

# Chapter 5 Image Restoration

In this chapter, we focus on geometric transformations that modify the spatial relationships between pixels in an image.

## Applications

- Image restoration (calibration, rectification)
- Image warping and morphing

# Topics to be Covered

- Forward and reverse mapping
- Interpolation (NNI, Bilinear)
- Image translation
- Image rotation
- Image scaling (zooming)
- Affine transform
- Radial distortion
- Image warping

# Simple Image Manipulations

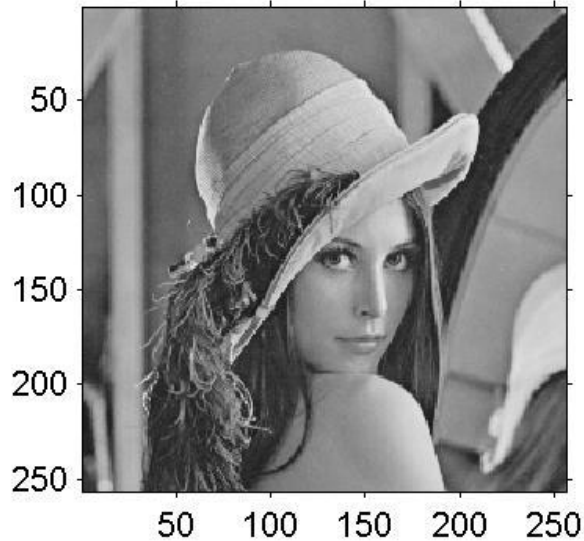
A digital image is a matrix. Any manipulation of rows and columns results in an image manipulation.

(E.g.)

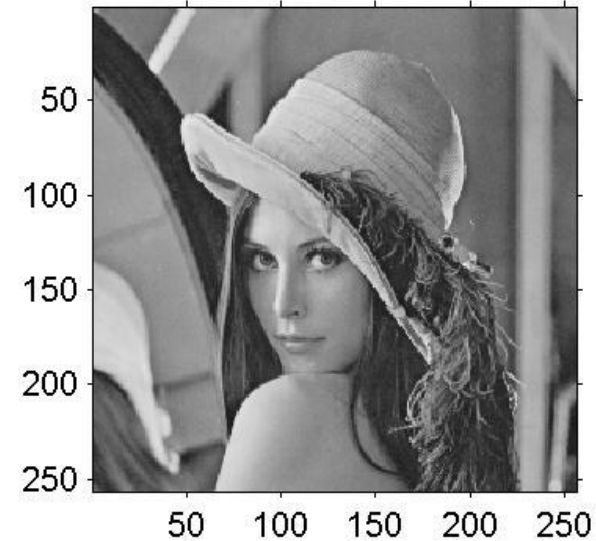
1. Horizontally flipped image (Mirror image)  
Rearrange all columns in the reverse order.
2. Vertically flipped image (Upside-down image)  
Rearrange all rows in the reverse order.
3. Transposed image  
Mirror followed by 90-degree anti-clockwise rotation
4. Image translation  
Shift the indexes of rows and/or columns

# Examples of Image Manipulations

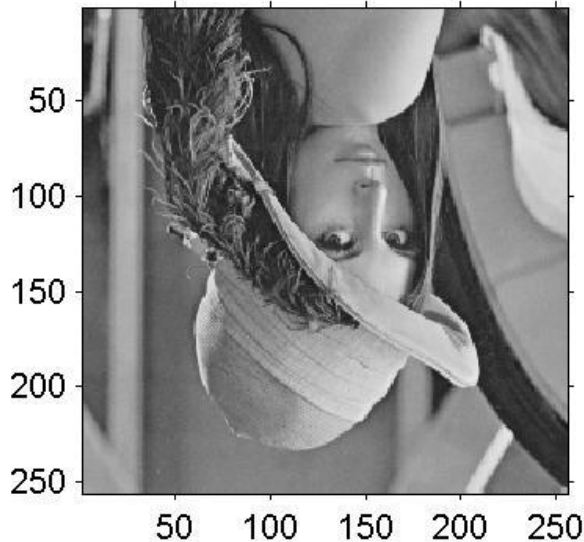
Original image



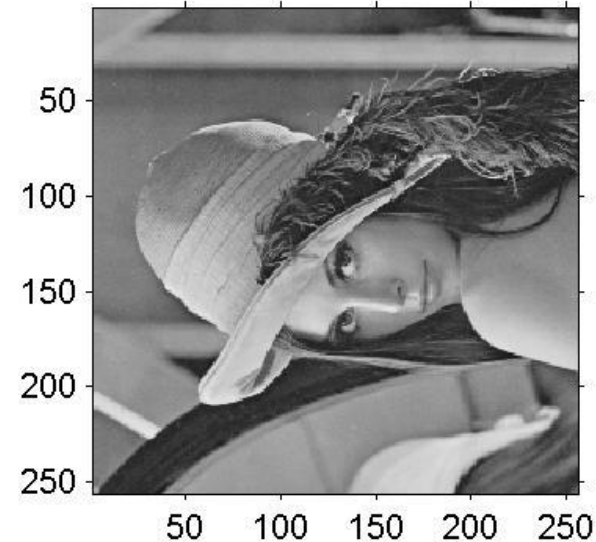
Horizontally flipped



Vertically flipped



Transposed image



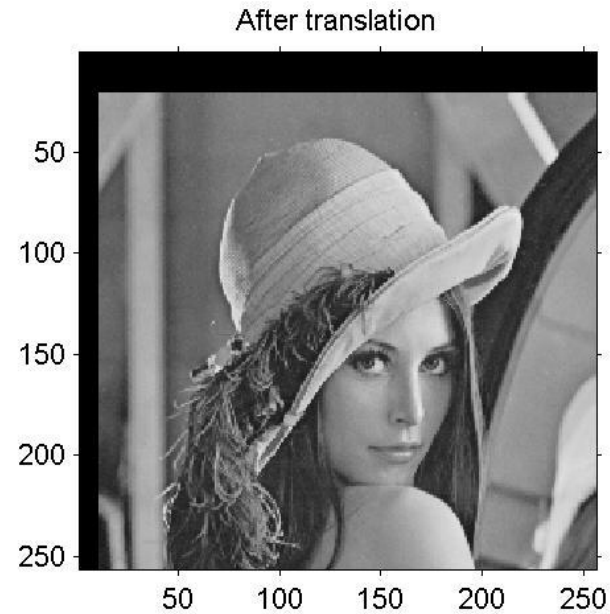
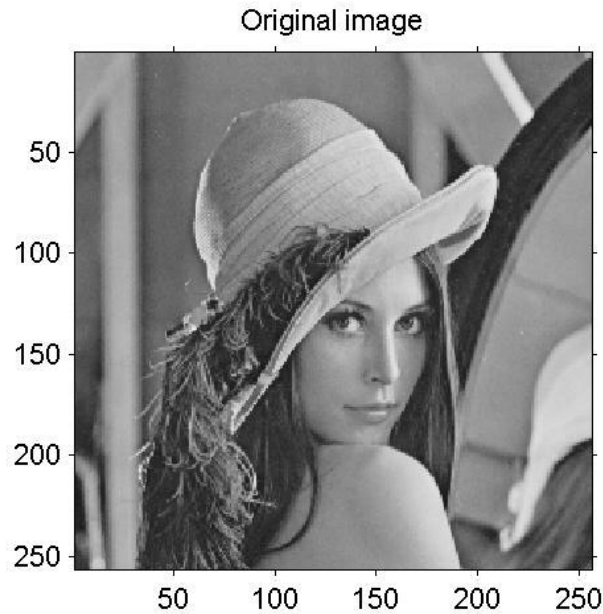
# MATLAB Commands

```
>> img=imread('Lena.gif');  
>> [vsize,hsize]=size(img);  
>>  
>> mirror=img(1:vsize,hsize:-1:1);  
>>  
>> upside=img(vsize:-1:1,1:hsize);  
>>  
>> trans=transpose(img);  
>>
```

# Exercise 1

How do you generate a 180-degree rotated image by manipulating the columns and rows of the original image?

