in lower 2-bits.

Pieter Bruegel (the Elder, ca. 1525-69), *The Peasant Dance*, 1568, Oil on oak panel, 114x164 cm, Kunsthistorisches Museum Wien, Vienna

The second image is invisible because the value of each pixel is between 0 and 3. For any given pixel, its value is added to the collocated pixel in the first image that has a value from the set  $\{0, 4, 8, \dots, 252\}$ . The 2<sup>nd</sup> image is noise on the 1<sup>st</sup>.

# Application of Quantization: Steganography

Image 1 in upper 6-bits.  
Image 2 in lower 2-bits.

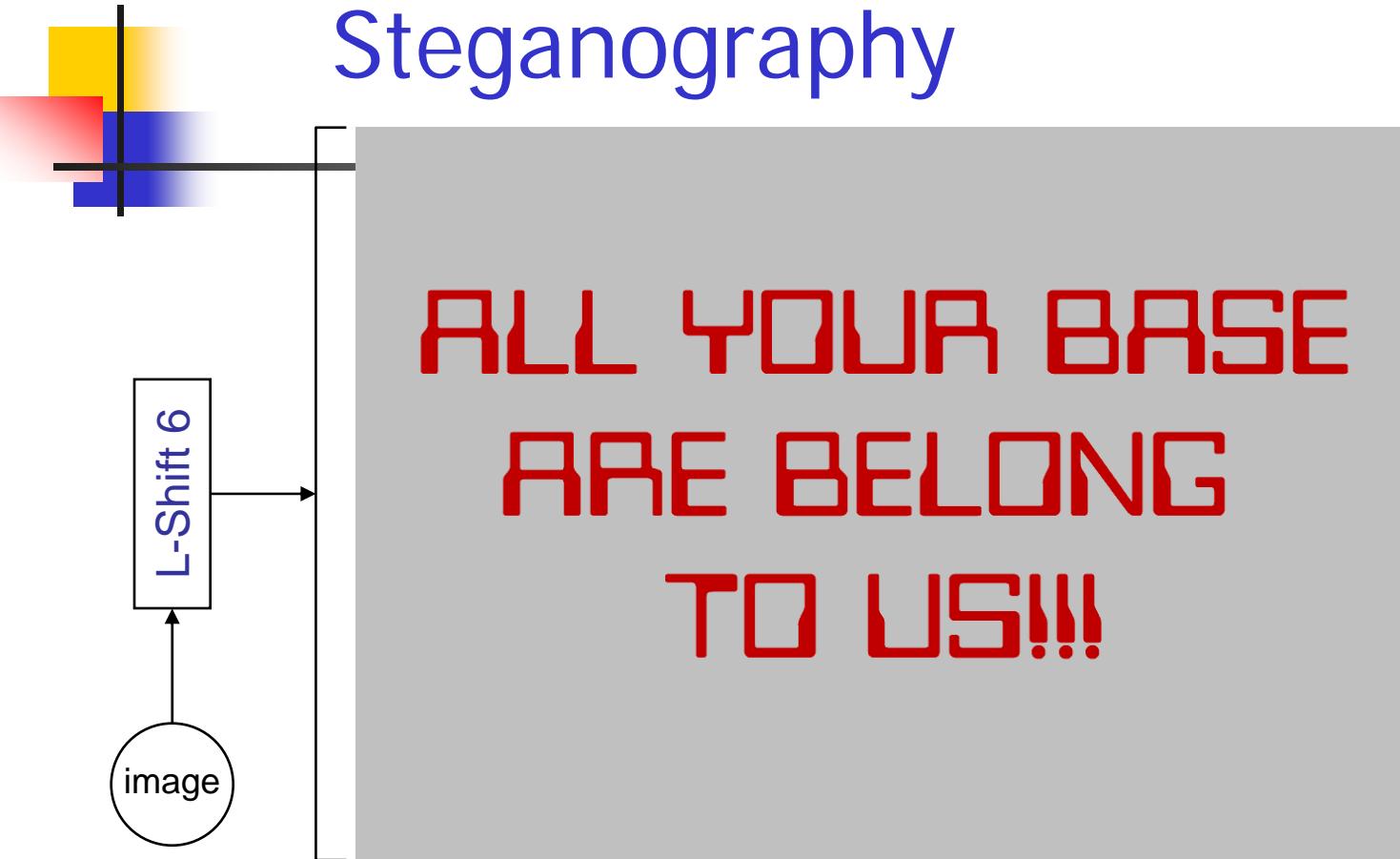


Pieter Bruegel (the Elder, ca. 1525-69), *The Peasant Dance*, 1568, Oil on oak panel, 114x164 cm, Kunsthistorisches Museum Wien, Vienna

To recover the second image (which is 2 bits per pixel per band) simply left shift the combined image by 6 bits.

