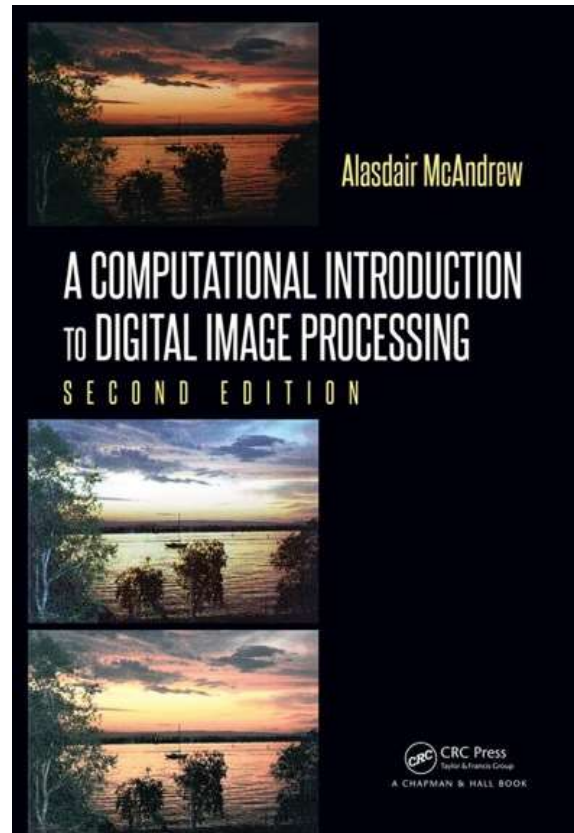


# Chapter 6

## Image Geometry

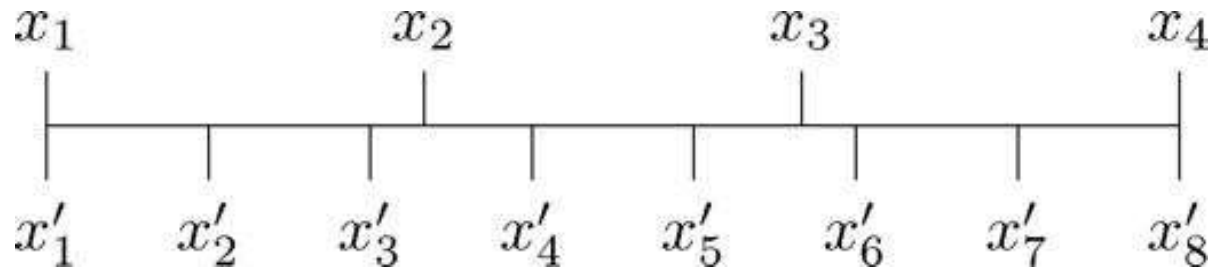


- 6.1 Interpolation of Data
- 6.2 Image Interpolation
- 6.3 General Interpolation
- 6.4 Enlargement by Spatial Filtering
- 6.5 Scaling Smaller
- 6.6 Rotation
- 6.7 Correcting Image Distortion

## Simple Problem

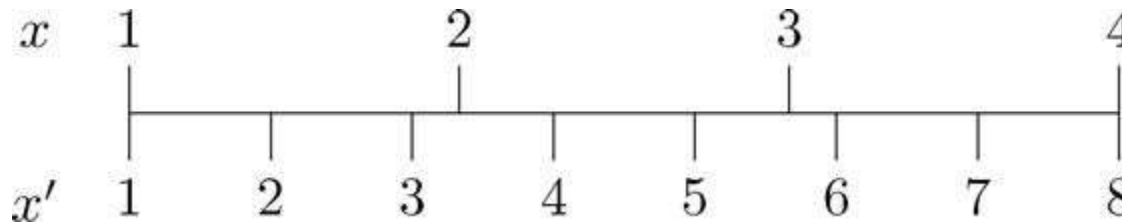
- Have 4 values
- Want to enlarge to 8

Figure 6.1: Replacing four points with eight



# Interpolation of Data

Figure 6.2: Figure 6.1 slightly redrawn



Suppose that the distance between each of the  $x_i$  points is 1; thus, the length of the line is 3. Thus, since there are seven increments  $x_1$  from to  $x_8$ , the distance between each two will be  $3/7 \approx 0.4286$ .

Formulas can be derived from finding eq. of a line given 2 points (4, 8) & (1, 1) going from  $x$  to  $x'$ ; (8, 4) & (1, 1) going from  $x'$  to  $x$

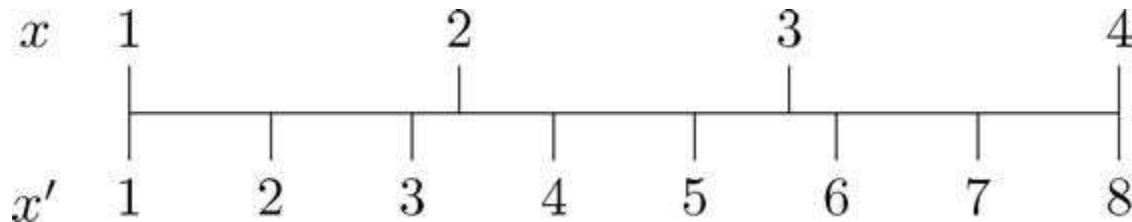
**What value for  $x$  do you get if you plug in 4 for  $x'$ ?**

$$2\frac{2}{7}$$

$$x' = \frac{1}{3}(7x - 4),$$
$$x = \frac{1}{7}(3x' + 4).$$

# Interpolation of Data

Figure 6.2: Figure 6.1 slightly redrawn



MatLab/Octave:

`linspace(X1, X2, N)` generates  $N$  points between  $X1$  and  $X2$ .