Image is shifted vertically by 20 pixels, and horizontally by 10 pixels as



$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} x \\ y \end{pmatrix} + \begin{pmatrix} 20 \\ 10 \end{pmatrix}$$

# Forward and Reverse Mapping

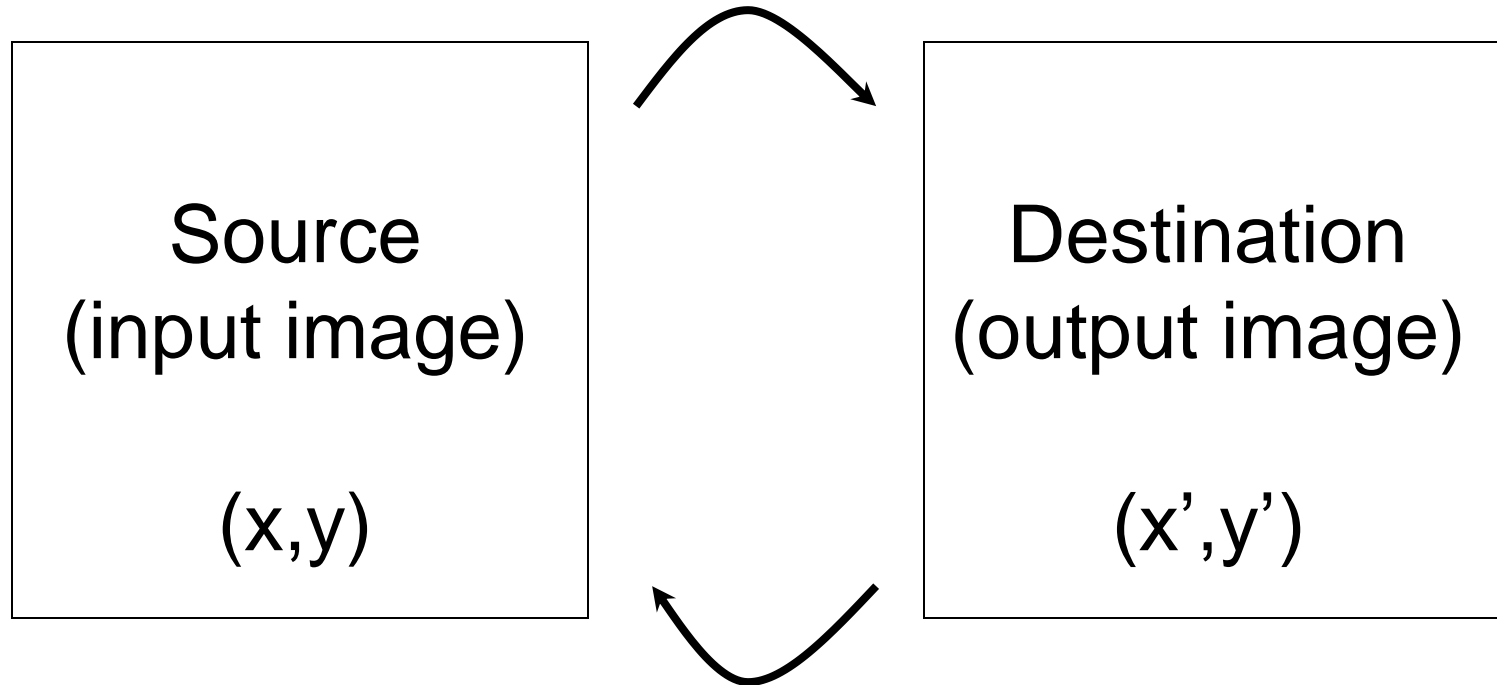
There are two ways to generate a new image from an original image; forward mapping and reverse mapping.

In either case, we need to have equations that relate the coordinates in the original image and the new image.



# Forward and Reverse Mapping

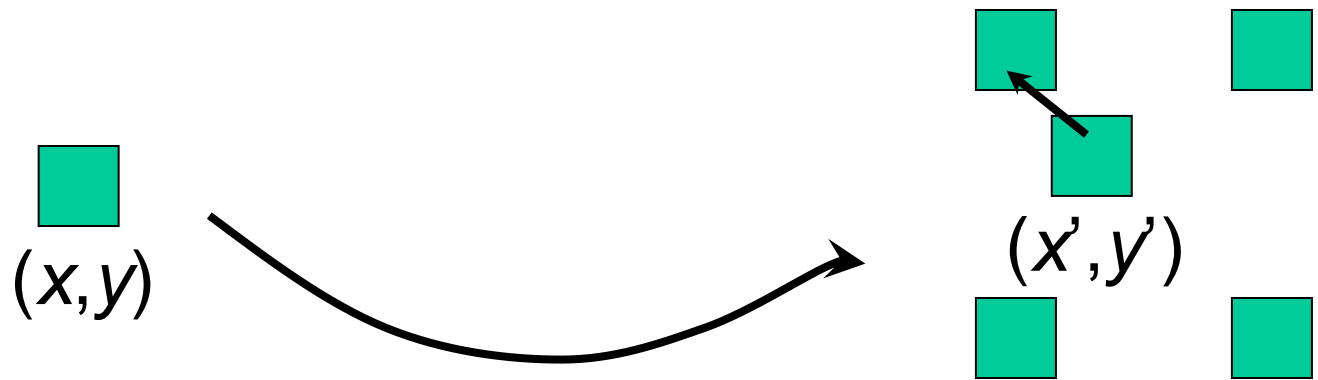
Forward mapping  
(Read address control)



Reverse mapping or backward mapping  
(Write address control)

# Forward Mapping

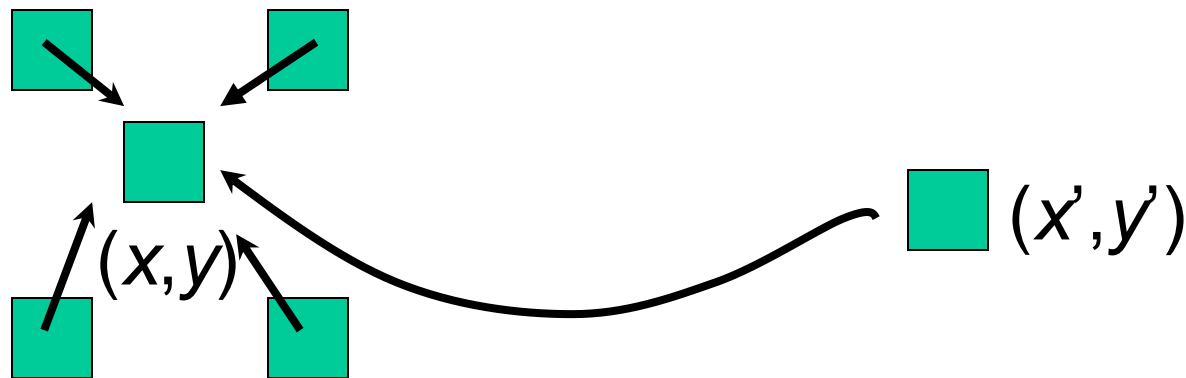
In forward mapping, the coordinate  $(x', y')$  is determined depending on the coordinate  $(x, y)$ . When  $(x', y')$  are not integers, the nearest integer is used.



Forward mapping

# Reverse Mapping

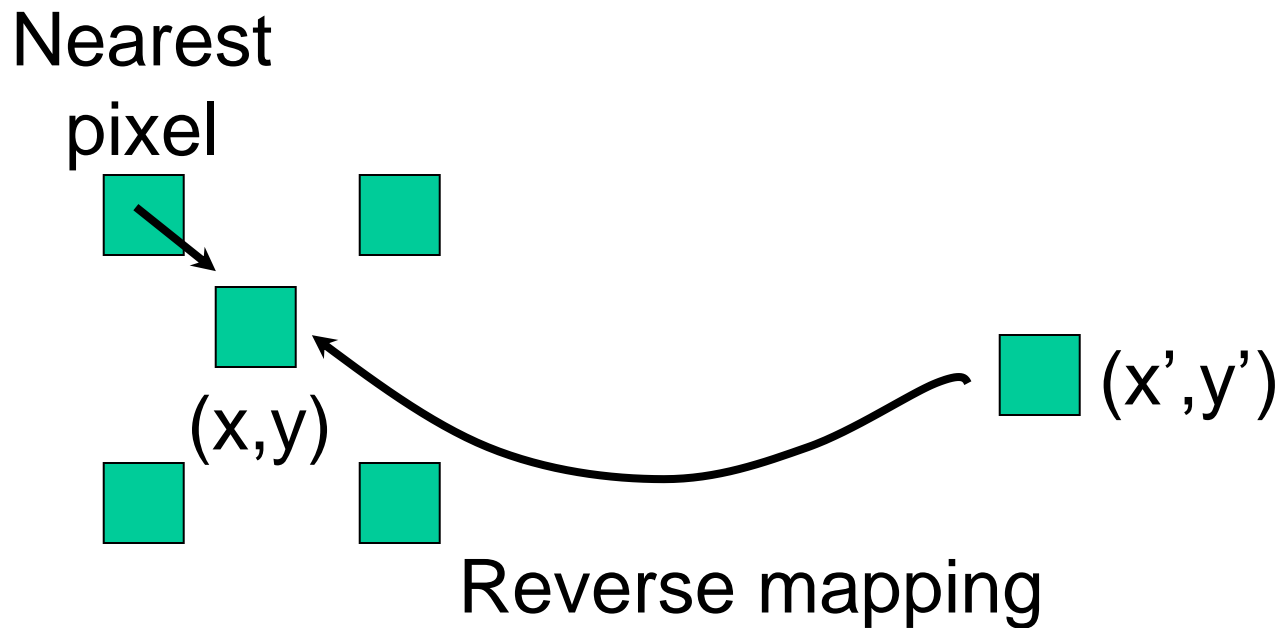
In the case of reverse mapping, we need to compute the values at  $(x,y)$  that corresponds to  $(x',y')$ . When  $(x,y)$  are not integers, we refer to the value(s) of adjacent pixel(s). This process is called *interpolation*.



