

More Image Manipulation

Prof. Graeme Bailey

<http://cs1114.cs.cornell.edu>

(notes modified from Noah Snavely, Spring 2009)



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Computer Science

Last time: image transformations



2D Linear Transformations

- Can be represented with a 2D matrix

$$T = \begin{bmatrix} a & b \\ c & d \end{bmatrix}$$

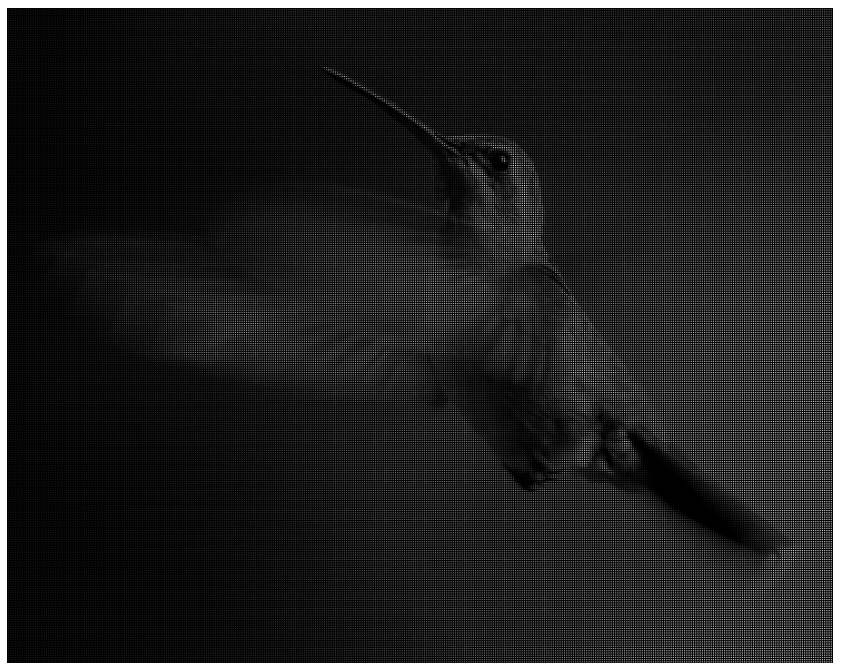
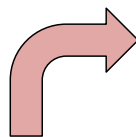
- And applied to a point using matrix multiplication

$$\begin{bmatrix} a & b \\ c & d \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} ax + by \\ cx + dy \end{bmatrix}$$



Forward mapping

- Lots of problems came up trying to enlarge a image...



How do we fix this?

- Answer: do the opposite!
 1. Create an output image
 2. For each pixel in the output image, find the corresponding pixel in the input image*
 3. Give that output pixel the same color
- *Requires that we invert the mapping



Inverse mapping

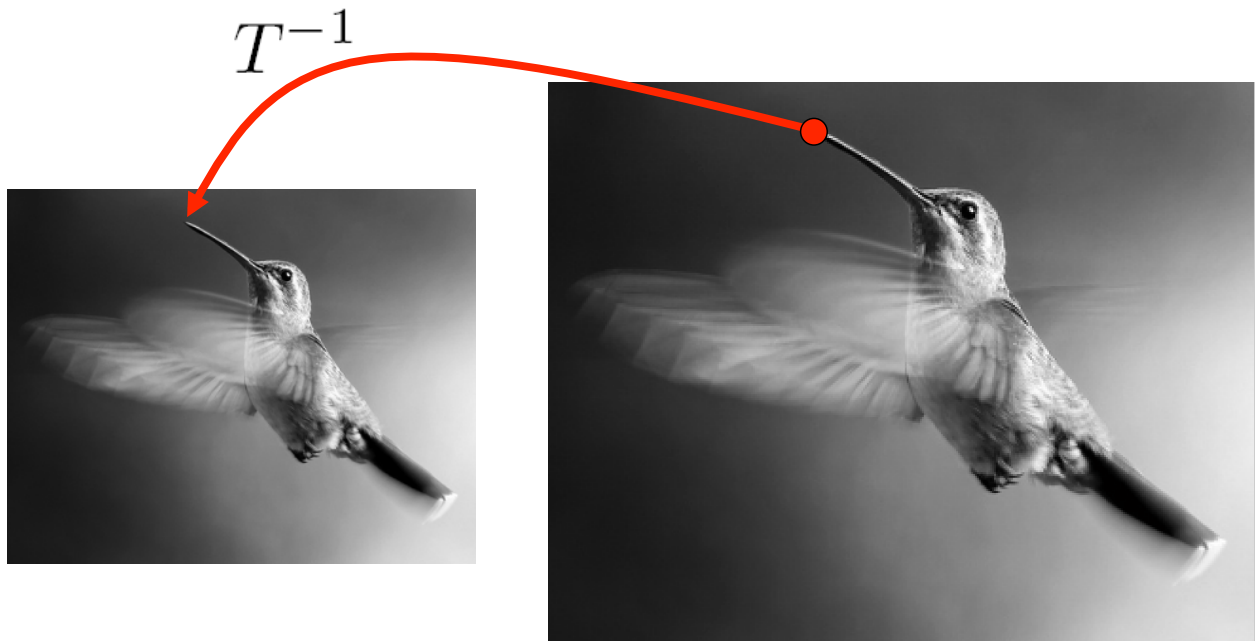
- How do we invert the mapping?
- With linear transformations T , we invert T

