

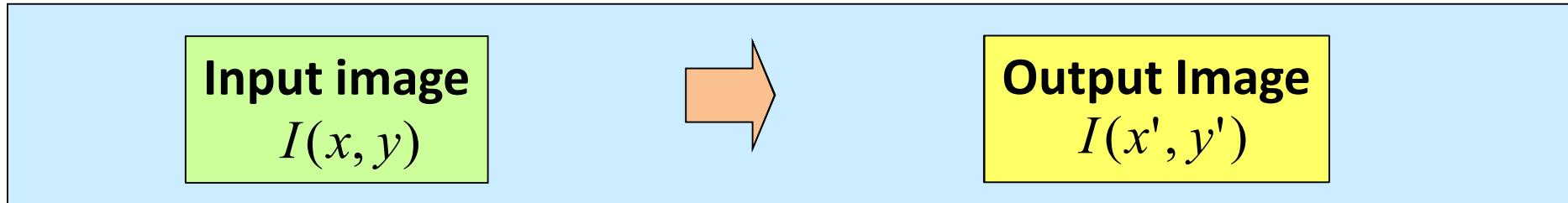


Mahidol University *Wisdom of the Land*

# Chapter 5

## Geometric Transformation

# Geometric Transformation

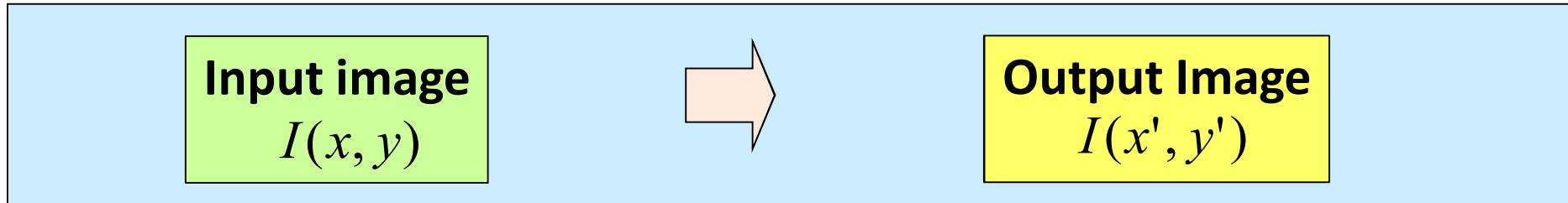


**Geometric transformation :**  
this is the basic process for  
image processing involves  
transforming the positions  
of pixels in an image.

**Geometric transformation operations :**

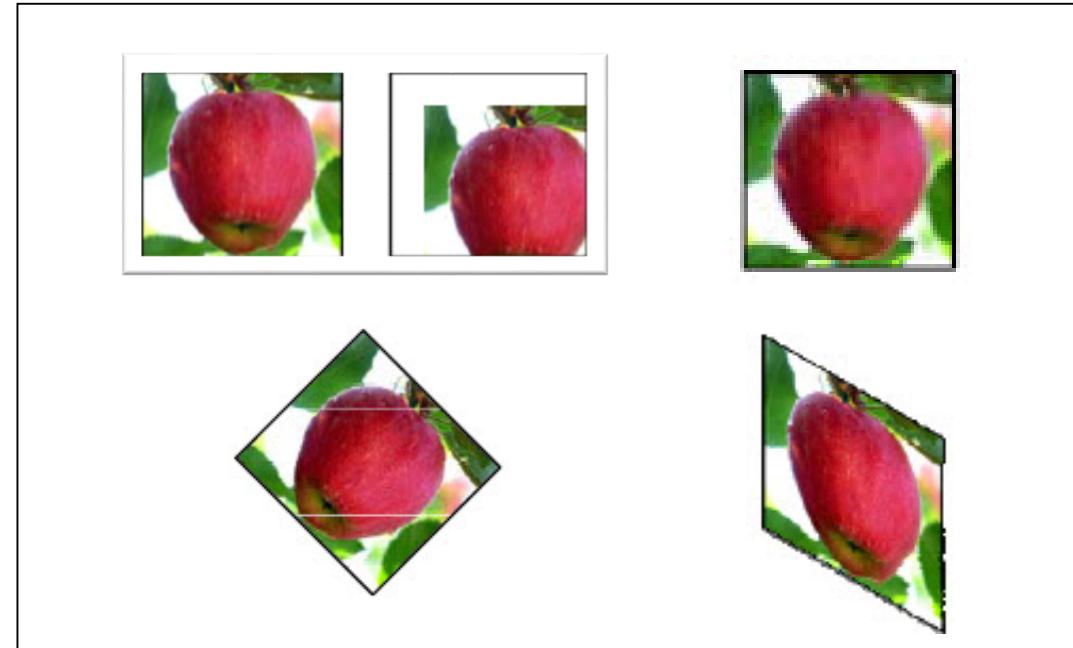
- a) Translation
- b) Scaling
- c) Rotation
- d) Shearing