Reverse mapping

# Nearest Neighbor Interpolation (NNI)

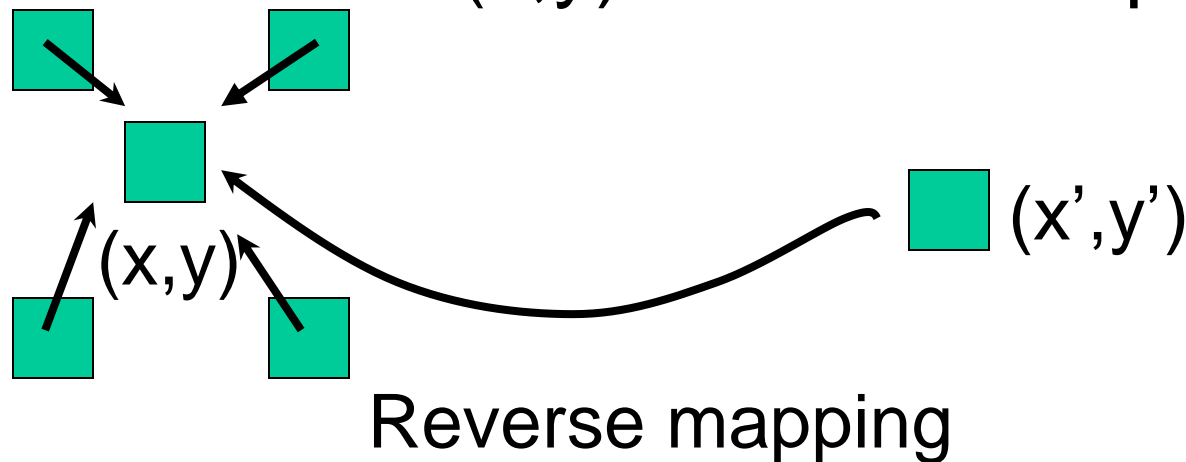
The simplest and fastest interpolation method is to use the value of the nearest pixel.



# Bilinear Interpolation

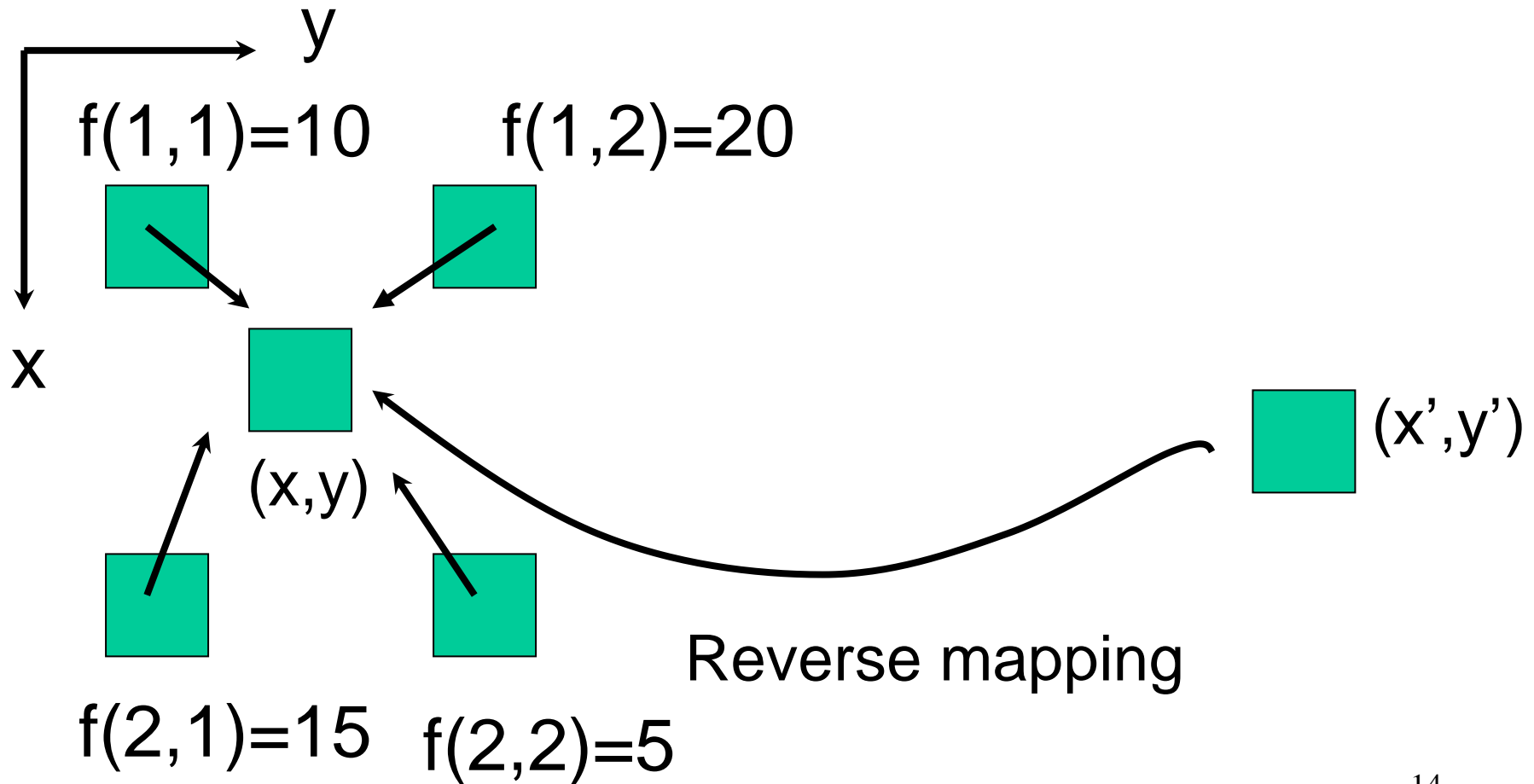
A more smooth interpolation can be achieved by combining the values of four adjacent pixels.

Weights are determined by the inverse of the distances between  $(x,y)$  and the four pixels.



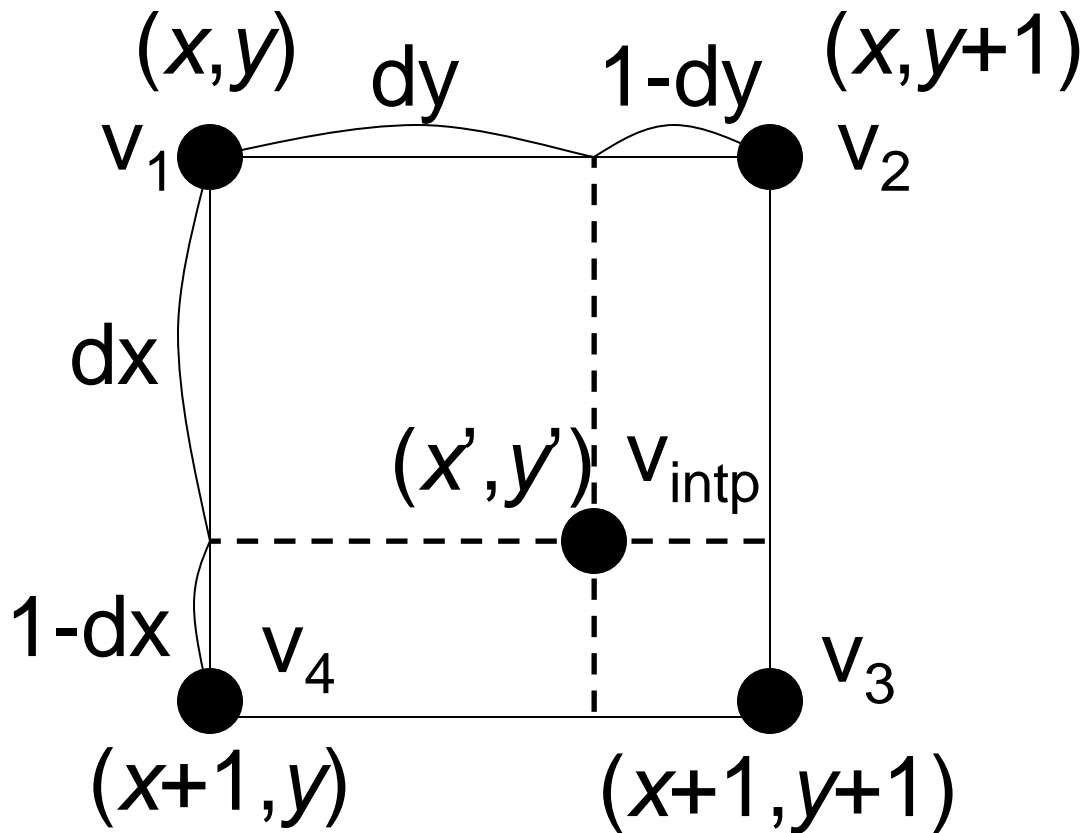
## Exercise 2

Calculate the value at  $(x,y)=(1.2,1.5)$  by bilinear interpolation.



# Exercise 3

Referring to the figure below, derive the gray level at  $(x', y')$  by bilinear interpolation.



# Image Rotation by Forward Mapping

Rotation matrix is given by

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

This equation relates the coordinates between input and output images, and can be used for forward mapping directly.