# Application of Quantization: Steganography

Image 2 in upper 2-bits.  
Image 1 shifted out



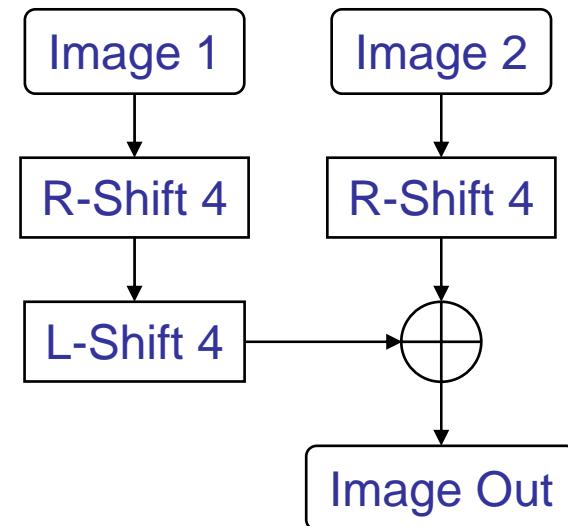
From the video game, *Zero Wing*, by Toaplan.  
See [http://en.wikipedia.org/wiki/All\\_your\\_base](http://en.wikipedia.org/wiki/All_your_base)

To recover the second image (which is 2 bits per pixel per band) simply left shift the combined image by 6 bits.

# Application of Quantization: Steganography

This is so effective that two 4-bit-per-pixel images can be superimposed with only the image in the high-order bits visible. Both images contain the same amount of information but because one takes on values between 0 and 15, the other takes on values from  $\{16, 32, 48, \dots, 240\}$ , and the smaller values are added to the larger, the image in the low-order bits is effectively invisible

Images 1 and 2 each have 4-bits per pixel when combined.



# Application of Quantization: Steganography

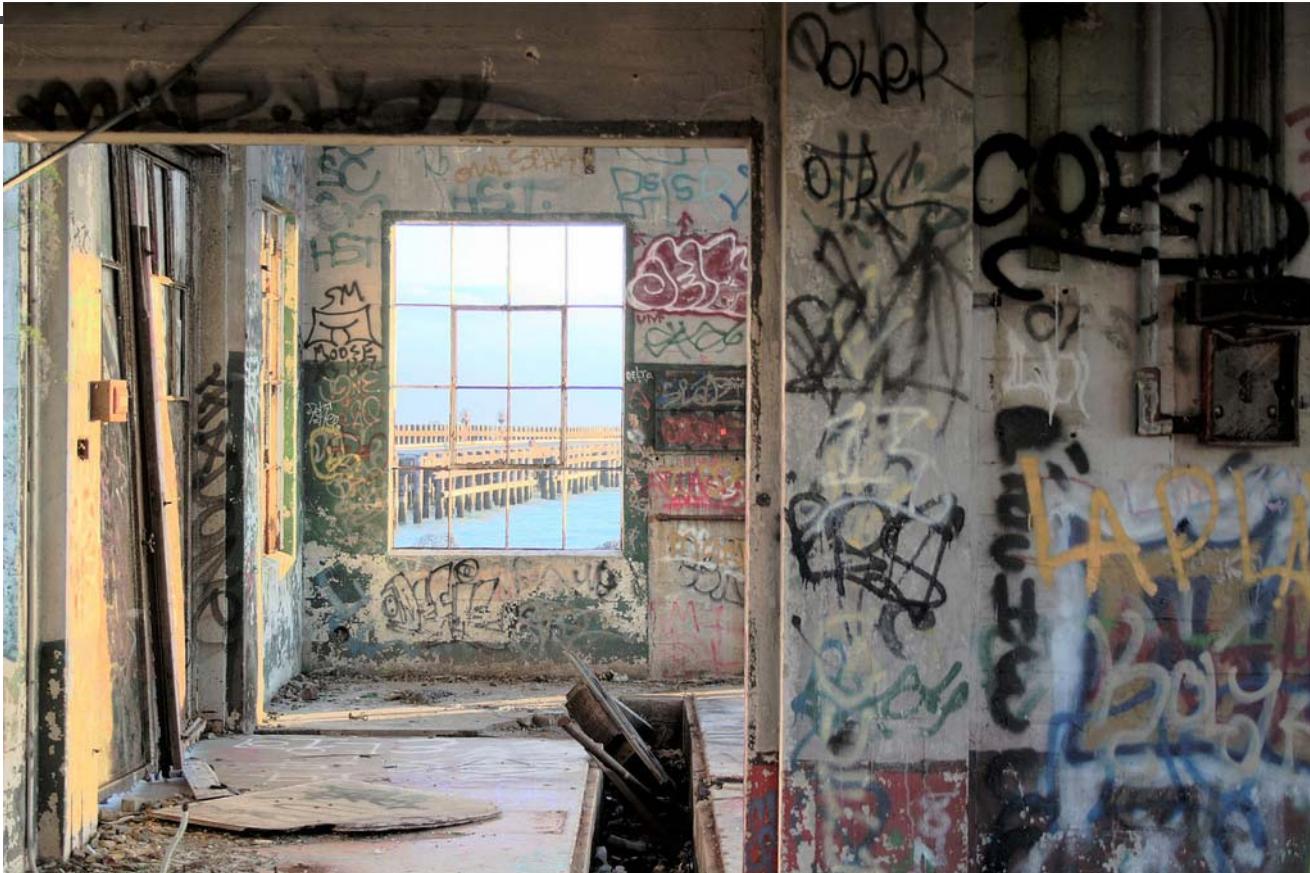


Photo: CypherOne  
<http://www.flickr.com/people/cypherone/>

Image quantized to  
4-bits per pixel.