For  $N = 1$ , `linspace` returns  $X2$ .

```
>> x2 = linspace(1,4,8)
```

$x2 =$

```
1.0000  1.4286  1.8571  2.2857  2.7143  3.1429  3.5714  4.0000
```

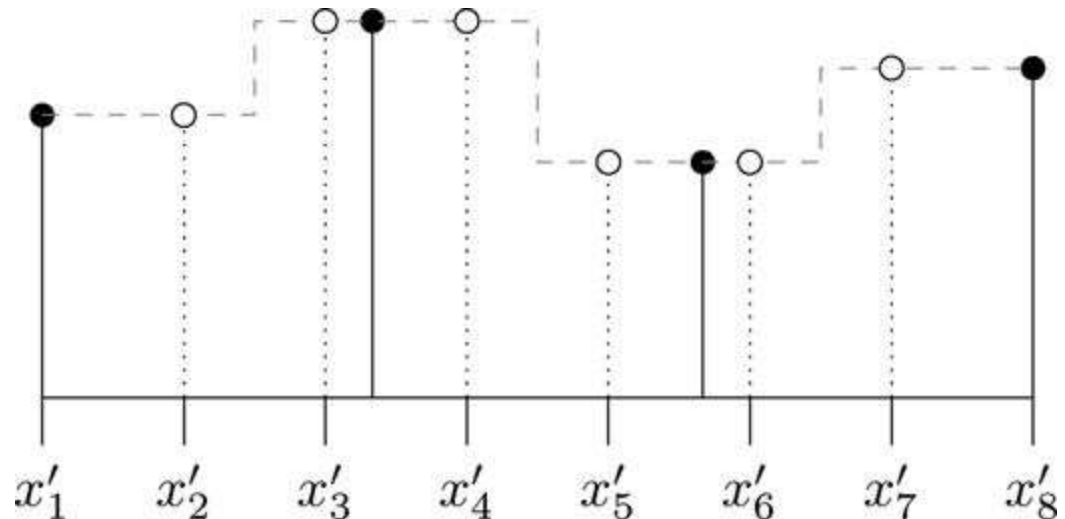
# Nearest Neighbor Interpolation

- Interpolation: guessing at function
- Nearest neighbor interpolation: assign  $f(x'_i) = f(x_j)$  where  $x_j$  is the original point closest to  $x'_i$

Figure 6.3: Nearest neighbor interpolation

Closed circles =  
original values

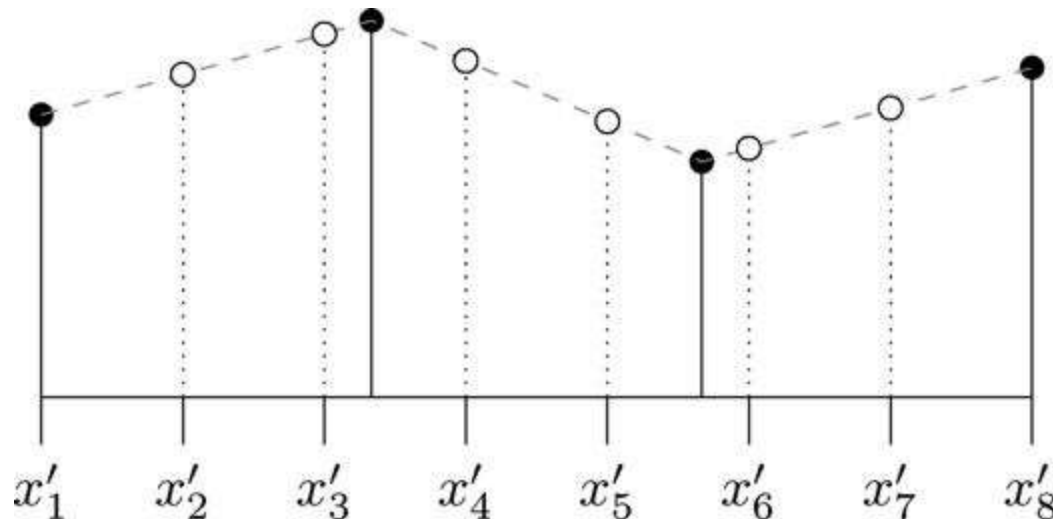
Open circles =  
interpolated values



# Linear Interpolation

Linear interpolation: join the original function values by straight lines, and take interpolated values as the values at those lines.

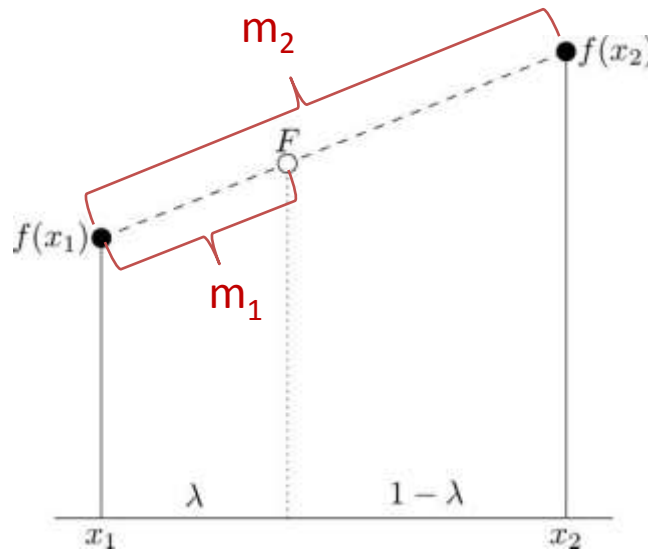
Figure 6.4: Linear interpolation



# Linear Interpolation

To calculate values

- By considering slopes:  $\frac{F - f(x_1)}{\lambda} = \frac{f(x_2) - f(x_1)}{1}$
- Solve for F:  $F = \lambda f(x_2) + (1 - \lambda)f(x_1)$





# Linear Interpolation

$$F = \lambda f(x_3) + (1 - \lambda)f(x_2)$$

**Example:**

$$\begin{aligned} f(x_1) &= 2, & f(x_2) &= 3, \\ f(x_3) &= 1.5, & f(x_4) &= 2.5 \end{aligned}$$