# Geometric Transformation

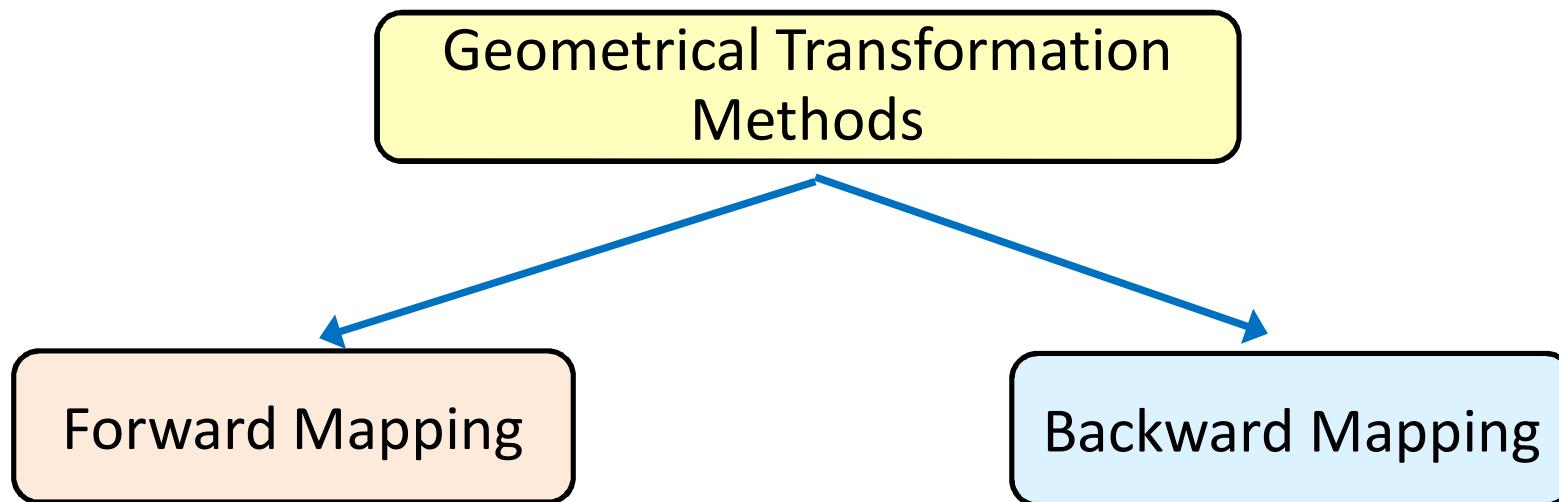


Geometric transformation operations :

- a) Translation
- b) Scaling
- c) Rotation
- d) Shearing



# Geometric Transformation



# Geometric Transformation Parameters

- Forward Mapping
- The forward mapping is the process of iterate mappings over each pixel in an input image, transforms new coordinates for each pixel, and assigns its value to the new position in an output image.