$$T = \begin{bmatrix} a & b \\ c & d \end{bmatrix} \quad T^{-1}T = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$$

$$T^{-1} = \frac{1}{ad - bc} \begin{bmatrix} d & -b \\ -c & a \end{bmatrix}$$



Inverse mapping



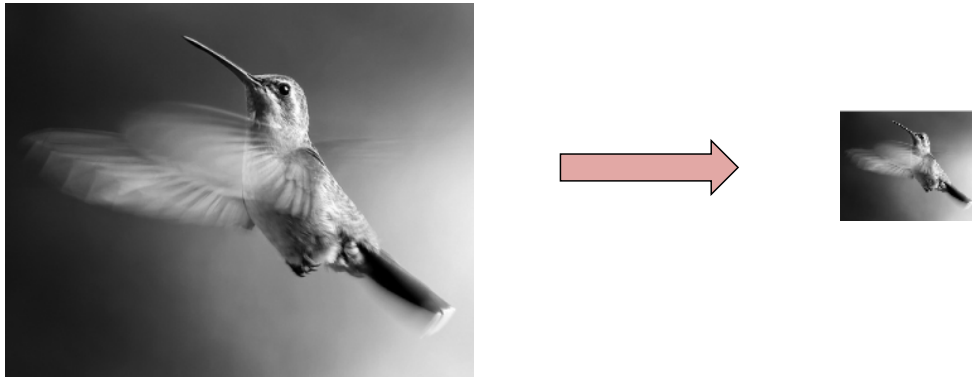
Resampling

- Suppose we scale image by 2
- $T = \begin{bmatrix} 2 & 0 \\ 0 & 2 \end{bmatrix}$
- $\text{inv}(T) = ?$
- Pixel (5,5) in `img_out` should be colored with pixel (2.5, 2.5) in `img_in`
- How do we find the intensity at (2.5, 2.5)?