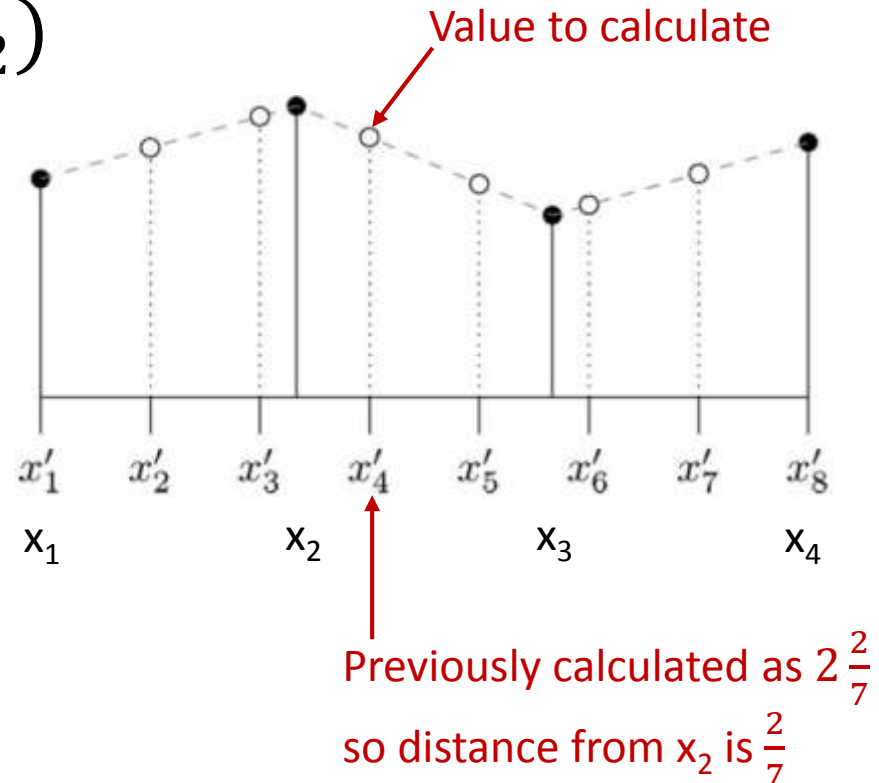
Consider  $x'_4$

Between  $x_2$  and  $x_3$

Corresponding value for  $\lambda$  is  $2/7$

Thus:

$$f(x'_4) = \frac{2}{7}(1.5) + \frac{5}{7}(3) \approx 2.5714$$



# Linear Interpolation

$$F = \lambda f(x_4) + (1 - \lambda)f(x_3)$$

**Example:**

$$\begin{aligned} f(x_1) &= 2, & f(x_2) &= 3, \\ f(x_3) &= 1.5, & f(x_4) &= 2.5 \end{aligned}$$

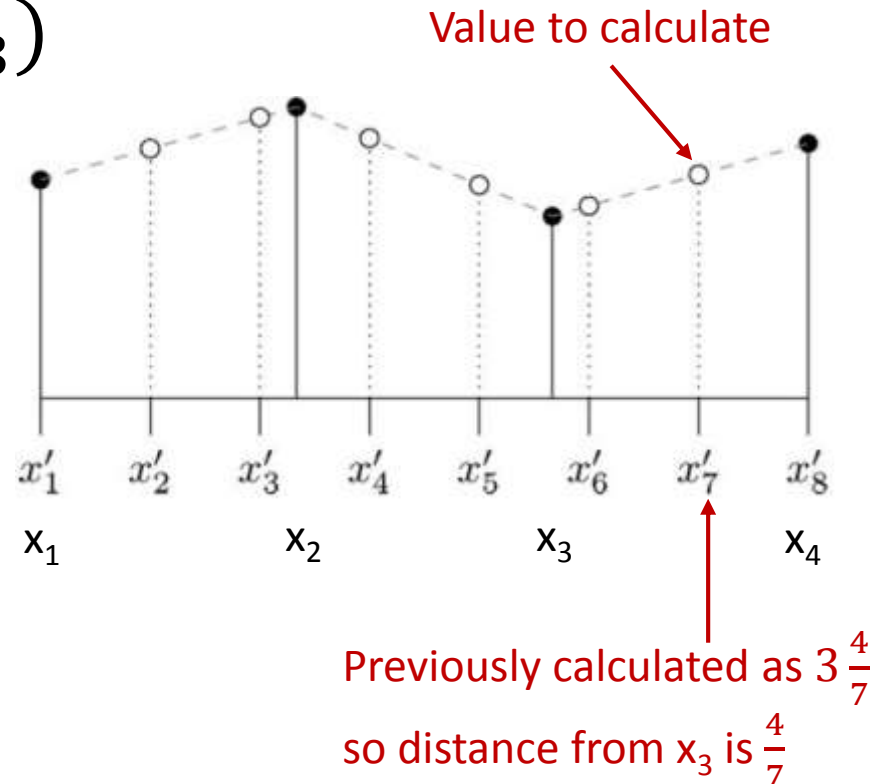
Consider  $x'_7$

Between  $x_3$  and  $x_4$

Corresponding value for  $\lambda$  is  $\frac{4}{7}$

Thus:

$$f(x'_7) = \frac{4}{7}(2.5) + \frac{3}{7}(1.5) \approx 2.0714$$



# Interpolation Example

## MatLab/Octave Example:

```
>> orig = [3 5 8 4 2];  
>> sp = linspace(1,5,7)
```

```
sp =
```

```
1.0000 1.6667 2.3333 3.0000 3.6667 4.3333 5.0000
```

```
>> new = uint8(interp1(orig, sp, 'nearest'))
```

```
new =
```

```
3 5 5 8 4 4 2
```

```
>> new = uint8(interp1(orig, sp, 'linear'))
```

```
new =
```

```
3 4 6 8 5 3 2
```

**Nearest:** Notice that all numbers are the same as original, but spread out so there are 7 instead of 5.

**Linear:** Notice that the 7 numbers are NOT all the same as original 5.

# Interpolation Example

## MatLab/Octave Example:

```
>> orig = [3 5 8 4 2];  
>> sp = linspace(1,5,7)
```

sp =

1.0000 1.6667 2.3333 3.0000 3.6667 4.3333 5.0000

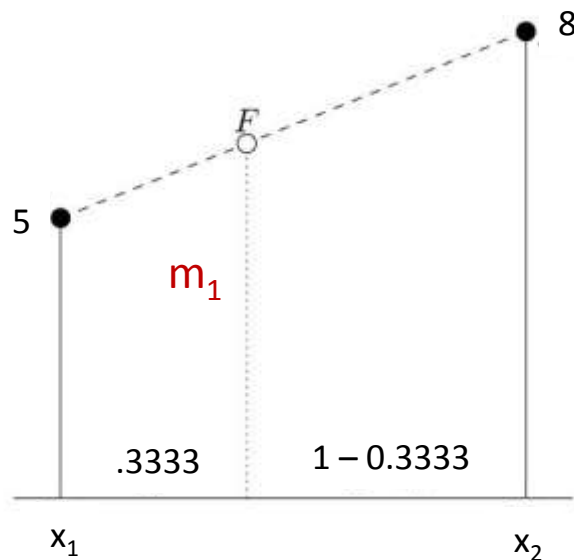
```
>> new = uint8(interp1(orig, sp, 'linear'))
```