# Application of Quantization: Steganography

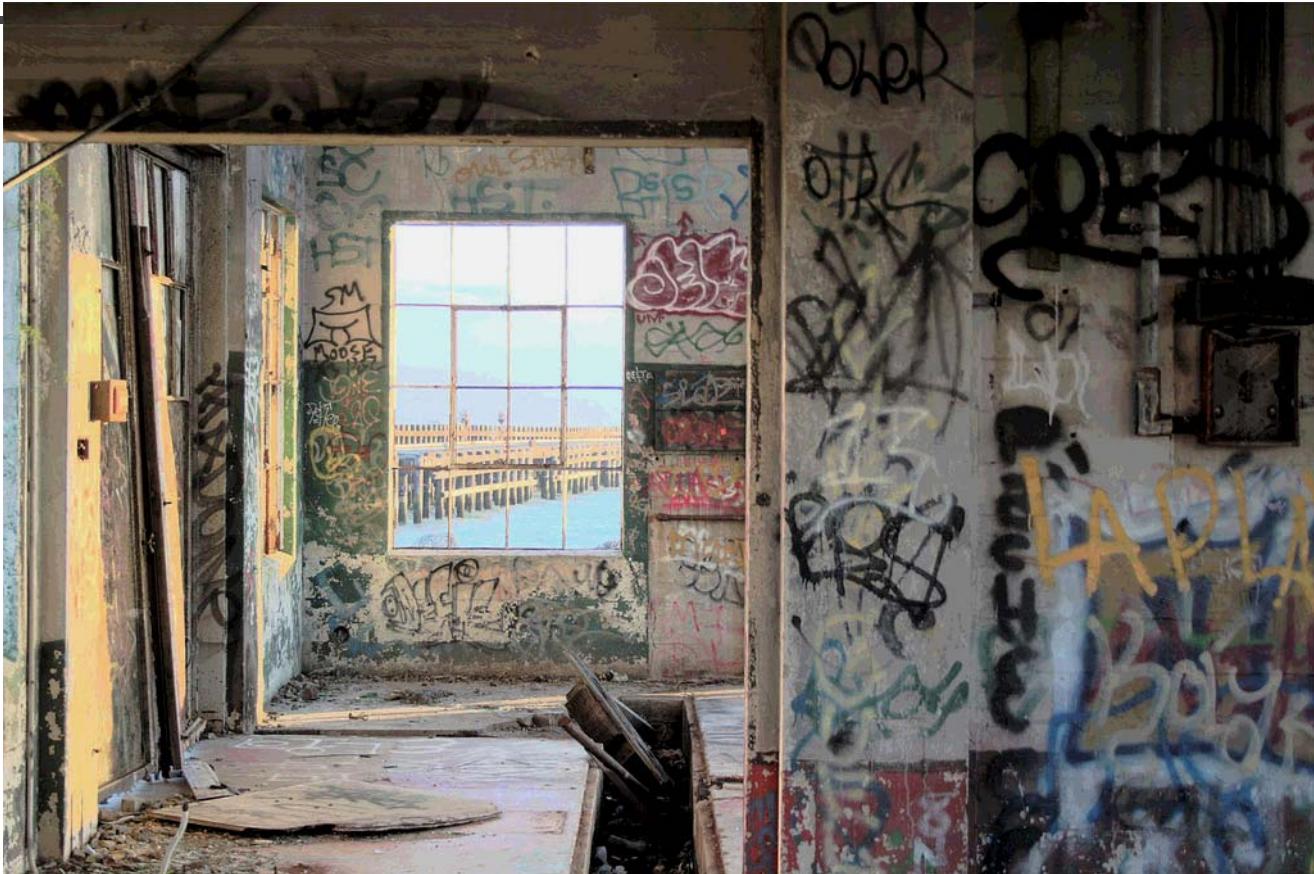


Photo: CypherOne  
<http://www.flickr.com/people/cypherone/>

# Application of Quantization: Steganography

Image 1 in upper 4-bits.  
Image 2 in lower 4-bits.