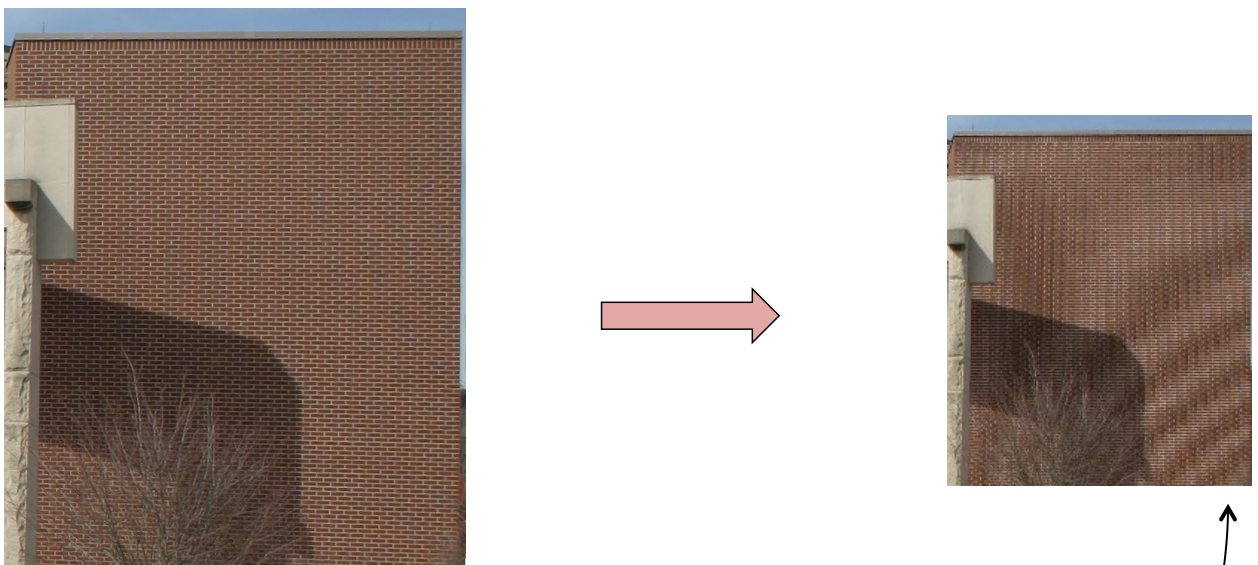


Downsampling

- Suppose we scale image by 0.25 – a different problem with some surprising issues ...



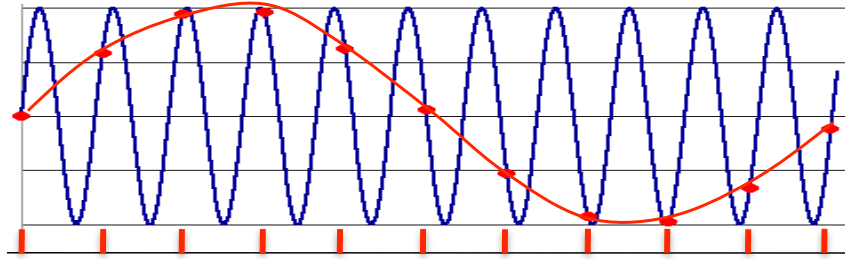
Downsampling



Which pixels were picked from the larger image to choose colour values?



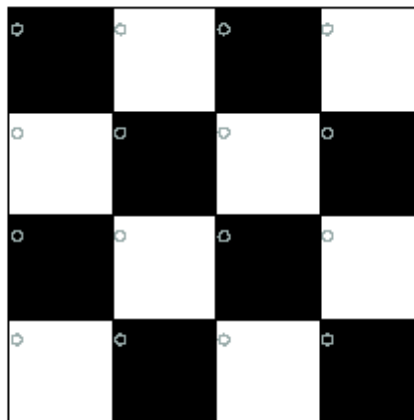
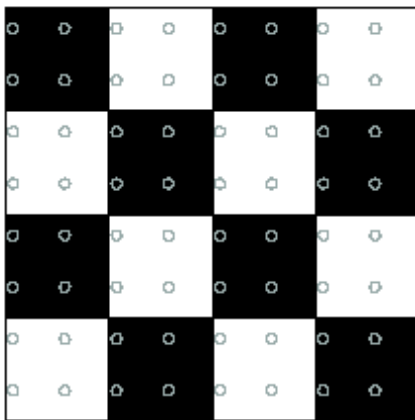
What's going on?



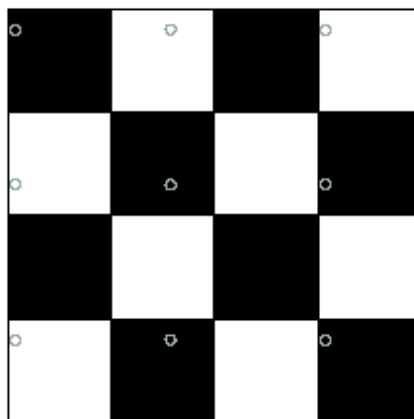
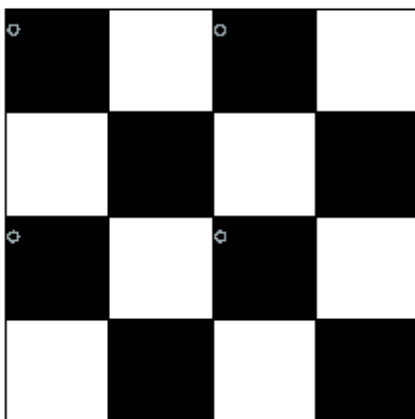
- **Aliasing** can arise when you sample a continuous signal or image
- Occurs when the sampling rate is not high enough to capture the detail in the image
- Can give you the wrong signal/image—an alias