new =

3 4 6 8 5 3 2

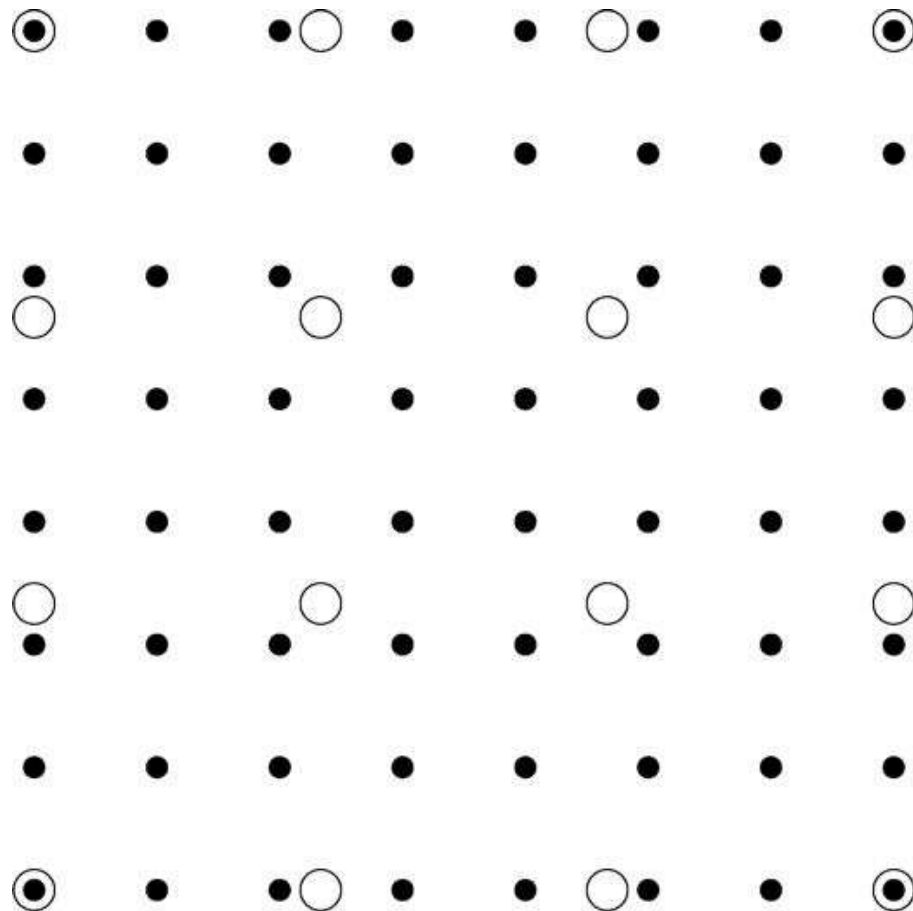
$= \text{round}(.3333 * 8 + (1 - .3333) * 5)$

- By considering slopes:  $\frac{F - f(x_1)}{\lambda} = \frac{f(x_2) - f(x_1)}{1}$
- Solve for F:  $F = \lambda f(x_2) + (1 - \lambda)f(x_1)$



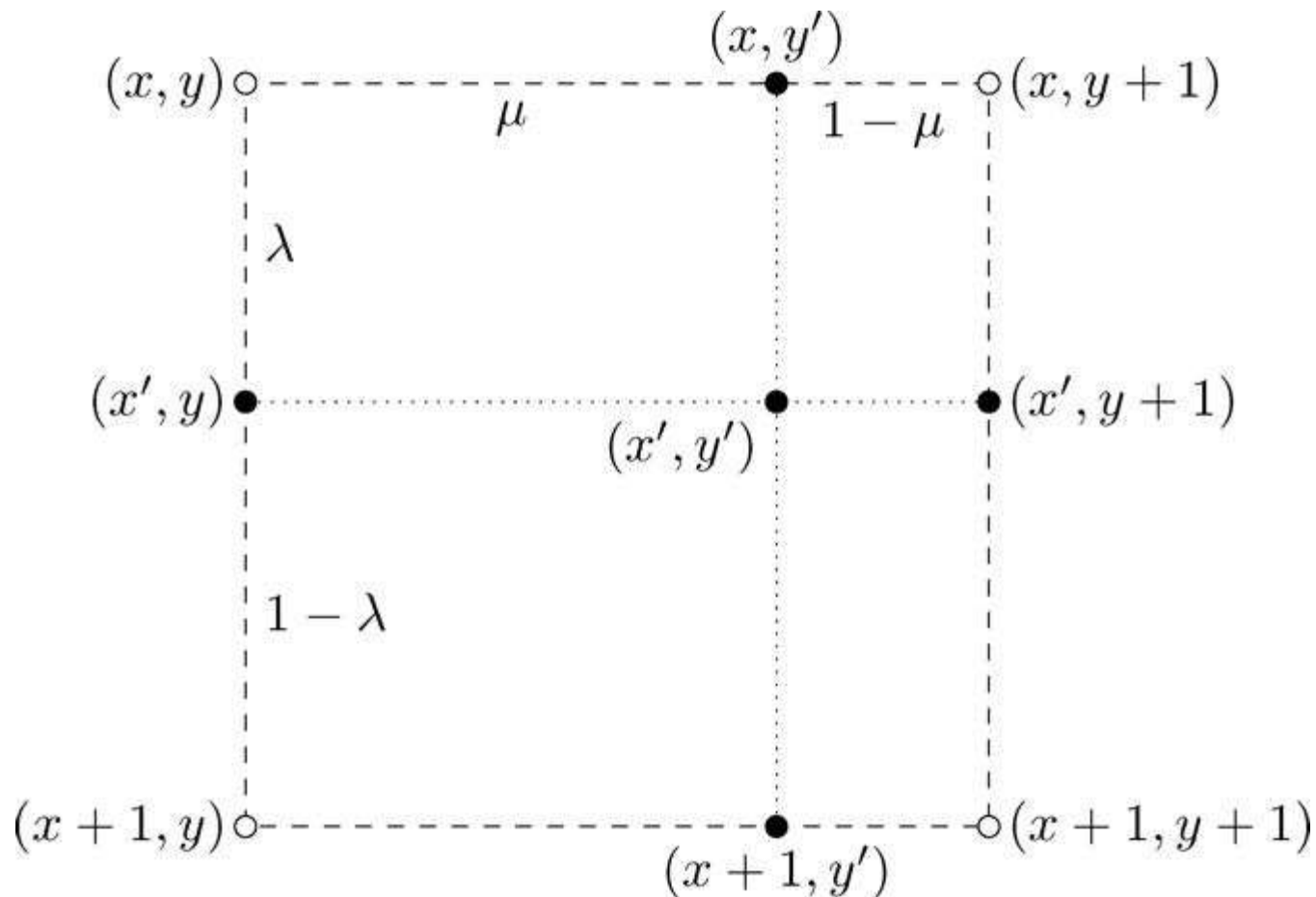
# Image Interpolation

Figure 6.6: Interpolation on an image:  
Large open circles are original points,  
filled circles are interpolated