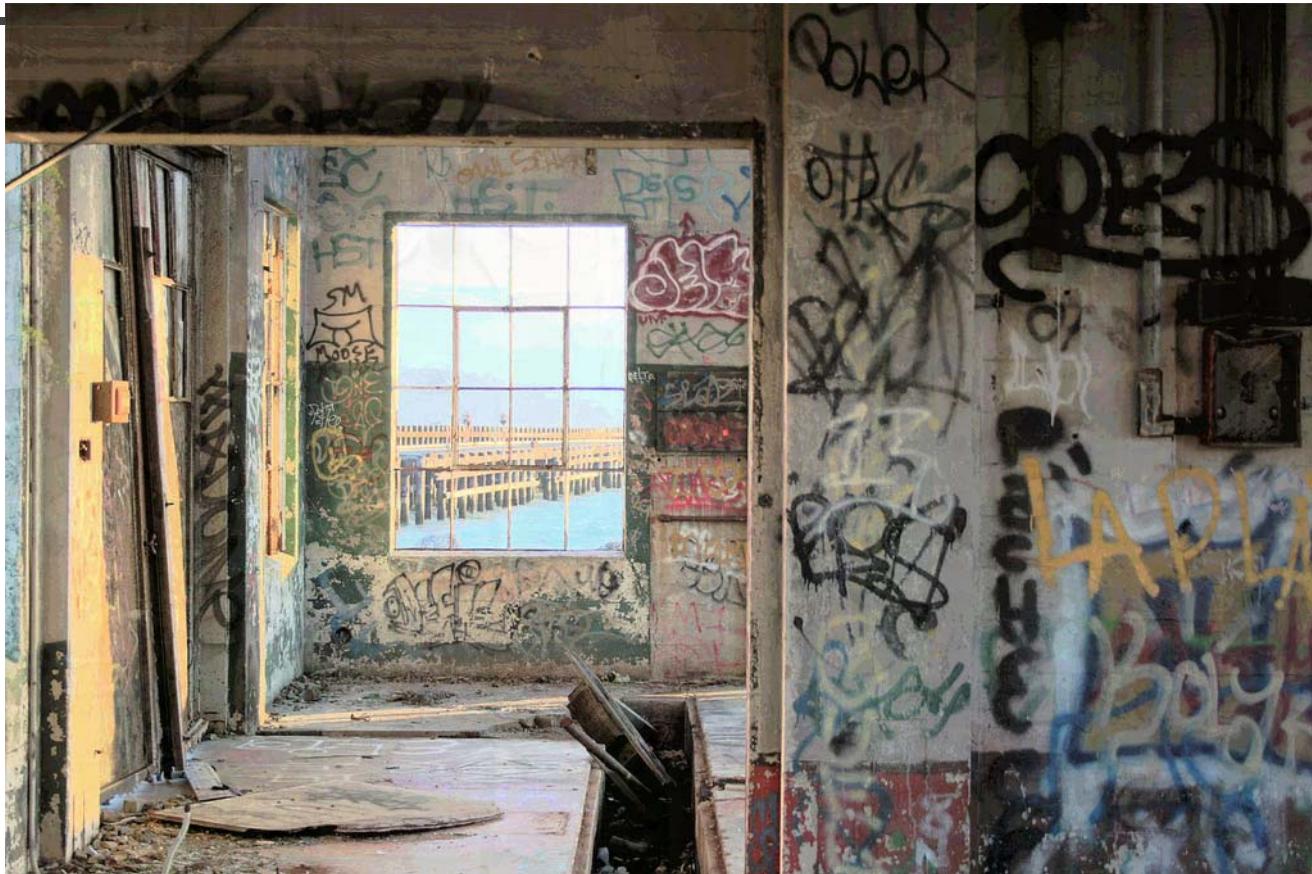


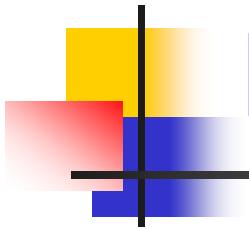
Photo: CypherOne  
<http://www.flickr.com/people/cypherone/>

# Application of Quantization: Steganography

Image 2 in upper 4-bits.  
Image 1 shifted out.

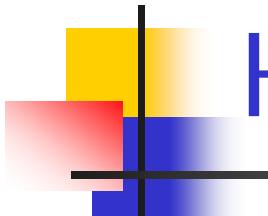


Photographer Unknown



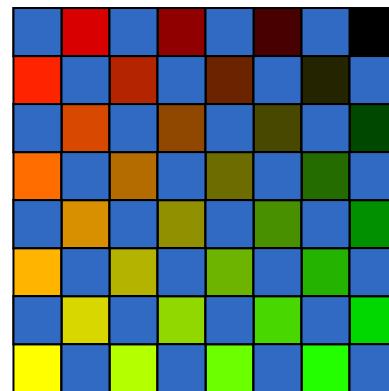
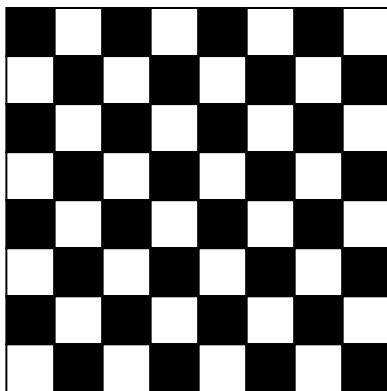
# Hidden image creation