Forward mapping has two major problems :

- The first problem of forward mapping process is two or more different pixels within the input image can be transformed into the same pixel in the output image, bring into question of how to combine multiple input pixel values into a single output pixel value.
- The second problem is some output pixels may not be assigned. This leads to holes where no value is assigned to a pixel in the output image.

# Geometric Transformation Parameters

- Forward Mapping

Translation



$$\begin{aligned}x' &= x + T_x \\y' &= y + T_y\end{aligned}$$

Scaling



$$\begin{aligned}x' &= x.S_x \\y' &= y.S_y\end{aligned}$$

Rotation



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

Shearing



$$\begin{aligned}x' &= x + y.Sh_x \\y' &= y + x.Sh_y\end{aligned}$$

# Geometric Transformation Parameters

- Backward Mapping
- The backward mapping is the process of iterate mappings over each pixel in the input image, and applies the inverse transformation to assign the position within the input image from which a value must be sampled.
- Although, the assigned coordinates may not be integers and may not lie in the bounds of the output image. However, the output image has no holes.

# Geometric Transformation Parameters

## ■ Backward Mapping

Translation



$$x' = x - T_x$$
$$y' = y - T_y$$

Scaling



$$x' = x \cdot (1 / S_x)$$
$$y' = y \cdot (1 / S_y)$$

Rotation



$$x' = x \cdot \cos \theta + y \cdot \sin \theta$$
$$y' = -x \cdot \sin \theta + y \cdot \cos \theta$$

Shearing



$$x' = x + y \cdot (1 / Sh_x)$$
$$y' = y + x \cdot (1 / Sh_y)$$

# Translation

- In order to translate image  $I(x, y)$  to image  $I(x', y')$  involves translating the position of original pixel to a new place by adding some offset  $T_x$  to all the x-coordinates, and adding some offset  $T_y$  to all the y-coordinates.

Translation



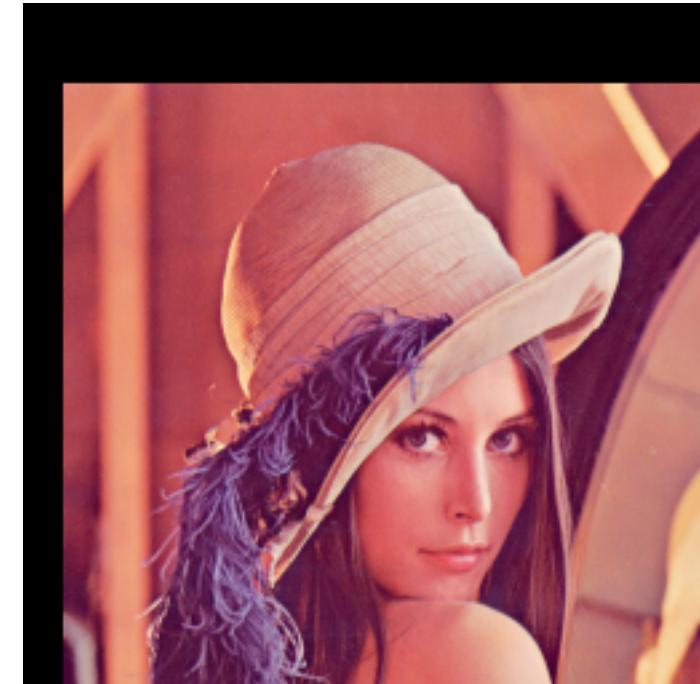
$$x' = x - T_x$$
$$y' = y - T_y$$

- This will shift the original image right  $T_x$  and down  $T_y$ .
- Use to keep an object of interest in the middle.

# Example: Translation



Original image



Translated image with  $T_x = 30$ ,  
 $T_y = 60$  using zero padding

- In order to scale image  $I(x, y)$  to image  $I(x', y')$  involves shrinking or stretching the position of original pixel by the x-coordinate is shrink or stretch  $S_x$  times and the y-coordinate is shrink or stretch  $S_y$  times.