# Image Interpolation

Figure 6.7: Interpolation between four image points



# Image Interpolation

Equation 6.1

$$- f(x, y') = \mu f(x, y + 1) + (1 - \mu) f(x, y)$$

and

$$- f(x + 1, y') = \mu f(x + 1, y + 1) + (1 - \mu) f(x + 1, y)$$

along the  $y'$  column

$$- f(x', y') = \lambda f(x + 1, y') + (1 - \lambda) f(x, y')$$

and substituting in the values just obtained produces

$$\begin{aligned} f(x', y') &= \lambda(\mu f(x + 1, y + 1) + (1 - \mu) f(x + 1, y)) + (1 - \lambda)(\mu f(x, y + 1) \\ &\quad + (1 - \mu) f(x, y)) \\ &= \lambda\mu f(x + 1, y + 1) + \lambda(1 - \mu) f(x + 1, y) + (1 - \lambda)\mu f(x, y + 1) \\ &\quad + (1 - \lambda)(1 - \mu) f(x, y) \end{aligned}$$

This last equation is the formula for *bilinear interpolation*.

# Image Interpolation

- Nearest neighbor gives blocky effect...YUCK!
- Bilinear interpolation is smoother...but blurry 😞
- Interpolation CAN'T predict values
- CAN'T create something from NOTHING!





# Try It:

```
>> c = imread('cameraman.png');  
>> head = c(33:96,90:153);  
>> imshow(head)  
>> head4n = imresize(head,4,'nearest');imshow(head4n)  
>> head4b = imresize(head,4,'bilinear');imshow(head4b)
```

**MATLAB/Octave**

Python has a `rescale` function in the `transform` module of `skimage`:

```
In : c = io.imread('cameraman.png')  
In : head = c[32:96,89:153]  
In : io.imshow(head)  
In : head4n = tr.rescale(head,2,order=0)    #order=0, nearest neighbor  
In : head4b = tr.rescale(head,2,order=1)    #order=1, bilinear interpolation
```

**Python**

# General Interpolation

Figure 6.9: Scaling by interpolation



(a) Nearest neighbor scaling



(b) Bilinear interpolation

# General Approach

Nearest neighbor and bilinear interpolation are two special cases of a more general approach.

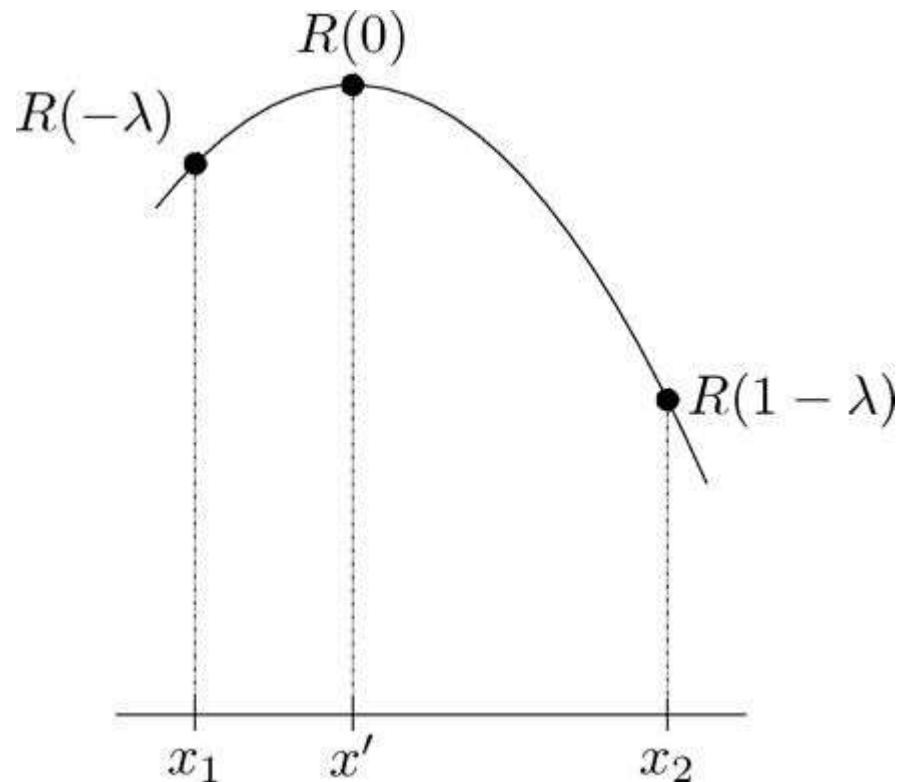
The idea is this: we wish to interpolate a value  $f(x')$  for  $x_1 \leq x' \leq x_2$ , and suppose  $x' - x_1 = \lambda$ . We define an interpolation function  $R(u)$ , and set

$$f(x') = R(-\lambda)f(x_1) + R(1 - \lambda)f(x_2).$$

# General Interpolation

Figure 6.10: Using a general interpolation function

The function  $R(u)$  is centered at  $x'$ , so  $x_1$  corresponds with  $u = -\lambda$ , and  $x_2$  with  $u = 1 - \lambda$ .