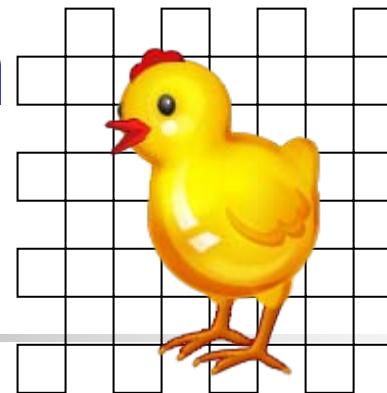
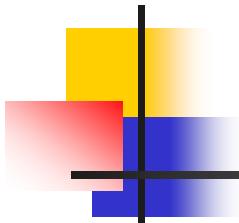


# Hidden image creation

- What happens when you press CTRL+a?
  - Assume the image as a chessboard with each pixel act as one squares, black(even-pixel) or white(odd-pixel).
  - All even pixels corresponding to black squares are masked with the color **(49,106,197)**.



# Hidden image creation



- Basic idea
  - Put **background** image into **odd** pixels
  - Put **foreground** image into **even** pixels
  - **Foreground** image should be strong enough to mask **background** image
  - **Background** image should be strong enough to show up when **foreground** image is masked
    - *What kinds of image to choose?*
    - *Brightness adjustment*
    - *Contrast adjustment*
    - *Saturation adjustment*
    - .....

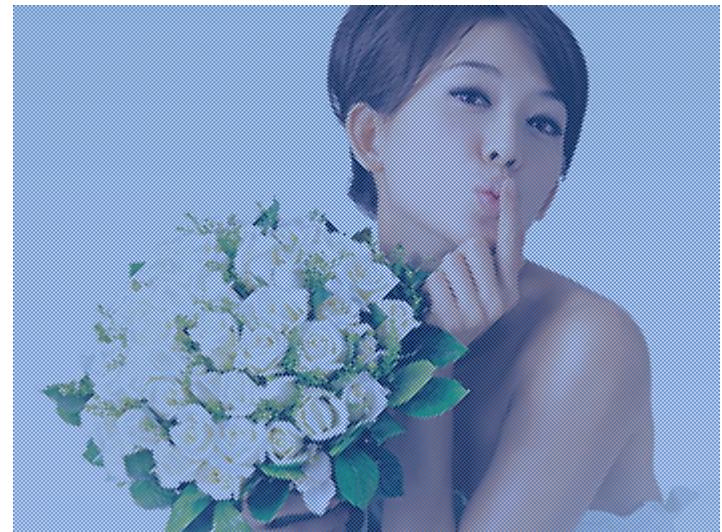


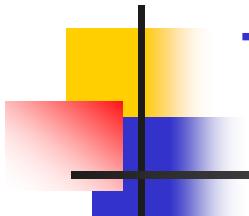
# Hidden image creation

- An example



# Challenge – From grayscale to color





# Texture transfer

- We want to add color to the right grayscale image to make it have the style of the left color image



# Texture transfer

- Work in **Lab** space instead of **RGB** space.
- Use local brightness to search for best match.
- Copy the color components from the source image to the target image.