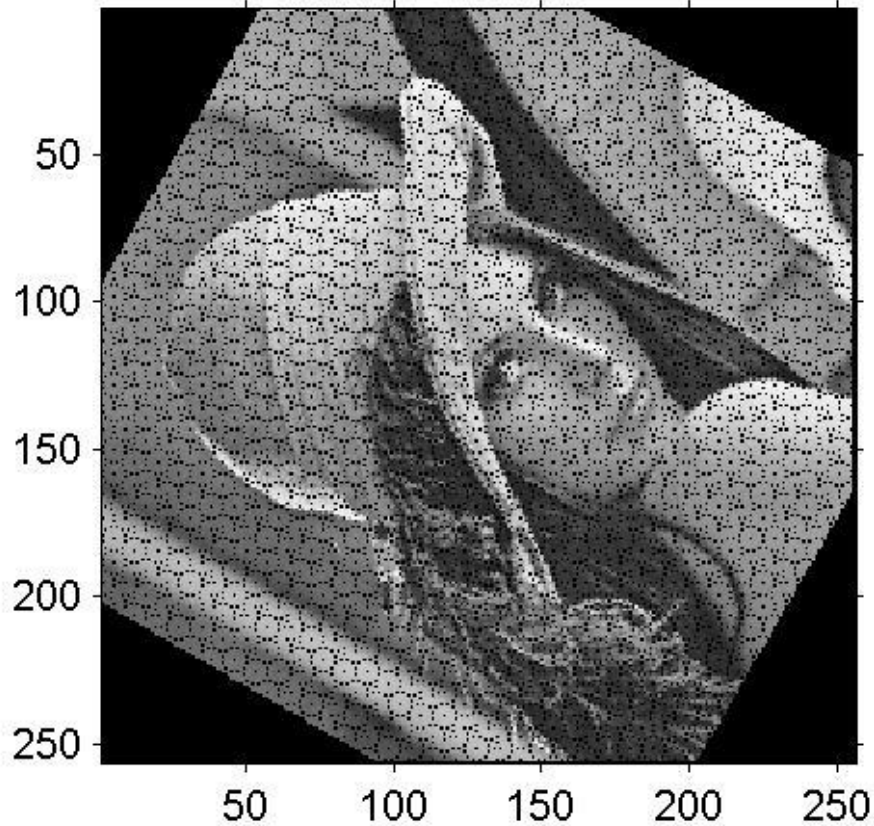
# Mapping Function

If you want to rotate an image about its center  $(x_c, y_c)$ , the mapping function needs to be modified into

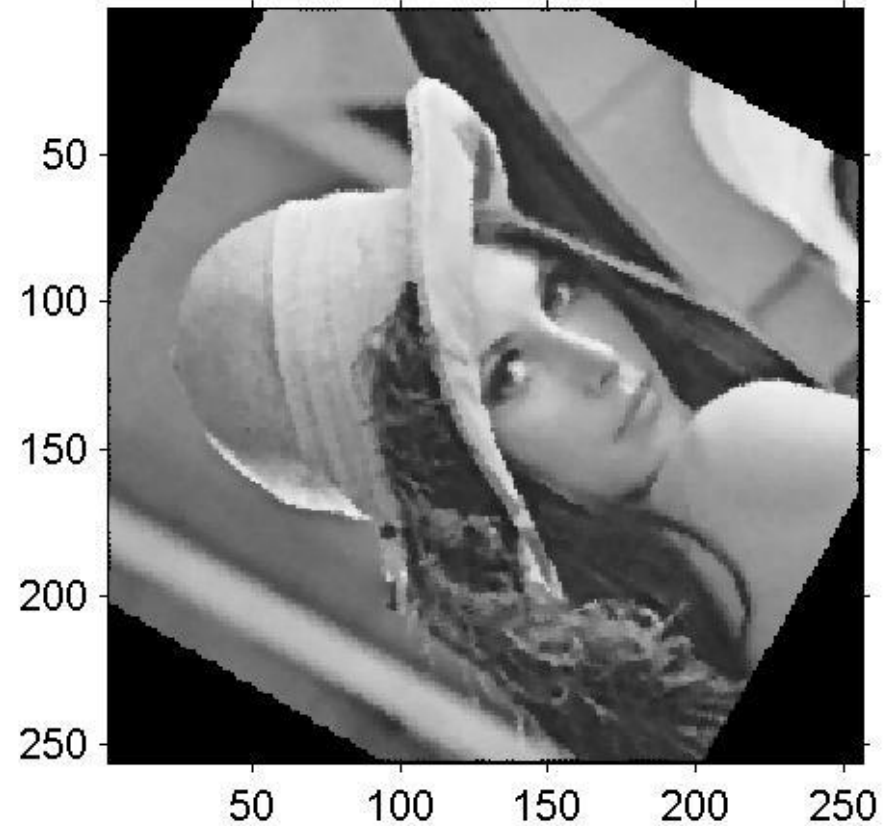
$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{pmatrix} \begin{pmatrix} x - x_c \\ y - y_c \end{pmatrix} + \begin{pmatrix} x_c \\ y_c \end{pmatrix}$$

# Rotated Image by Forward Mapping

Forward mapping (NNI)



After median filtering



# A Problem of Forward Mapping

Forward mapping often leaves holes in the resultant image. This problem is exacerbated when an image is stretched to a great extent.

If holes are small, they can be filled by the median filter at the sacrifice of some image details.

# Image Rotation by Reverse Mapping

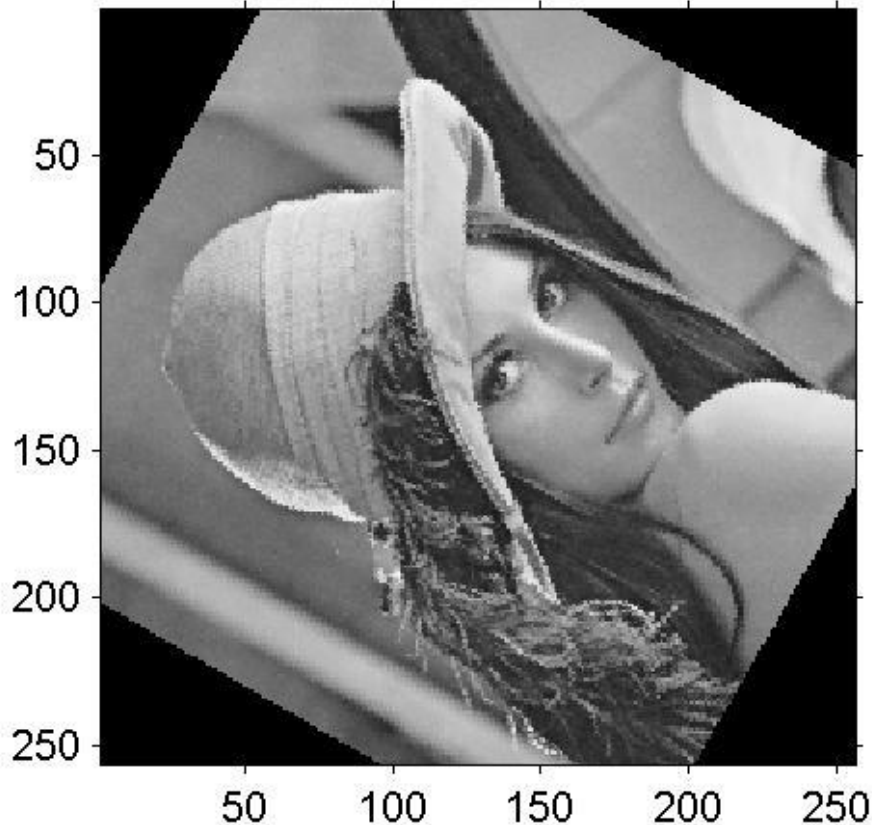
To implement reverse mapping, we need to derive the inverse of a mapping function.