# Bicubic Interpolation

Figure 6.15: Enlargement using bicubic interpolation



# Spatial Filtering

Figure 6.16: Enlargement by spatial filtering



Zero interleaving



Nearest neighbor



Bilinear

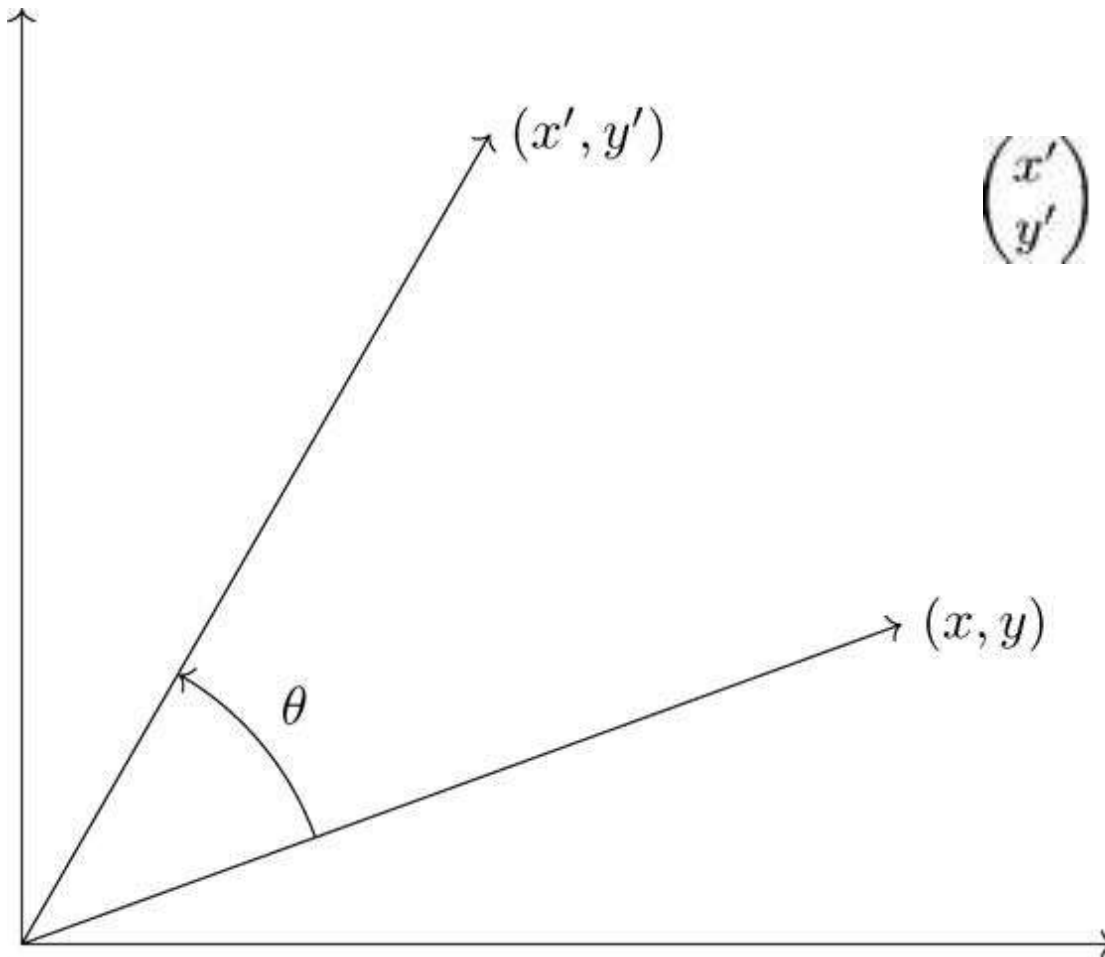


Bicubic

- Image minimization: making an image smaller
- How?
  - Subsampling: taking out alternate pixels
    - Can create gaps
  - Apply a low pass filter first