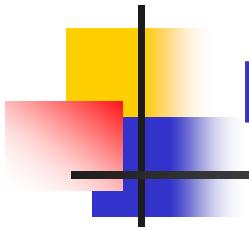
# 三维立体画——Stereogram



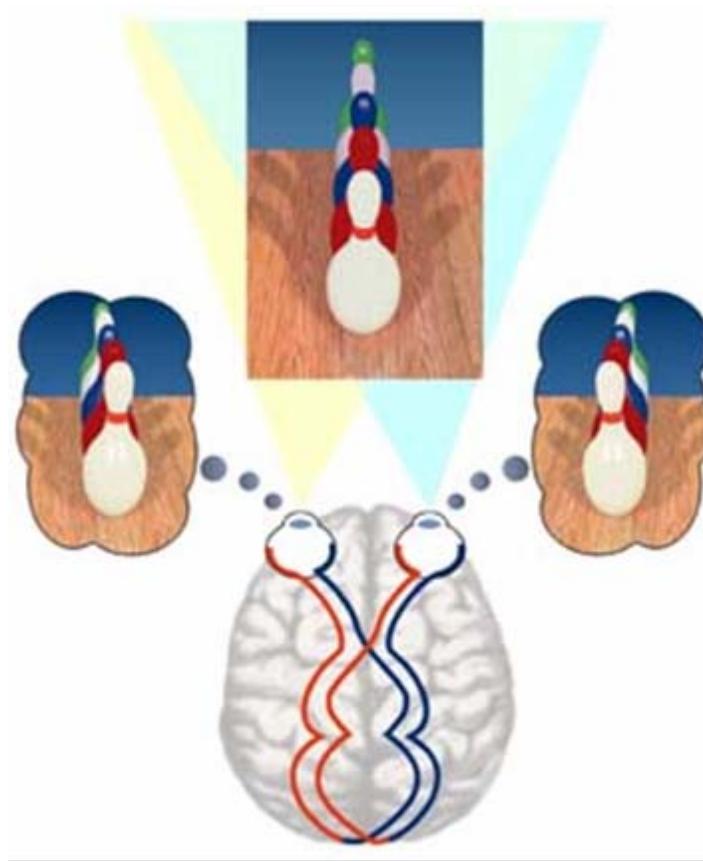
<http://www.magiceye.com/>

# 三维立体画——Stereogram

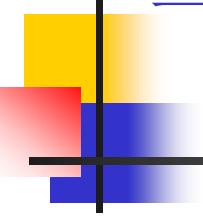
- 三维立体图的英文名称为Stereogram，根据图种类的不同还有其他的名称，
  - RDS (Random Dot Stereogram)
  - AutoStereogram /SIRDS (Single Image Random Dot Stereogram)、
  - SIRTS (Single Image Random TEXT Stereogram, 或asciistereograms)、
  - Hollarion、
  - SIS (Single Image Stereograms) 等。
- 三维立体图是一种不需要任何设备、仪器就可以从中看到虚拟的三维立体图象的二维图片。