2D example



Good sampling



Bad sampling



Examples of aliasing

- Wagon wheel effect



- Moiré patterns

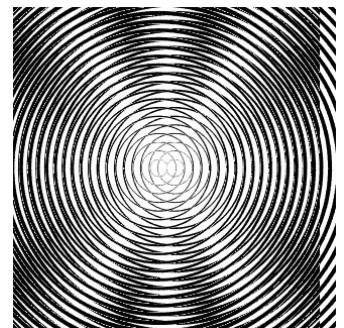
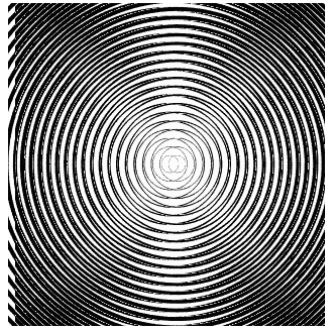
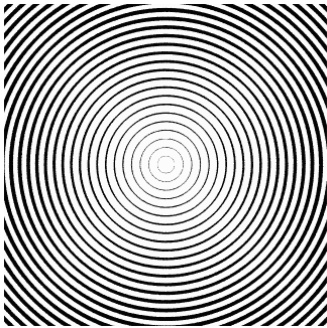
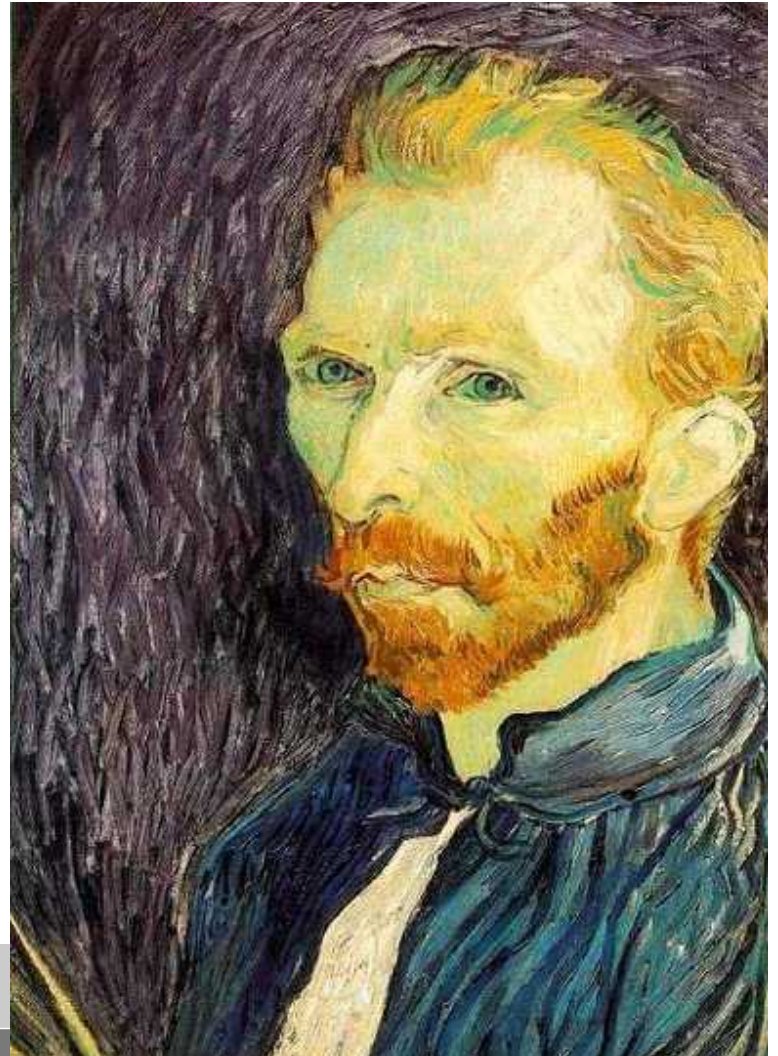