# Rotation

Figure 6.18: Rotating a point through angle  $\theta$

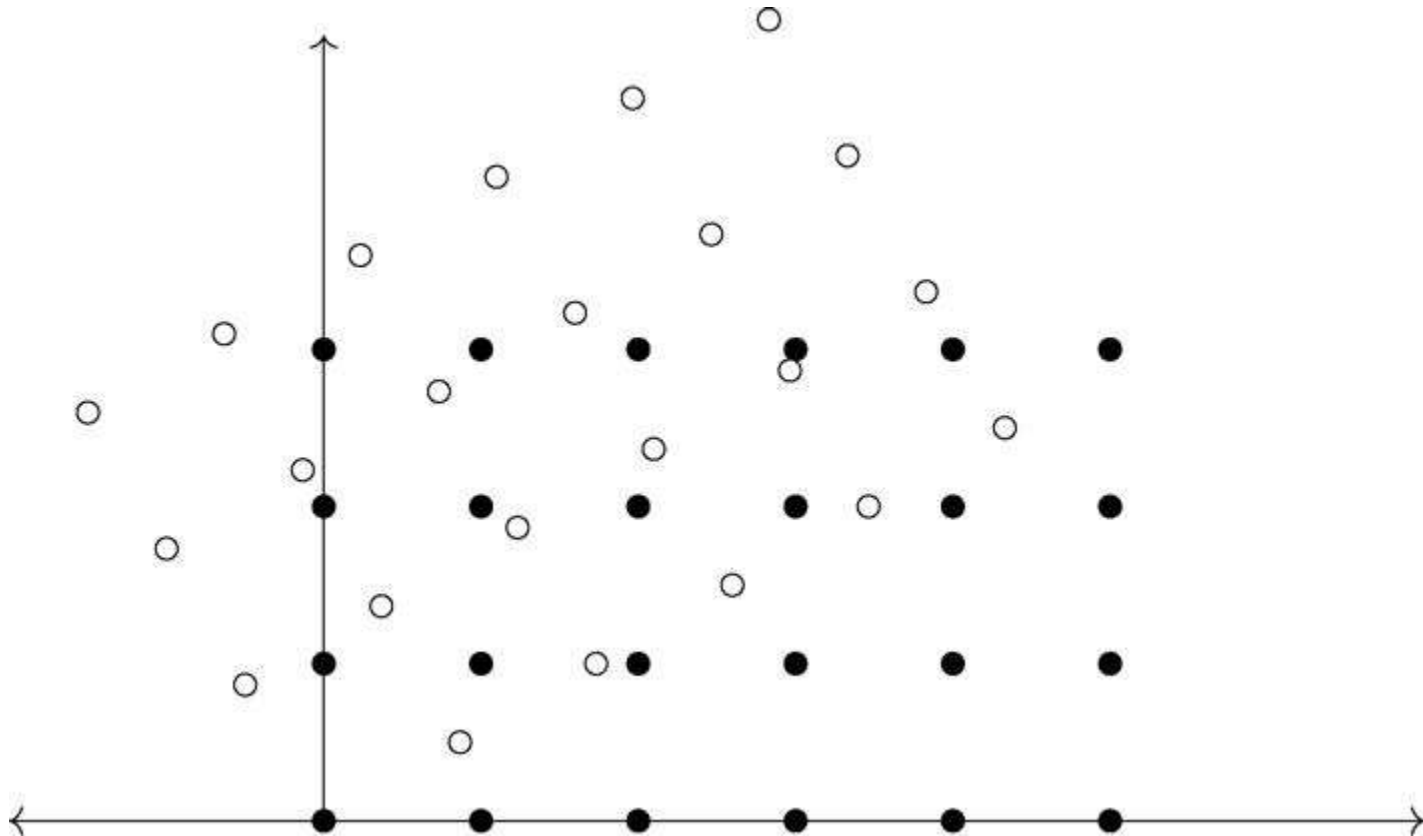


$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix}.$$



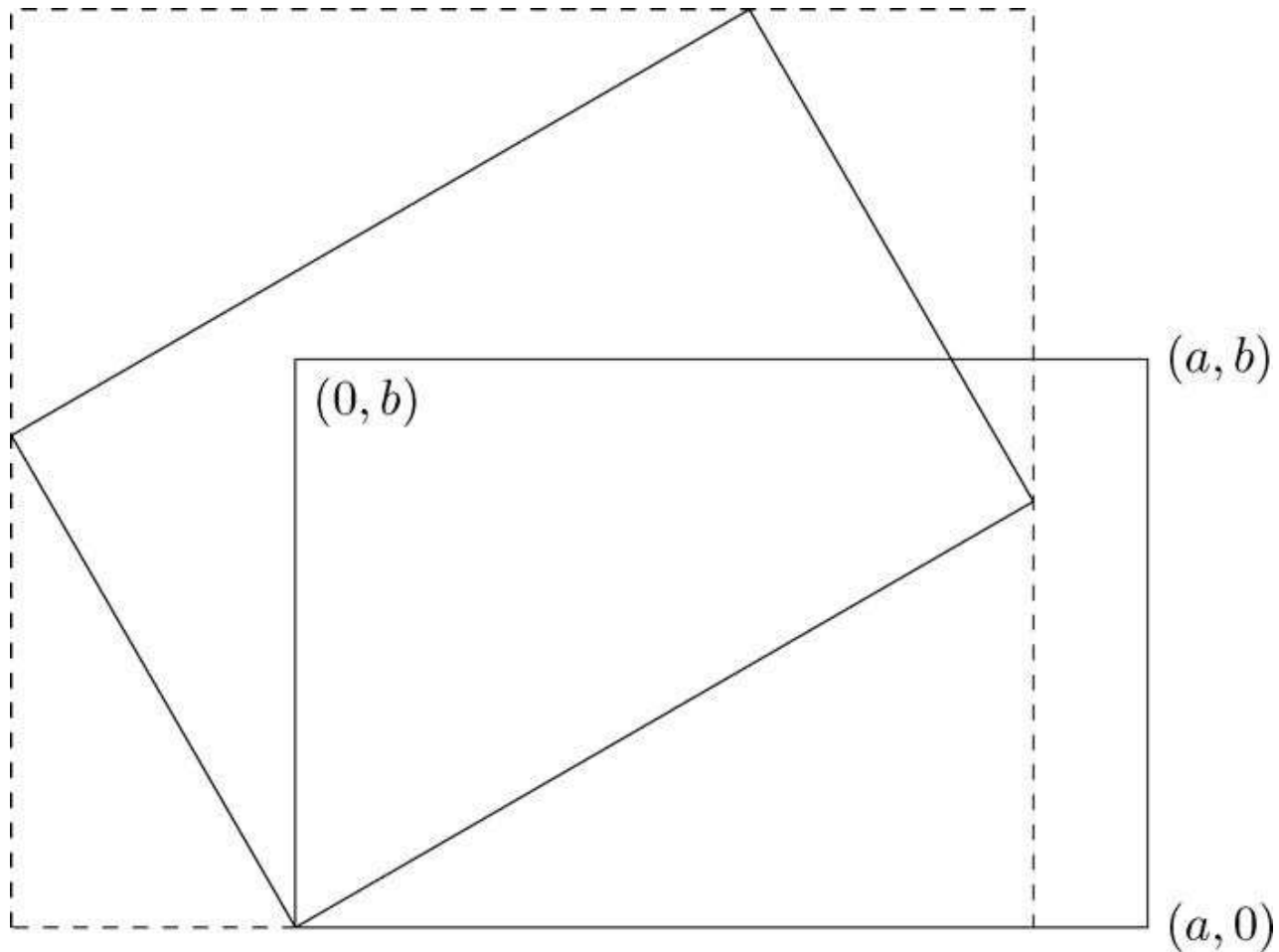
# Rotation

Figure 6.19: Rotating a rectangle



# Rotation

Figure 6.20: A rectangle surrounding a rotated image



# Try It:

```
c = imread('cameraman.png')
```

```
>> cr = imrotate(c,60);           % default is nearest neighbor  
>> imshow(cr)  
>> crc = imrotate(c,60,'bicubic');  
>> figure,imshow(crc)
```

**MATLAB/Octave**

and in Python the commands are

```
In : cr = tr.rotate(c,60,order=0)  
In : io.imshow(cr)  
In : crc = tr.rotate(c,60,order=3)  
In : f = figure(), f.show(io.imshow(crc))
```

**Python**

# Rotation

Figure 6.23: Rotation with interpolation



(a) Nearest neighbor



(b) Bicubic interpolation

# Correcting Image Distortion

## Perspective Distortion:

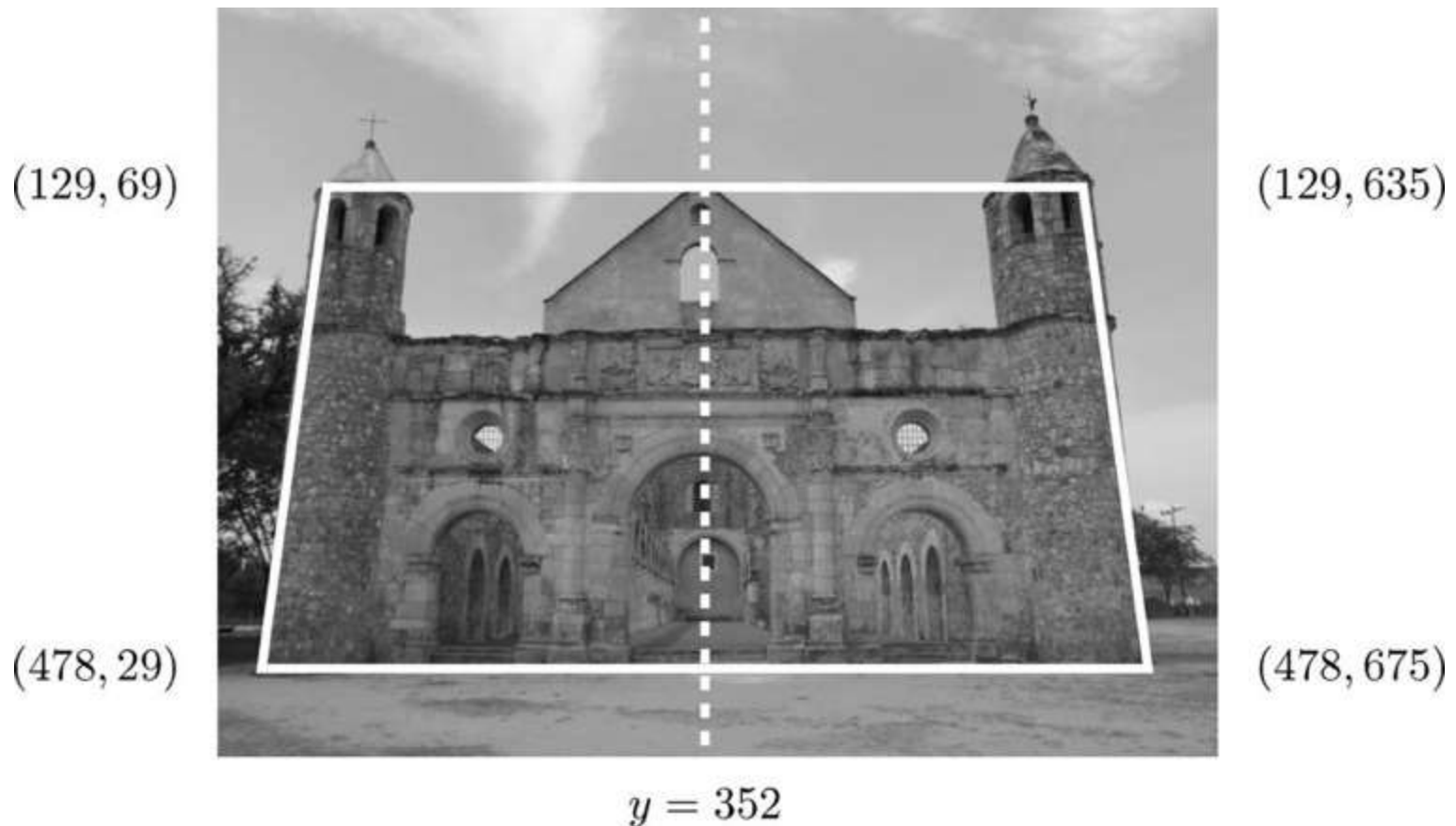
- Because of the position of the camera lens relative to the building, the towers appear to be leaning inward.
- Fixing this requires a little algebra.