<http://www.vision3D.com/stereo.html>

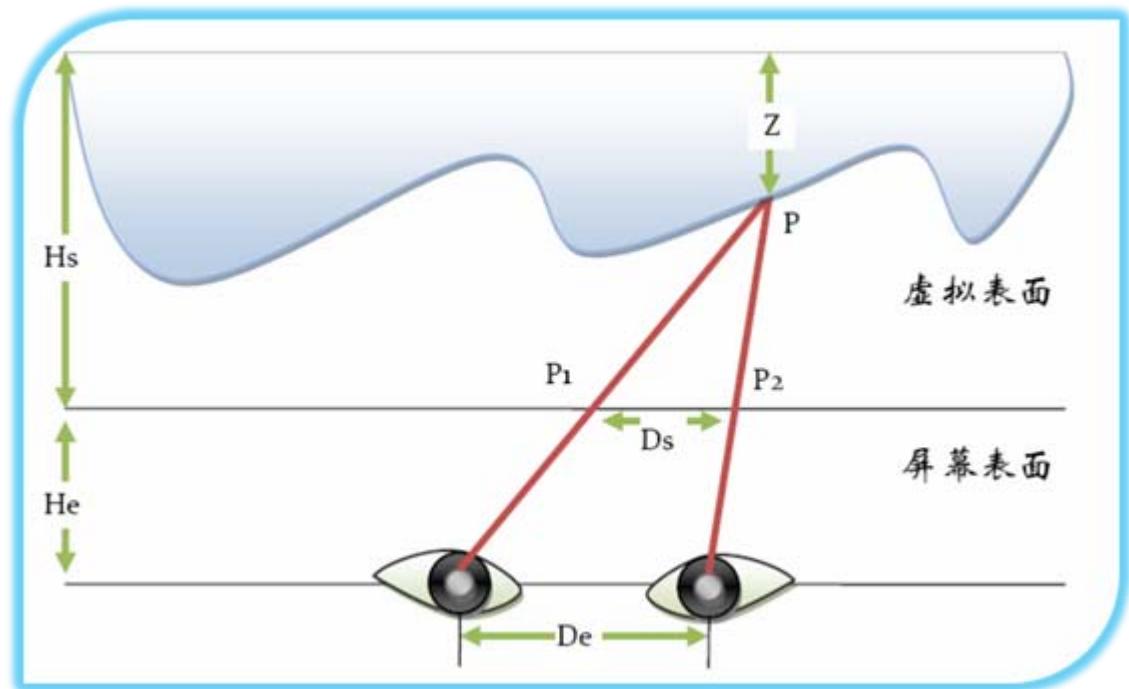


# 三维立体画——Stereogram

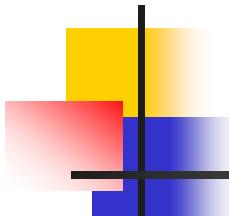


$$\frac{D_s}{D_e} = \frac{H_s - Z}{H_s + H_e - Z}$$

$$D_s = \frac{H_s - Z}{H_s + H_e - Z} \times D_e$$



Given fixed  $H_s$ ,  $H_e$  and  $D_e$ ,  $D_s$  is only dependent on  $Z$



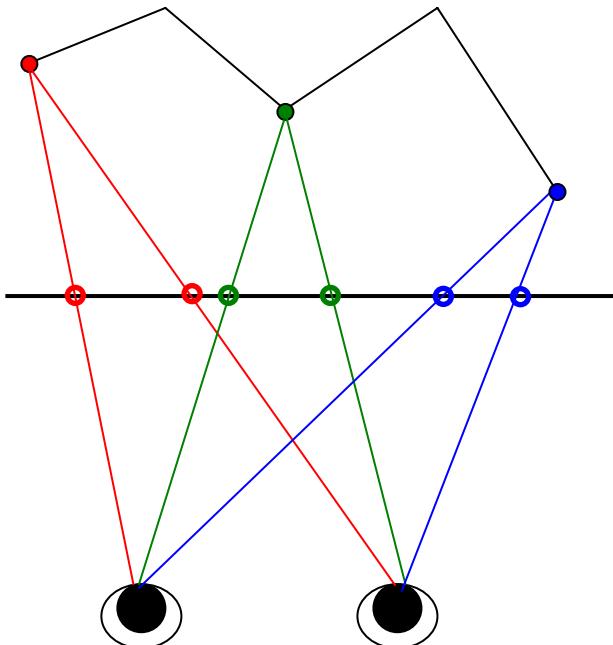
# 制作立体画原理

## ■ 表达层次感

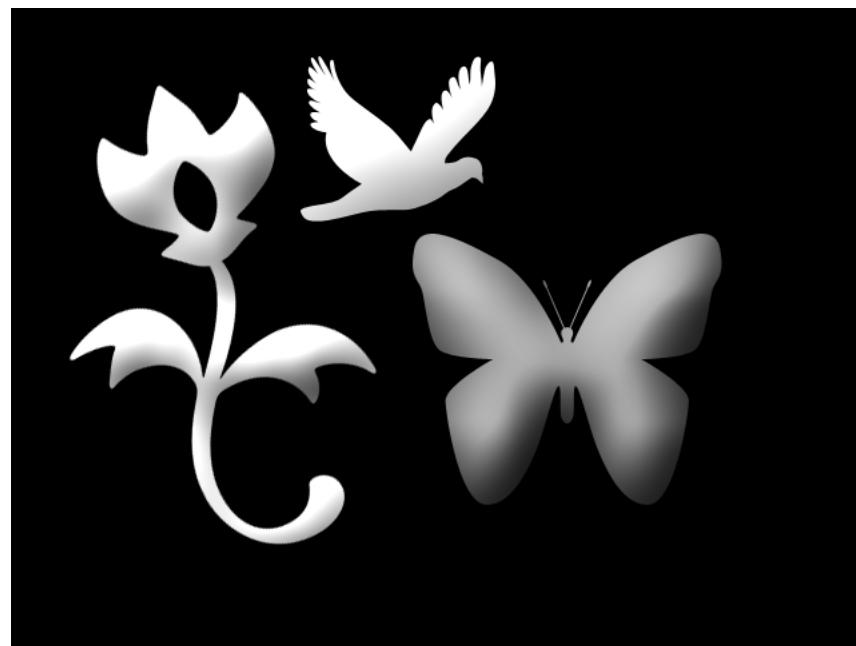
- 在该程序中为了表达物体的空间层次感，我利用图像的灰度值的大小来表达相同点之间的差距，因此灰度值不同的点产生的 $\Delta X$ 就不相同，这样根据视差得到的空间距离就不同，这样就能够使物体有比较好的层次感。

# 三维立体画——Stereogram

## ■ 视差



# 三维立体画——Stereogram





```
BYTE *bytePixels = new BYTE[pH * pWB]; //暂存数组
bmp->GetBitmapBits(pH*pWB, bytePixels);
srand(time(0));
for(i = 0; i < pH * pWB; i += 3)
{
    bytePixels[i] = rand() % 255;
    bytePixels[i + 1] = rand() % 255;
    bytePixels[i + 2] = rand() % 255;
}
//将像素颜色数组设置到位图资源中
SetBitmapBits(m_hBmpShow, rcHeight * rcWidth * 3, bytePixels);
```