Scaling



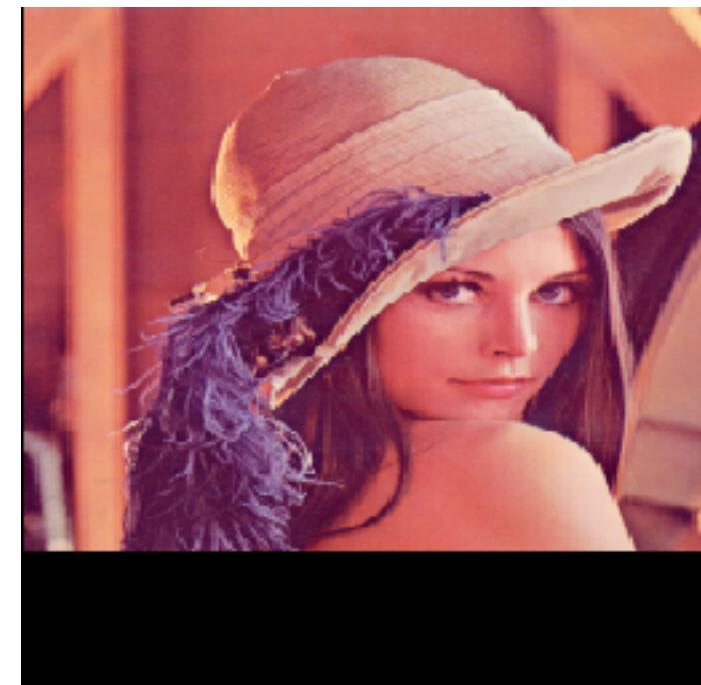
$$x' = x \cdot (1/S_x)$$
$$y' = y \cdot (1/S_y)$$

- This will shrink or stretch the original image by  $S_x$  and  $S_y$ .
- Use to zoom-out or zoom-in on the object of interest without changing size of output image.

# Example: Scaling



Original image



Scaled image with  $S_x = 1.2$ ,  
 $S_y = 0.8$  using zero padding

# Rotation

- In order to rotate image  $I(x, y)$  around the origin  $(0,0)$  to image  $I(x', y')$  involves rotating the position of original pixel to a new place by some angle  $\theta$ .

Rotation



$$\begin{aligned}x' &= x \cdot \cos \theta + y \cdot \sin \theta \\y' &= -x \cdot \sin \theta + y \cdot \cos \theta\end{aligned}$$

- This will rotate image clockwise by  $\theta$  angles.
- Used to correct orient the object of interest within image.

# Example: Rotation



Original image



Rotated image with  $\theta = 5$   
using zero padding

# Shearing

- In order to shear image  $I(x, y)$  to image  $I(x', y')$  involves tilting image in the x-coordinate with ratio  $Sh_x$  and tilting image in the y-coordinate with ratio  $Sh_y$ .

Shearing



$$x' = x + y \cdot (1 / Sh_x)$$

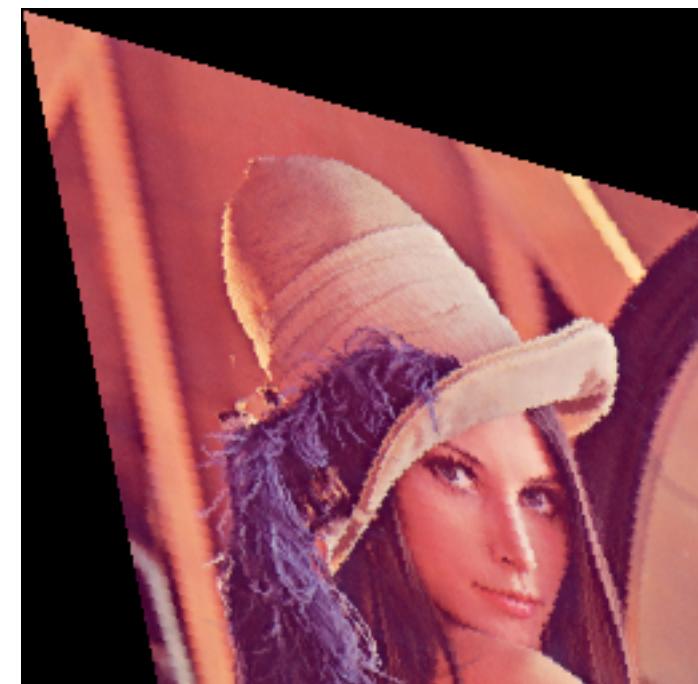
$$y' = y + x \cdot (1 / Sh_y)$$

- This will shear image in X and Y directions.
- Used to correct image distortions.