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

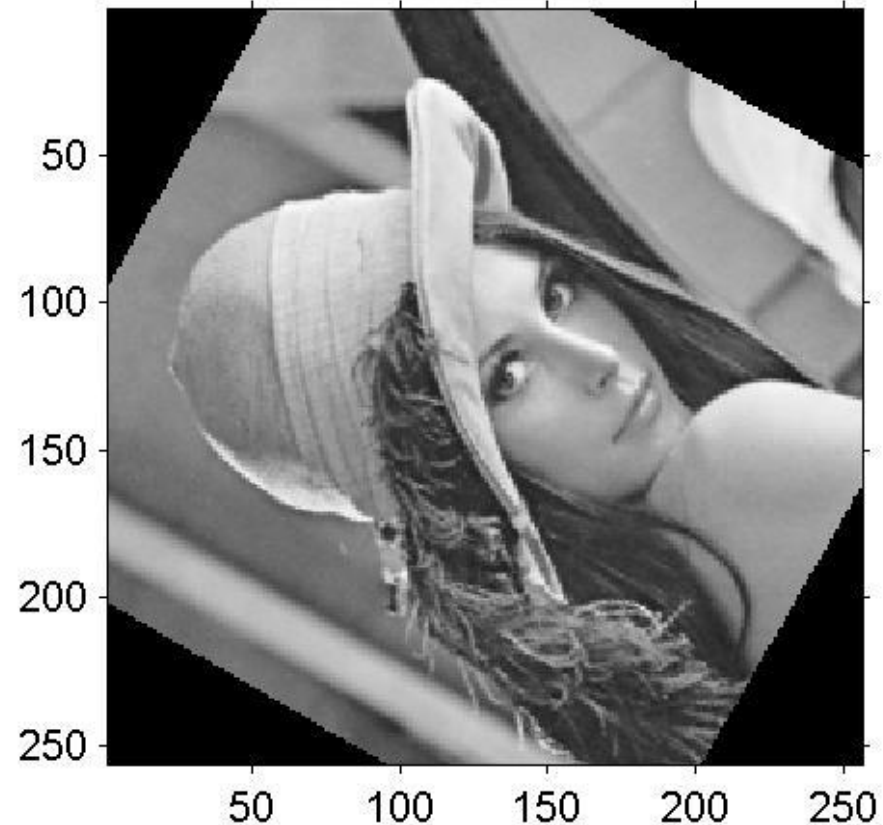
$$\begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} \cos \theta & \sin \theta \\ -\sin \theta & \cos \theta \end{pmatrix} \begin{pmatrix} x' - x_c \\ y' - y_c \end{pmatrix} + \begin{pmatrix} x_c \\ y_c \end{pmatrix}$$

# Rotated Image by Reverse Mapping

Reverse mapping (NNI)



Reverse mapping (BI)



No holes any more. Note also the difference between two interpolation methods.

# Image Scaling by Forward Mapping

Scaling matrix is given by

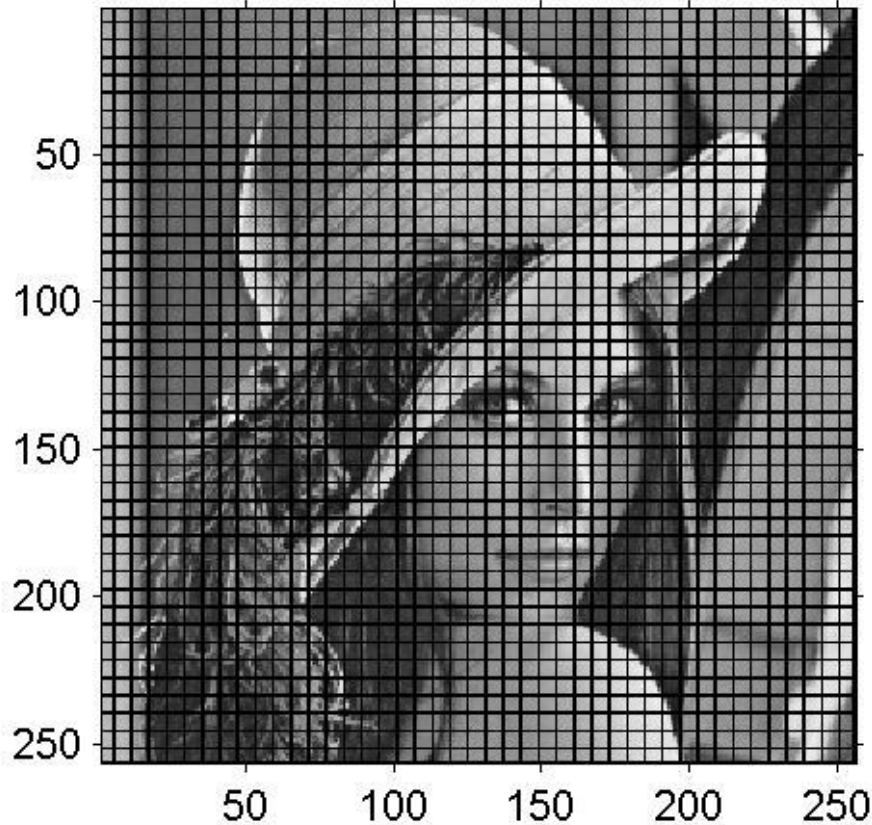
$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} m & \mathbf{0} \\ \mathbf{0} & n \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix}$$

where ***m***, ***n*** denote the scaling (zooming) factor.  
To zoom an image about its center, the mapping function will be

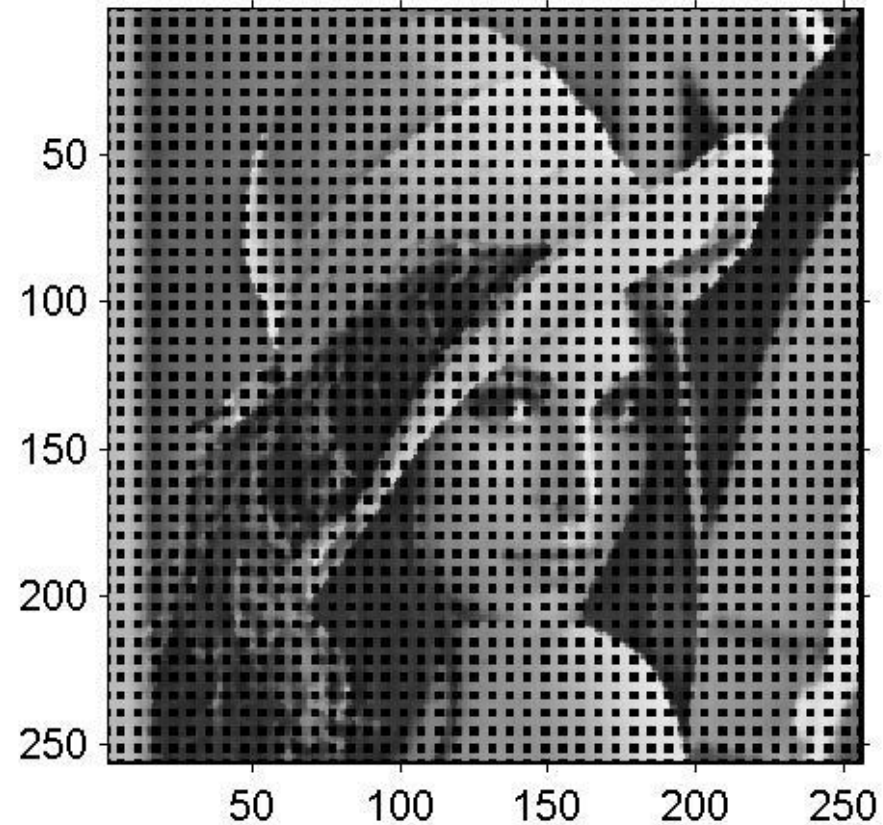
$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} m & \mathbf{0} \\ \mathbf{0} & n \end{pmatrix} \begin{pmatrix} x - x_c \\ y - y_c \end{pmatrix} + \begin{pmatrix} x_c \\ y_c \end{pmatrix}$$

# Enlarged Image by Forward Mapping

Forward mapping (NNI)



After median filtering



$m=1.2$  (20% enlarged)

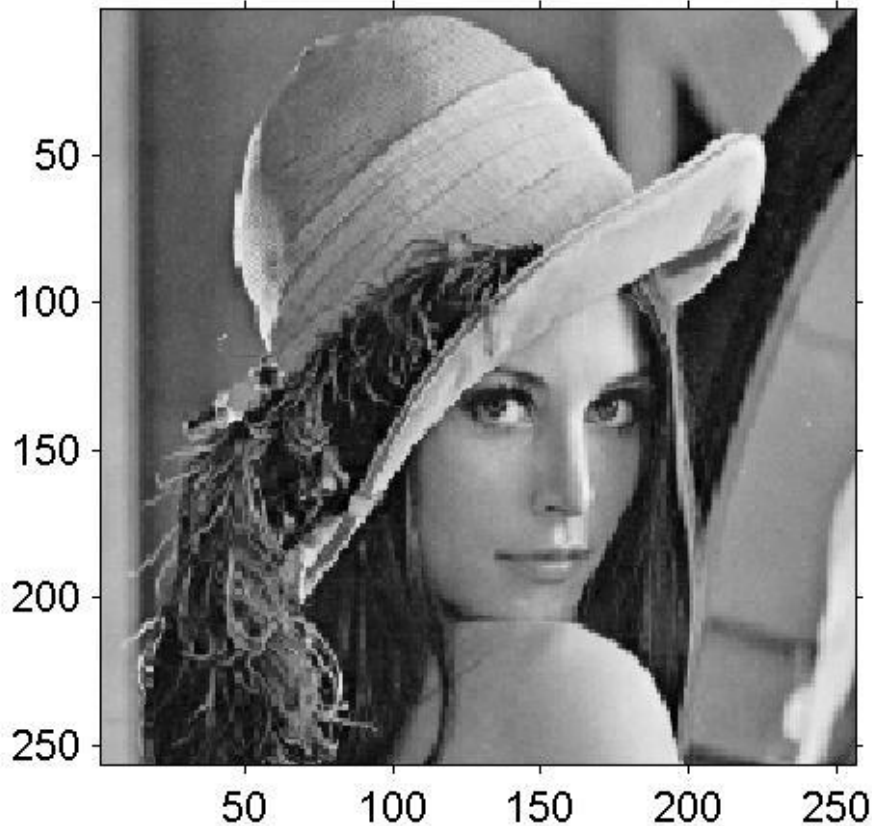
# Exercise 4

Show the mapping function for image scaling (zooming) by reverse mapping.