Image credit: Steve Seitz



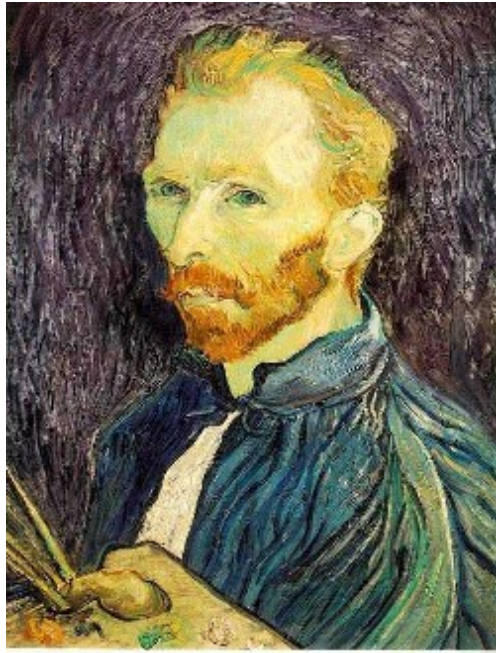
- This image is too big to fit on the screen. How can we create a half-sized version?



Slide credits: Steve Seitz



Image sub-sampling



1/4



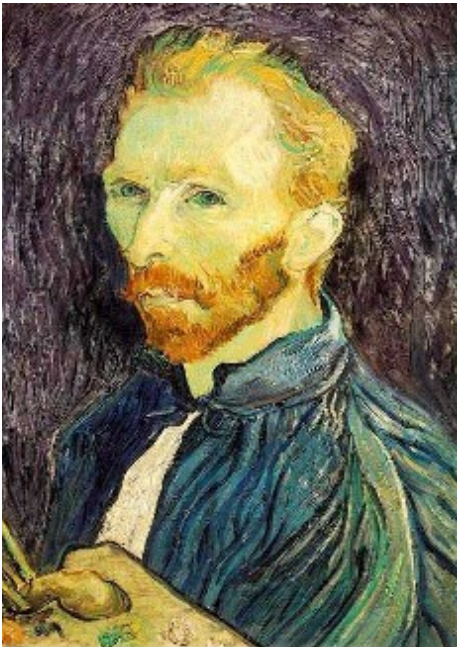
1/8

Current approach: throw away every other row and column (subsample)



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Image sub-sampling



• 1/2



• 1/4 (2x zoom)



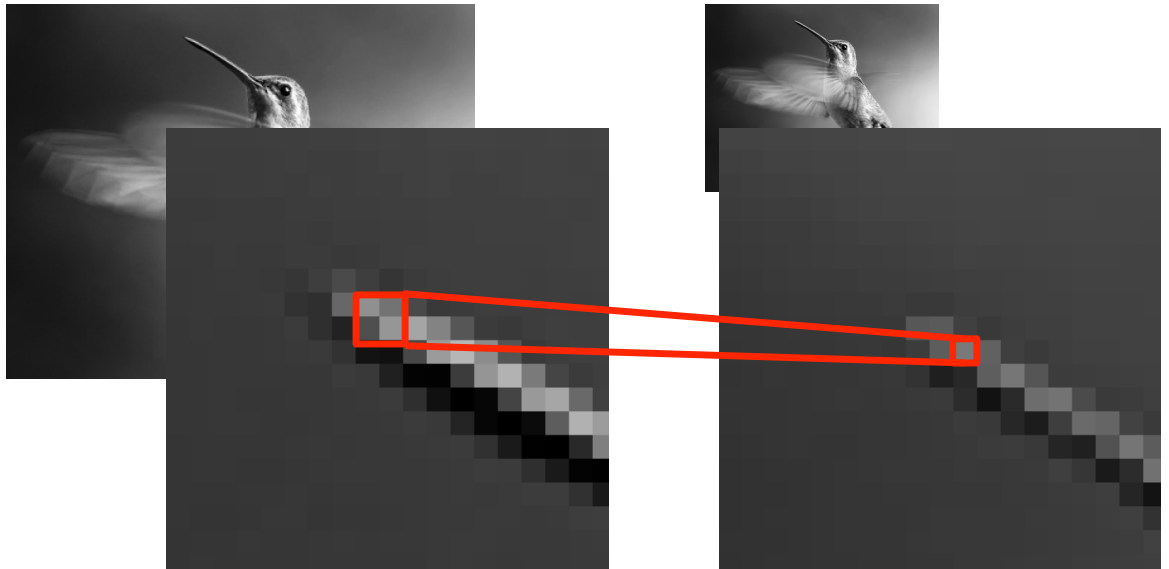
• 1/8 (4x zoom)