Figure 6.24: Perspective distortion



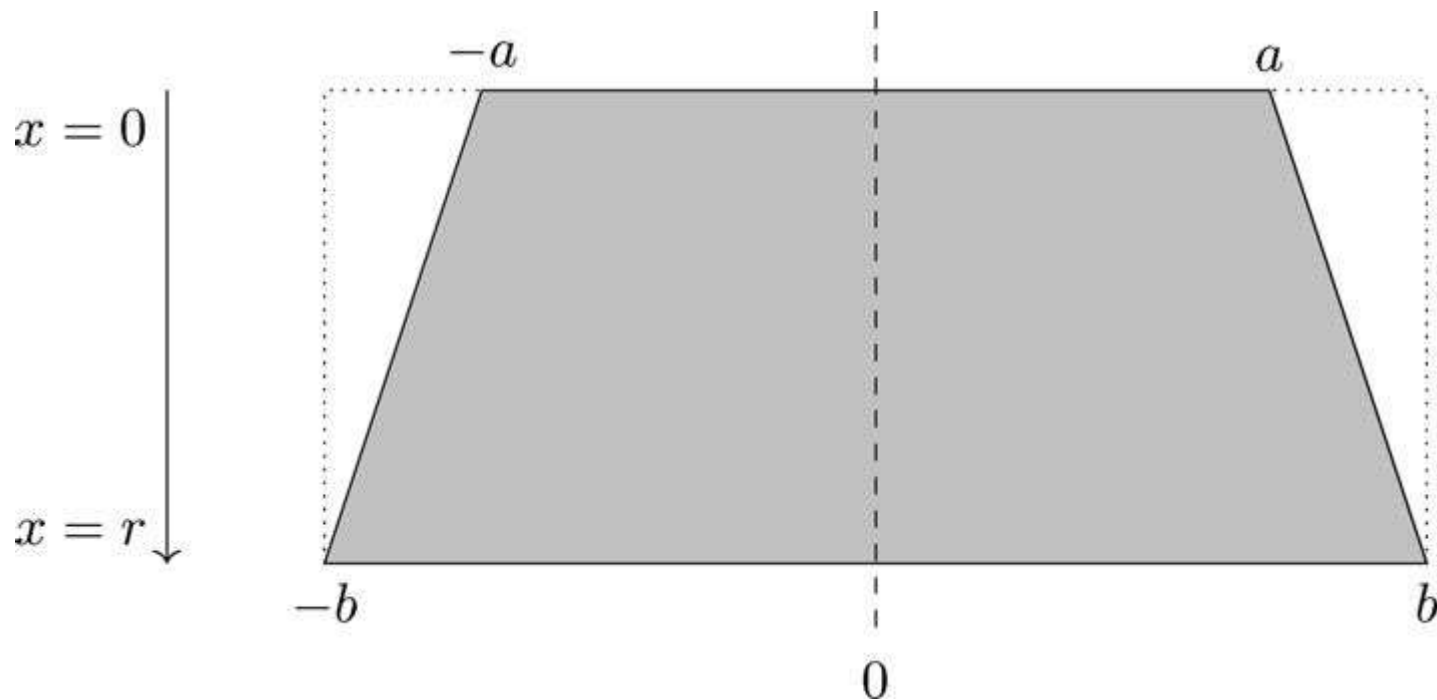
# Correcting Image Distortion

Figure 6.25: The corners of the building



# Correcting Image Distortion

Figure 6.26: A general symmetric trapezoid



# Correcting Image Distortion

Figure 6.28: The image corrected for perspective distortion





```
im = imread('monastery.png');
```

```
>> [r,c] = size(im);  
>> z = zeros(r,c);  
>> x1 = 129; y1=283; x2=478; y2=323;  
>> a = y1-x1*(y2-y1)/(x2-x1)  
>> b = y1+(r-x1)*(y2-y1)/(x2-x1)  
>> [y,x] = meshgrid(1:c,1:r);  
>> sq = floor((y-352).*((b-a)/(b*r)*x+a/b)+352);  
>> for i = 1:r,...  
>     for j = 1:c,...  
>         z(i,j) = im(i,sq(i,j));  
>     end;...  
> end;  
>> im2 = uint8(z)
```

```
In : r,c = im.shape
In : x1, y1, x2, y2 = 129.0, 283.0, 478.0, 323.0
In : a = y1-x1*(y2-y1)/(x2-x1)
In : b = y1+(r-x1)*(y2-y1)/(x2-x1)
In : z = np.zeros_like(im)
In : x,y = np.mgrid[0:r,0:c]
In : sq = np.floor((y-352)*((b-a)/(b*r)*x+a/b)+352)
In : for i in range(r):
...:     for j in range(c):
...:         z[i,j] = im[i,sq[i,j]]
...:
In : im2 = uint8(z)
```