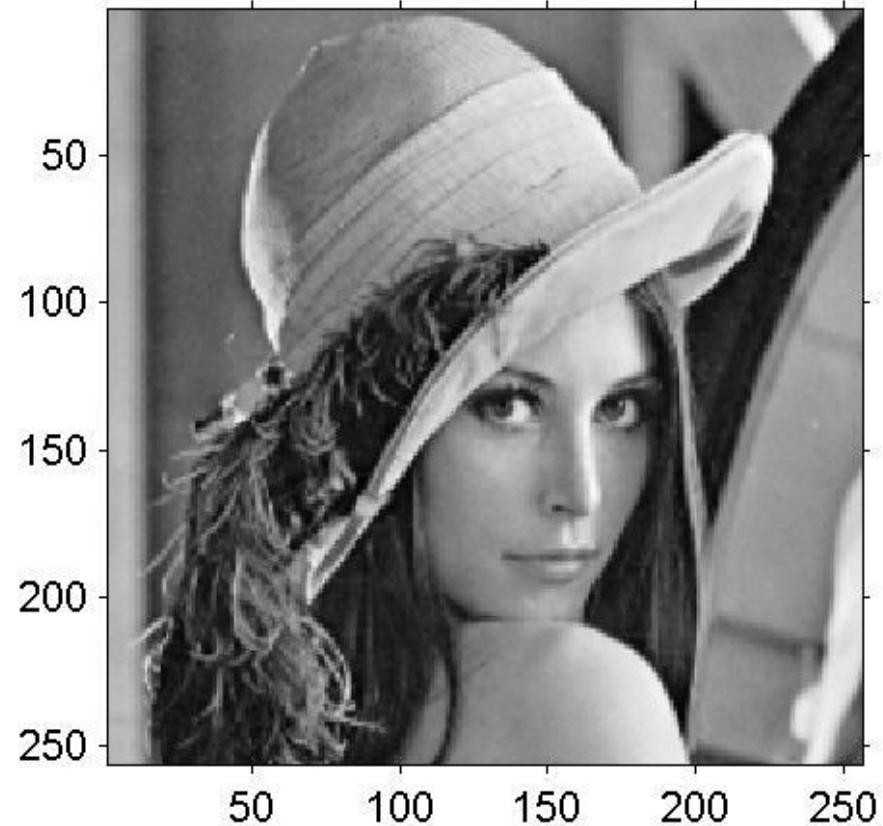


# Enlarged Image by Reverse Mapping

Reverse mapping (NNI)



Reverse mapping (BI)



$$m=1.2$$

Note also the difference between two interpolation methods.

## Exercise 5

We want to shift an image  $f(x,y)$  by  $(\alpha, \beta)$ , magnify it  $m$  times, and then rotate it by  $\theta$  (rad). Express the output coordinates  $(x',y')$  in a consolidated matrix form. Express also  $(x',y')$  when the order of the three operations is reverse.

# Affine Transform

Translation, rotation, and scaling can be expressed with a single equation.

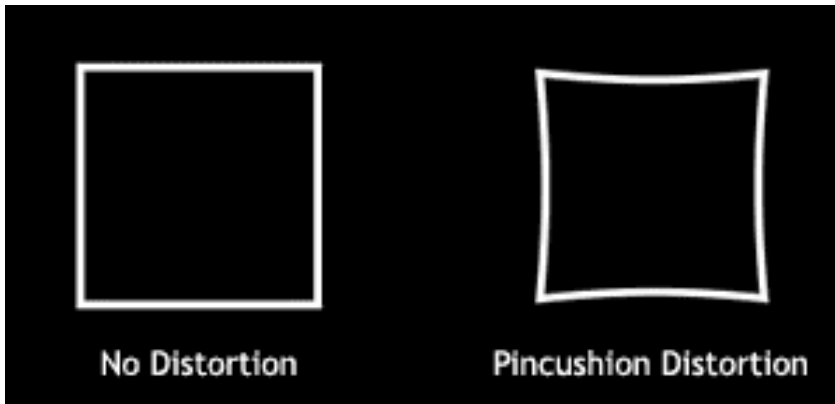
$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} A & B \\ D & E \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix} + \begin{pmatrix} C \\ F \end{pmatrix}$$

or

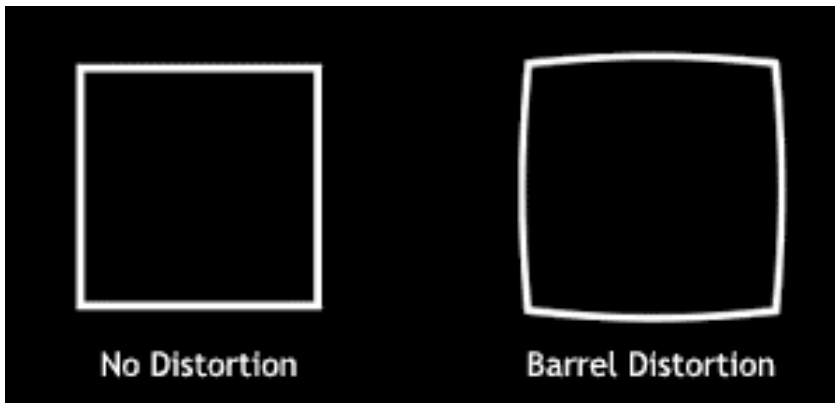
$$\begin{pmatrix} x' \\ y' \end{pmatrix} = \begin{pmatrix} A & B & C \\ D & E & F \end{pmatrix} \begin{pmatrix} x \\ y \\ 1 \end{pmatrix}$$

This is called *Affine Transform*.

# Radial Distortion



Example of Pincushion Distortion



Example of Barrel Distortion

# Pincushion Distortion

Pincushion distortion may be expressed by

$$\begin{cases} x' = x + K \cdot (x - x_0) \cdot \left\{ (x - x_0)^2 + (y - y_0)^2 \right\} \\ y' = y + K \cdot (y - y_0) \cdot \left\{ (x - x_0)^2 + (y - y_0)^2 \right\} \end{cases}$$

where  $x_0$ ,  $y_0$  are the image center,  $K$  is a constant factor to determine the degree of distortion.

# Pincushion Distortion

Input image



- Forward mapping
- $K = 0.000005$
- Median filter =  $5 \times 5$

Pincushion distortion



After median filtering



# Exercise 6

Referring to the equations of pincushion distortion, derive the equations for generating barrel distortion.

# Barrel Distortion

Input image

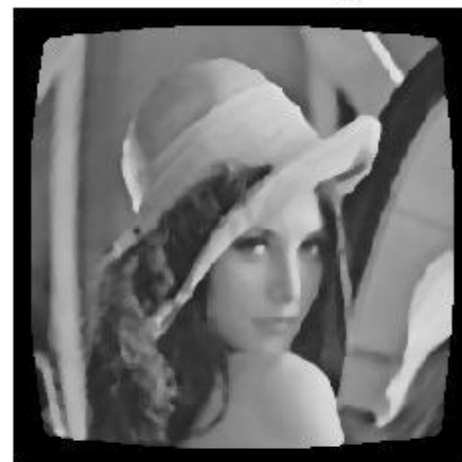


- Forward mapping
- $K = 0.000005$
- Median filter =  $5 \times 5$

Barrel distortion



After median filtering



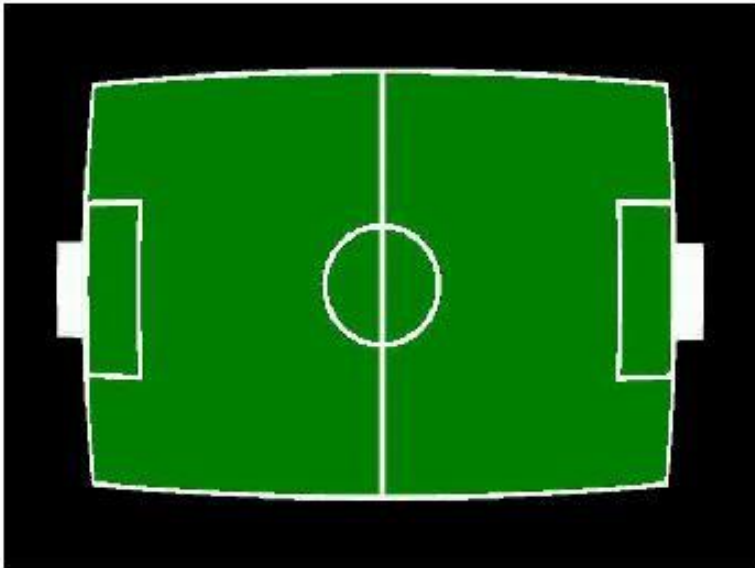


# Image Calibration

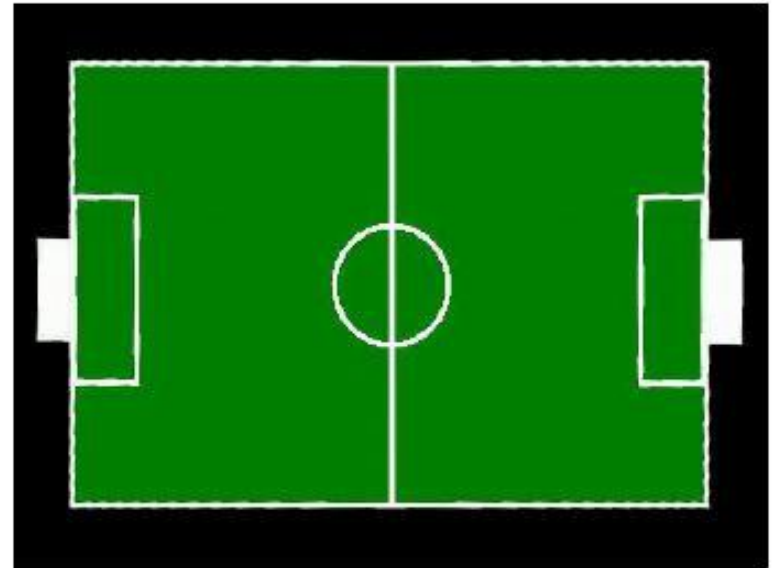
By adding a reverse distortion, an unwanted image distortion can be corrected.