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Image sub-sampling

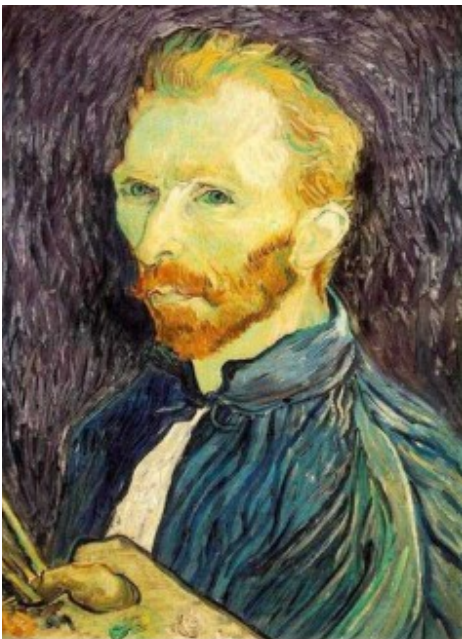
- What's really going on?



Which one to pick, or should we somehow merge all values?



Subsampling with pre-filtering



Average 2x2



Average 4x4

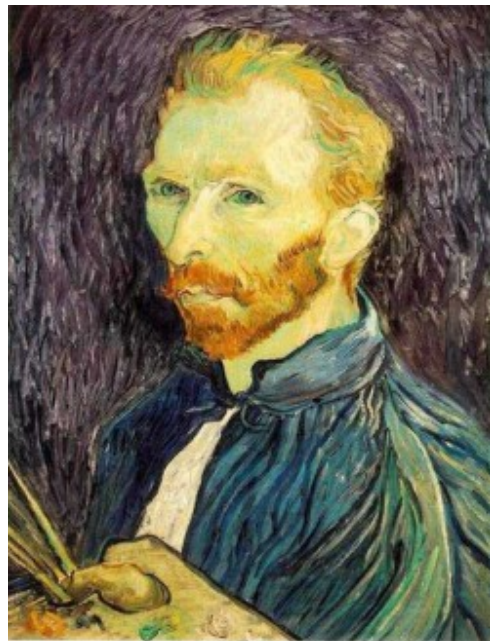


Average 8x8

- Solution: blur the image, then subsample
 - Filter size should double for each $\frac{1}{2}$ size reduction.



Subsampling with pre-filtering



Average 2x2



Average 4x4



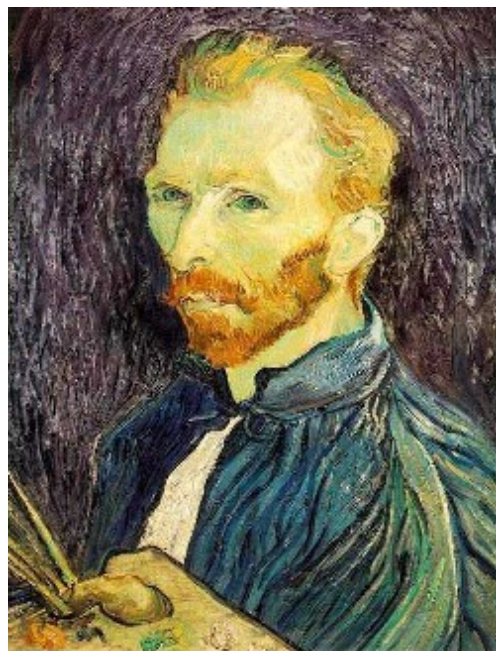
Average 8x8

- Solution: blur the image, then subsample
 - Filter size should double for each $\frac{1}{2}$ size reduction.