# Example: Shearing

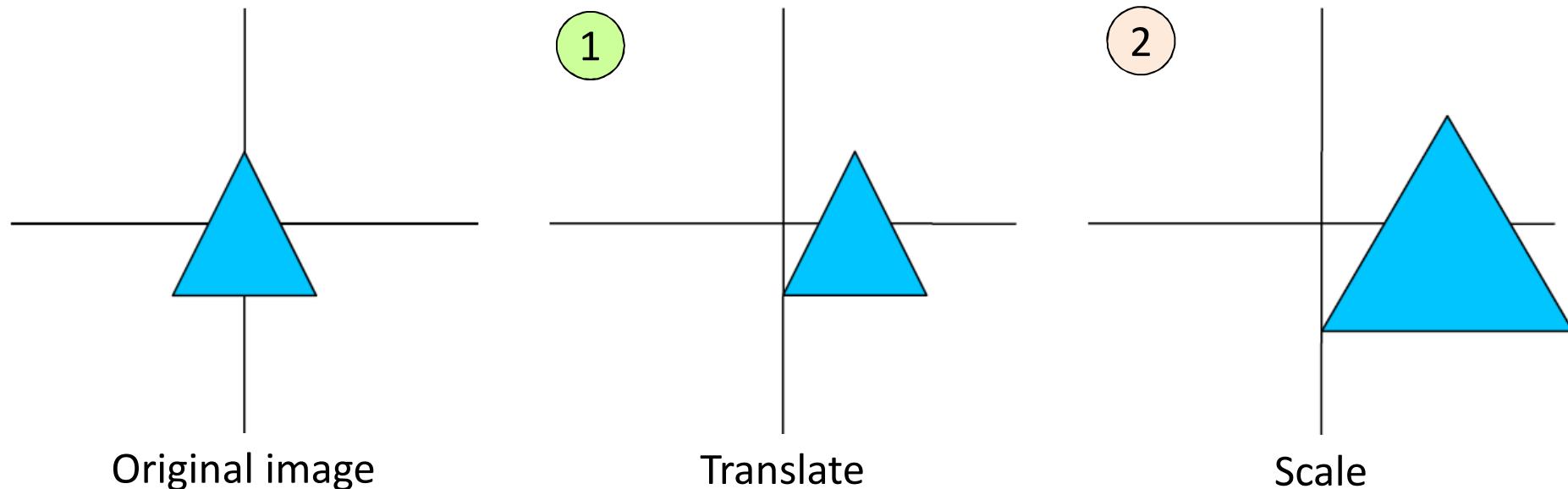
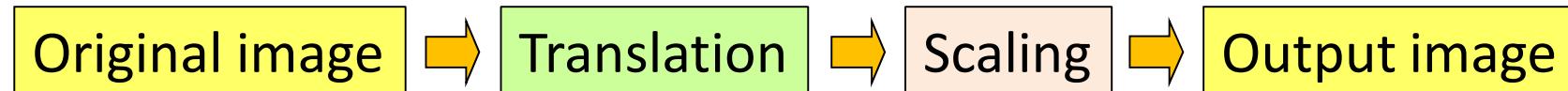