- Reverse mapping
- $K = 0.000001$

Barrel-distorted soccer field



Calibrated soccer field

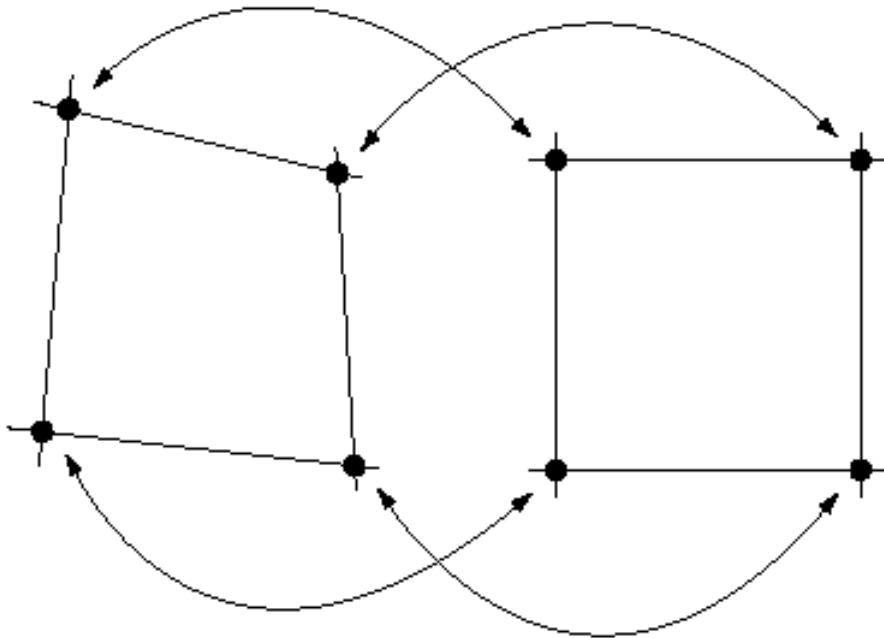


# Image Warping

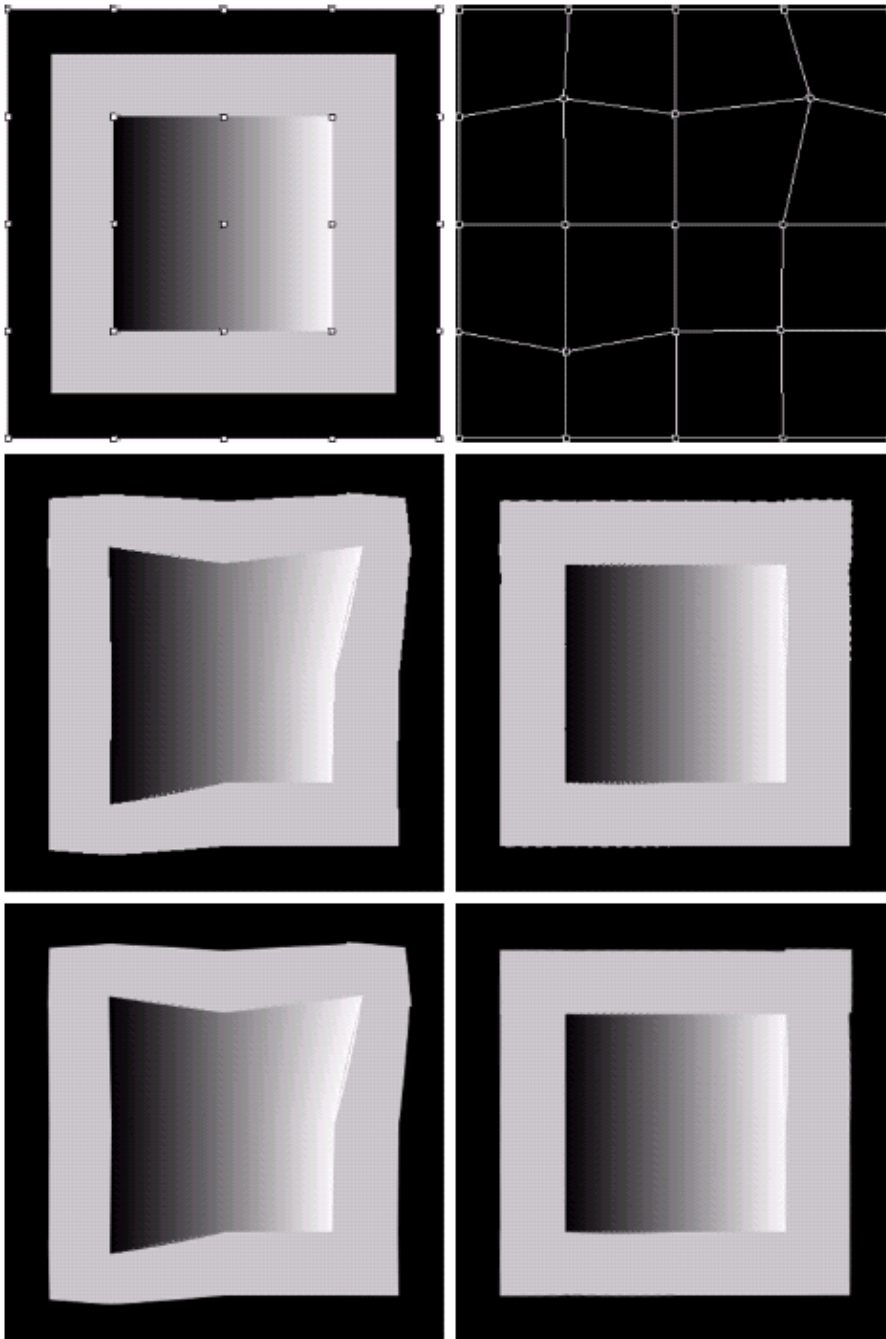
The mapping function for the warp of a quadrilateral region is given by