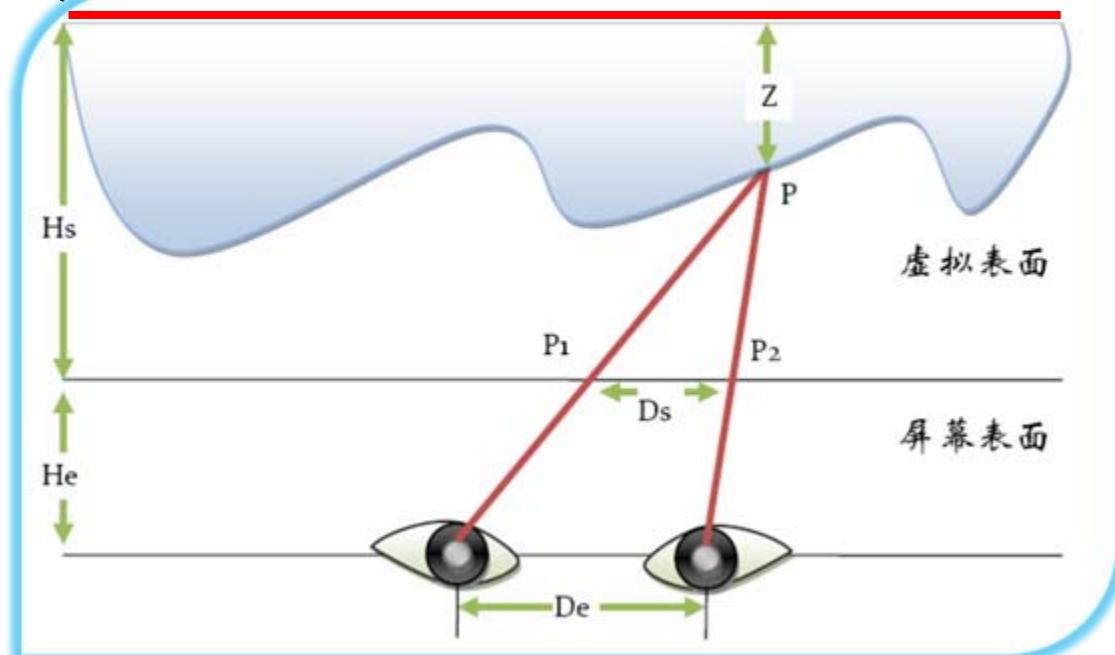
```
color = m_cDepthBmp.GetPixel(i*nBgBmpWidth+x, y);
grey = int(float(GetRValue(color))*0.59+
           float(GetGValue(color))*0.3+
           float(GetBValue(color))*0.11+0.5f);
grey = (LONG)(grey / Depth3D);
if (x+grey>=nBgBmpWidth)
{
    newcolor = cBGBmp.GetPixel(x + grey - nBgBmpWidth, y);
    cBGBmp.SetPixel(x, y, newcolor);
}
else
{
    newcolor = cBGBmp.GetPixel(x + grey, y);
    cBGBmp.SetPixel(x, y, newcolor);
}
```

# 三维立体画——Stereogram

- The property of the background

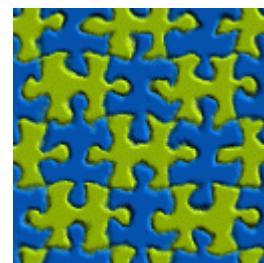
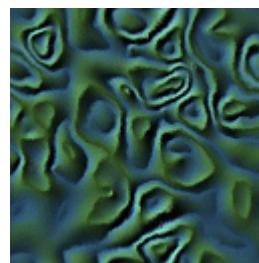
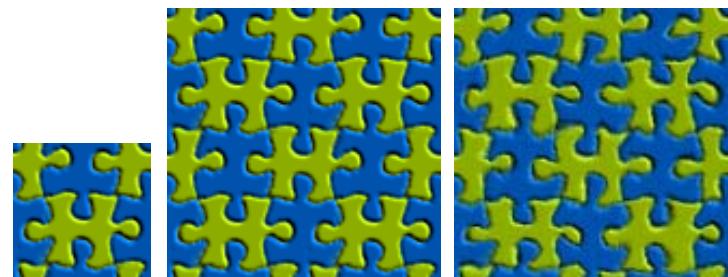
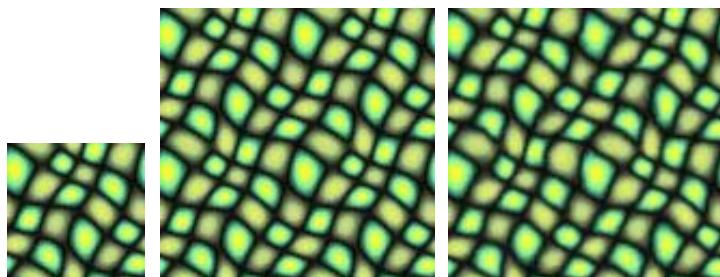
- Periodic(周期性)
- Random(随机性)
- Tileable(可拼接性)

$$\frac{Ds}{De} = \frac{Hs}{Hs + He}$$



# Textures

## 2D texture synthesis



# Image Inpainting

## Photo repair



# Image Inpainting Example

scene edit



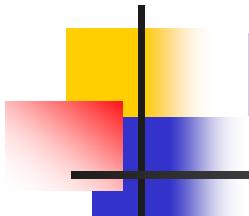
# Image Inpainting

## Original scene recovery



Since 1699, when French explorers landed at the great bend of the Mississippi River and celebrated the first Mardi Gras in North America, New Orleans has brewed a fascinating mélange of cultures. It was French, then Spanish, then French again, then sold to the United States. Through all these years, and even into the 1900s, others arrived from everywhere: Acadians (Cajuns), Africans, indige-





# Homework

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- Perform an image editing task. The work can be , but not limited to the following topics:
  - Dithering
  - Segmentation
  - Steganography / Hidden image
  - Texture transfer
  - Stereogram
  - inpainting
  - Others...