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Compare with



1/4



1/8



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Weighted averaging

- Filtering, aka *convolution* (a very big topic!)
- Take one image, the *kernel* (usually small) to act as a (weighted) averager, then slide it over another image (usually big)
- At each point/pixel, multiply the kernel times the image, and add up the results
- This is the new value of the image ... example:

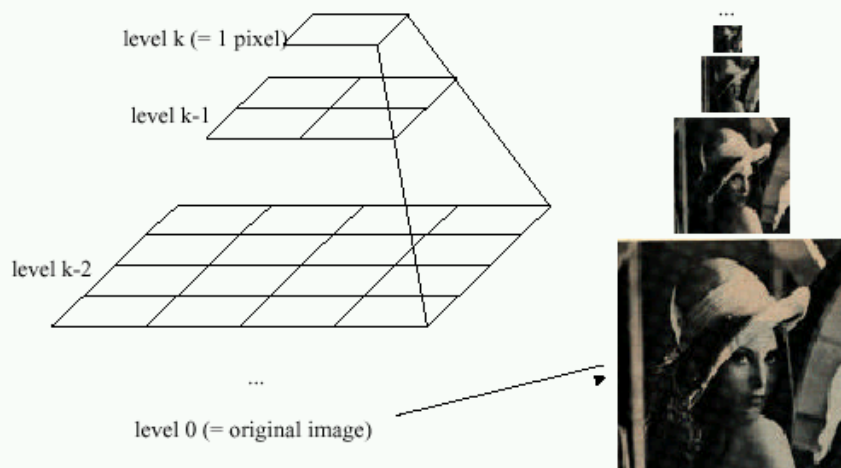


0	1/5	0
1/5	1/5	1/5
0	1/5	0



Sometimes we want many resolutions

Idea: Represent $N \times N$ image as a "pyramid" of $1 \times 1, 2 \times 2, 4 \times 4, \dots, 2^k \times 2^k$ images (assuming $N = 2^k$)

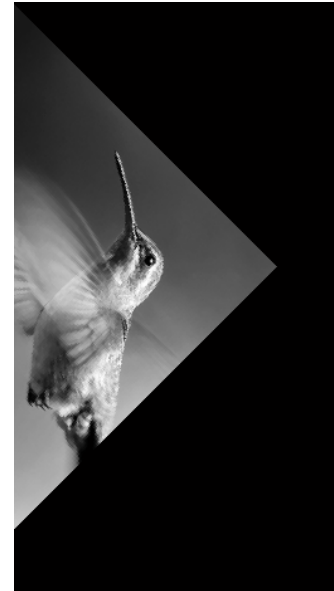


- Known as a **Gaussian Pyramid** [Burt and Adelson, 1983]
 - In computer graphics, a mip map [Williams, 1983]
 - A precursor to wavelet transform



More image transformations

- Default rotation is around the point $(0, 0)$
 - the upper-left corner of the image



- This probably isn't really what we want...



Translation

- We really want to rotate around the *center* of the image
- Nice trick: move the center of the image to the origin, apply the default rotation, then move the center back
- (Moving an image is called “translation”)
- But technically, translation isn't a linear function - check the two definition properties for $\mathbf{f}(\mathbf{v}) = \mathbf{v} + \mathbf{w}$ (for some constant vector \mathbf{w})...
 - $\mathbf{f}(\mathbf{v} + \mathbf{u}) \stackrel{?}{=} \mathbf{f}(\mathbf{v}) + \mathbf{f}(\mathbf{u})$ $LHS = \mathbf{v} + \mathbf{u} + \mathbf{w}$ $RHS = \mathbf{v} + \mathbf{u} + 2\mathbf{w}$
 - $\mathbf{f}(a\mathbf{v}) \stackrel{?}{=} a \mathbf{f}(\mathbf{v})$ $LHS = a\mathbf{v} + \mathbf{w}$ $RHS = a\mathbf{v} + 2a\mathbf{w}$
- Formally we call this an *affine* linear function