$$x' = c_1x + c_2y + c_3xy + c_4$$

$$y' = c_5x + c_6y + c_7xy + c_8$$



**FIGURE 5.32**  
Corresponding  
tiepoints in two  
image segments.



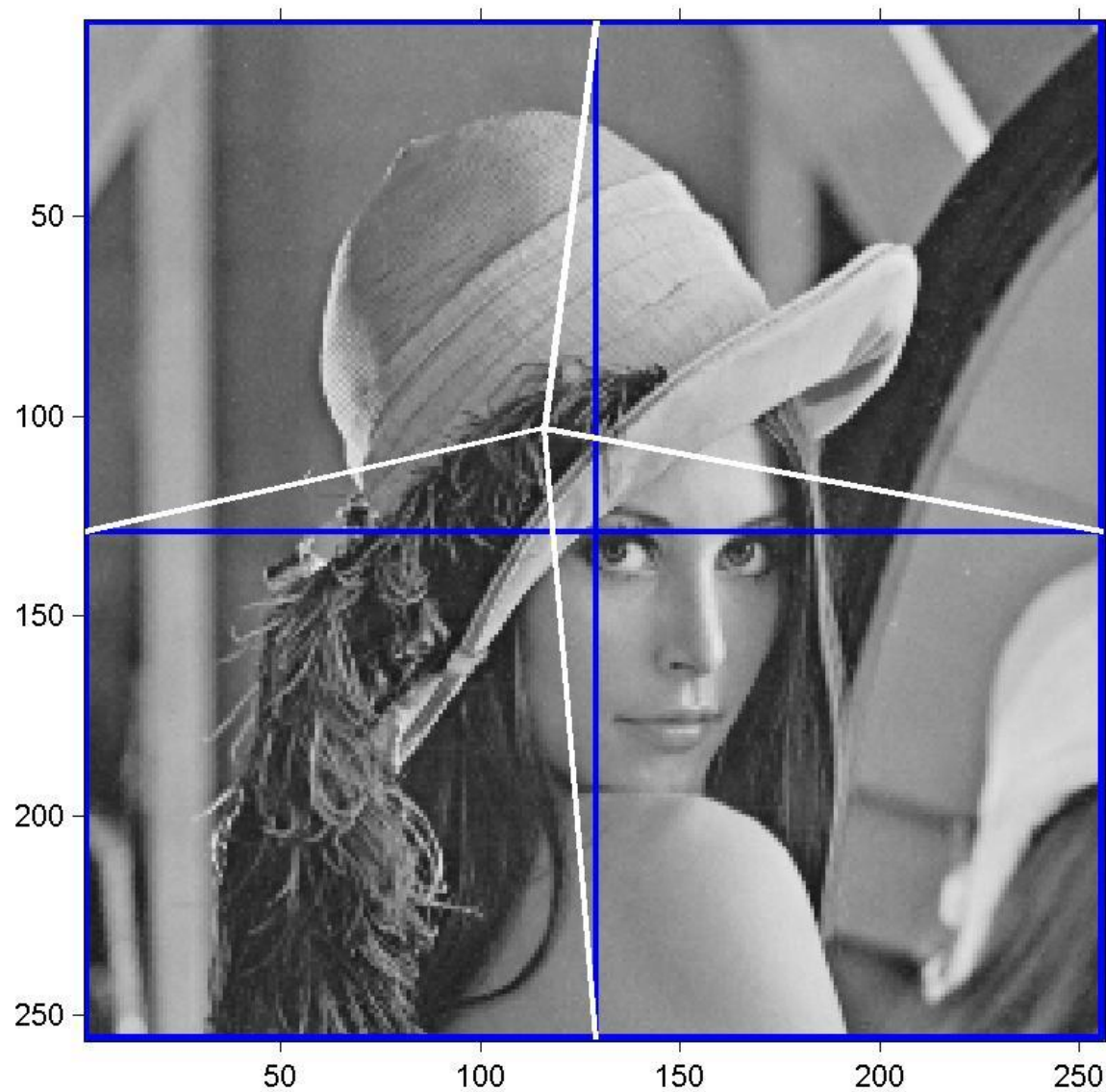
- (a) Image with control points.
- (b) Control points after distortion.
- (c) Distorted image, using NNI.
- (d) Restored image.
- (e) Distorted image, using BI.
- (f) Restored image.

## Exercise 7

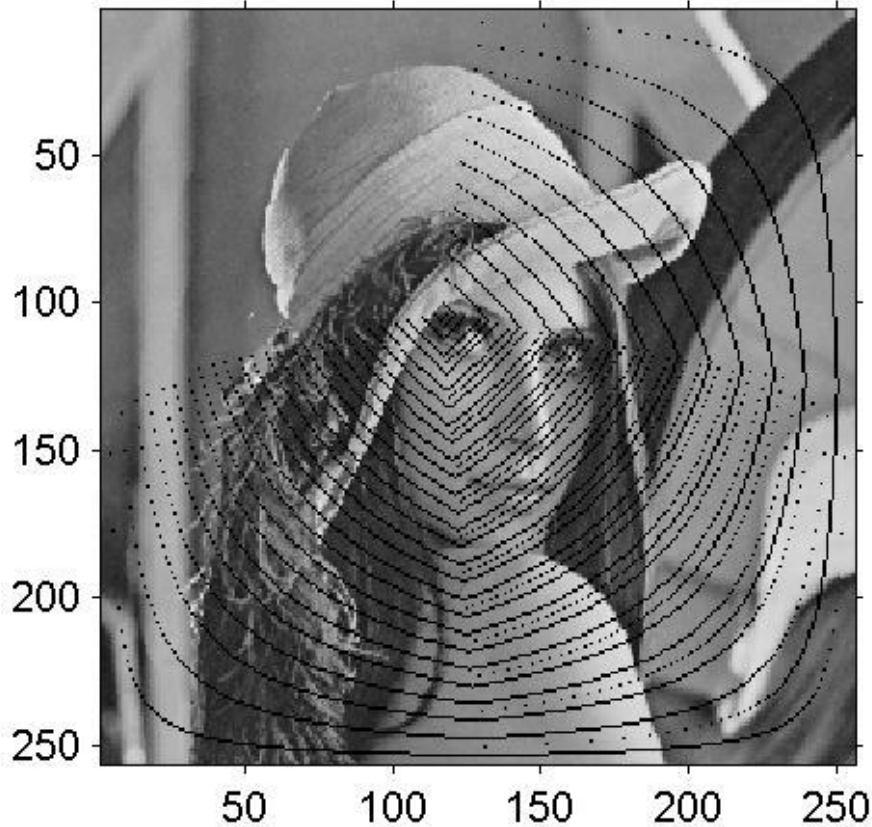
Assume that the coordinates  $(x,y)$  of four control points and their new coordinates  $(x',y')$  after distortion are known.

Obtain the coefficients  $c_1$  to  $c_8$  using least-squares method.

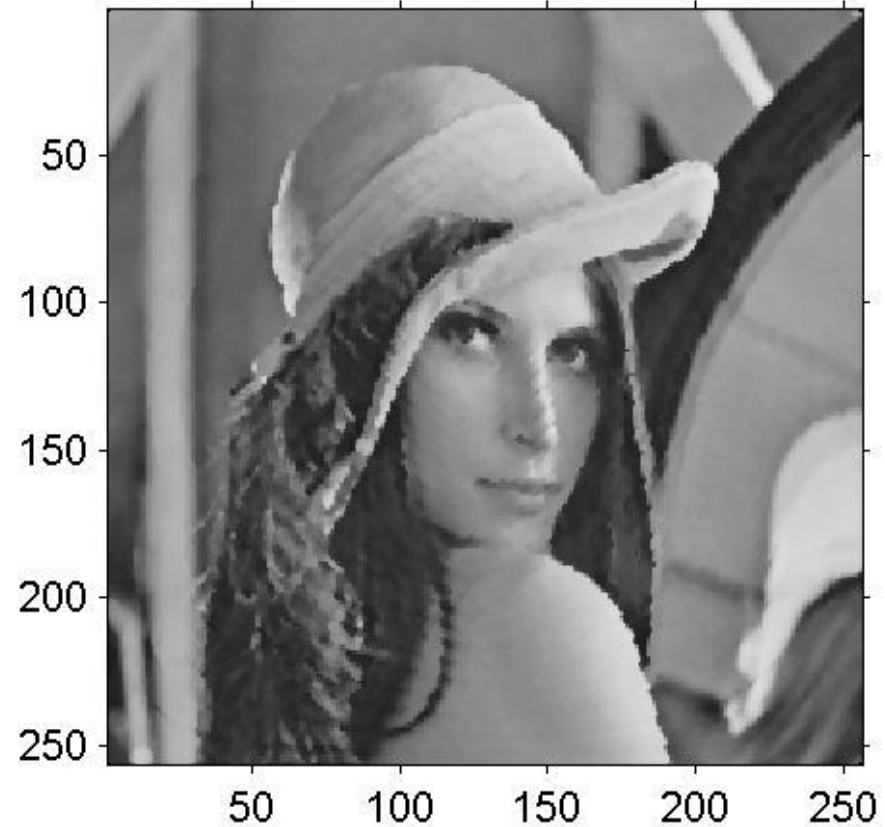
# Image Warping Demo



# Lena Image Warped by Forward Mapping



Before Median filtering



After Median filtering

# Assignment from Chapter 5

1. Generate two symmetrical facial images of yours. Show your own code.

Setting this option recommended:

```
>> iptsetpref('ImshowAxesVisible','on') )
```

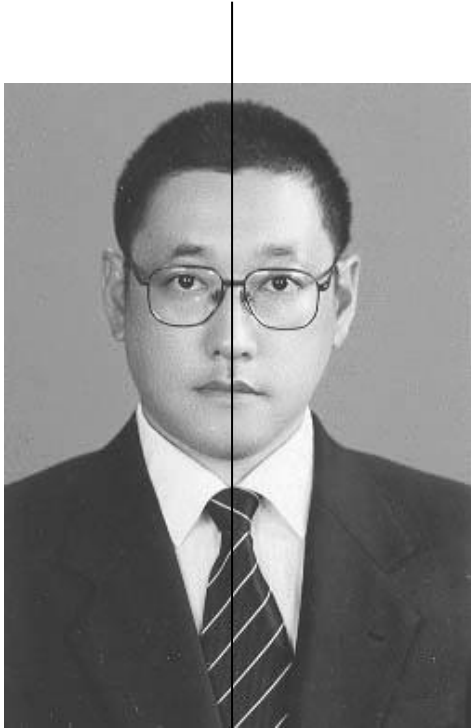
2. Rotate (or resize) one of the symmetrical facial image by an arbitrary angle (or magnification rate,  $M$ ) using NNI and BI methods. Discuss the differences between two resultant images.

```
>> buf1=imrotate(img,30,'nearest or bilinear');
```

```
>> buf2=imresize(img,M,'nearest or bilinear');
```

# Symmetrical Facial Images

Symmetric axis



Input image



Symmetrical  
image 1



Symmetrical  
image 2