Original image



Sheared image with  $Sh_x = 0.2$ ,  
 $Sh_y = 0.3$  using zero padding

# Combined Geometric Transformation Operations



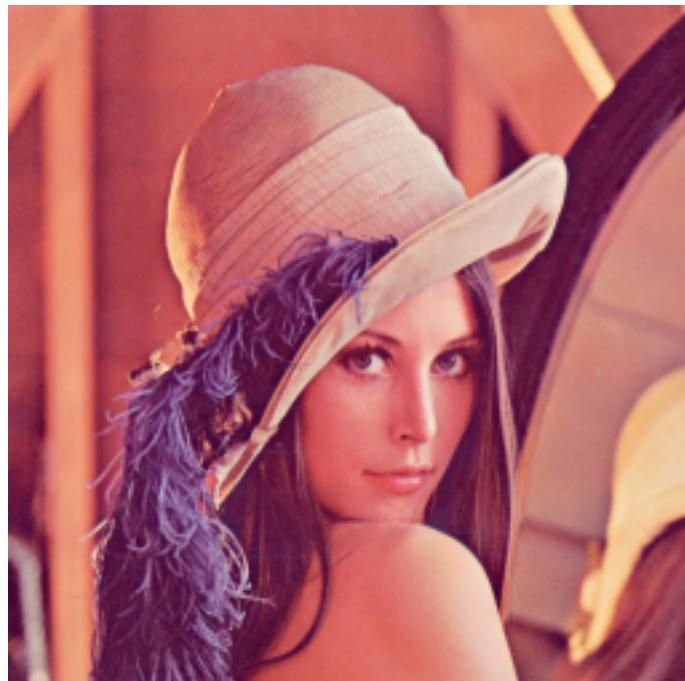
Translation then Scaling



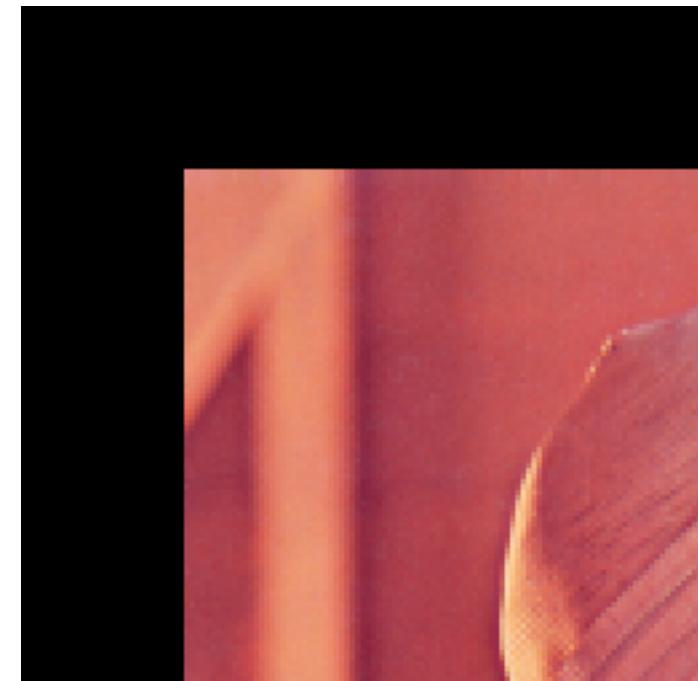
$$x' = (x - T_x) / S_x$$
$$y' = (y - T_y) / S_y$$

# Example: Combined Geometric Transformation Operations

Method1 : Translation then Scaling

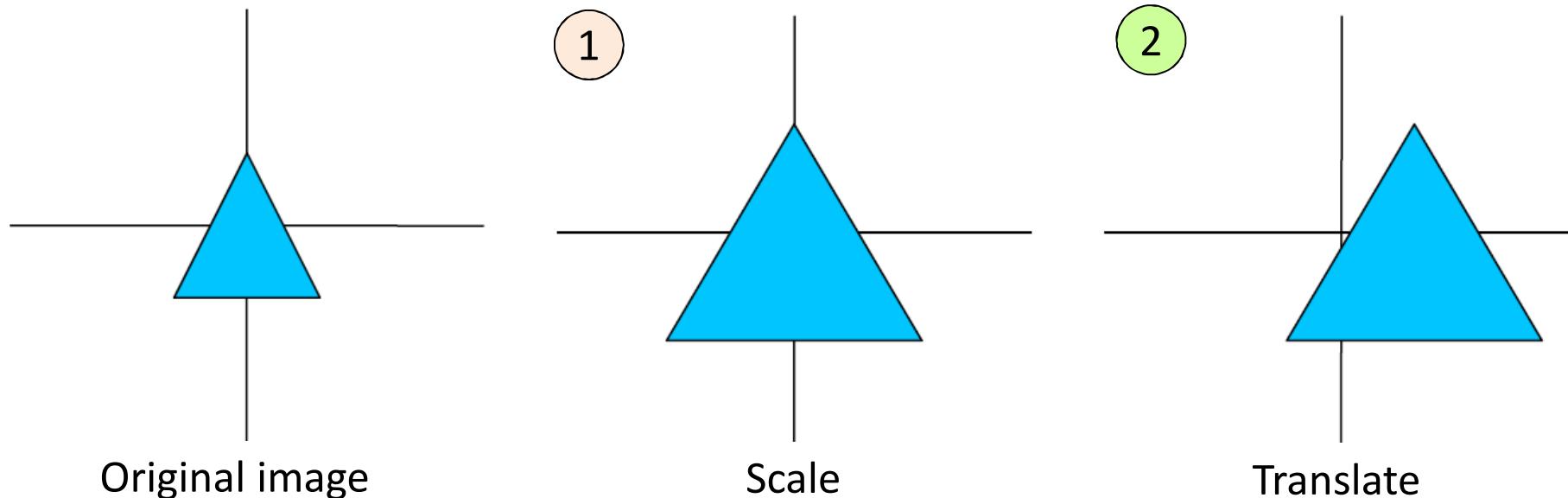
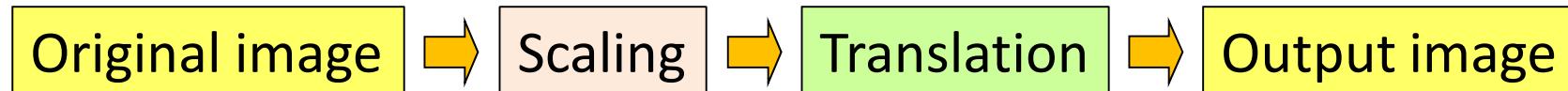


Original image



The resulted image with  $T_x = 20$ ,  
 $T_y = 20$ ,  $S_x = 2$ , and  $S_y = 2$

# Combined Geometric Transformation Operations



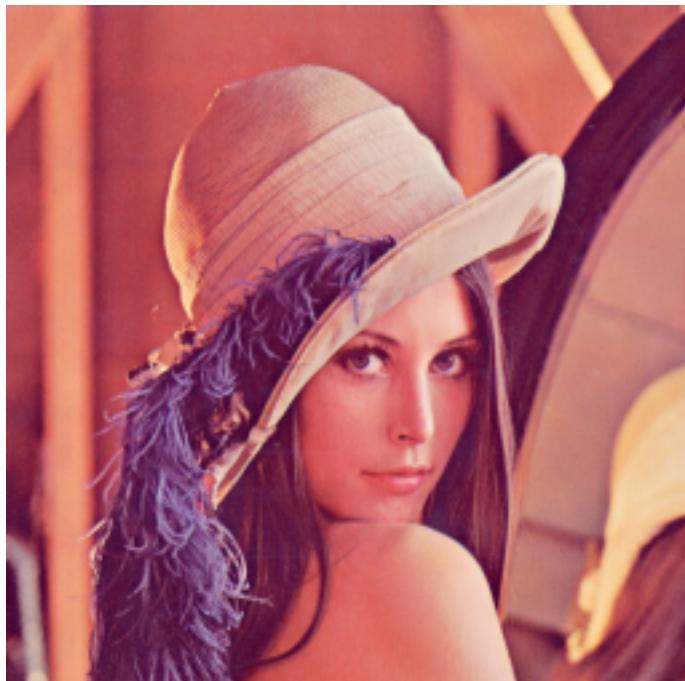
Scaling then Translation



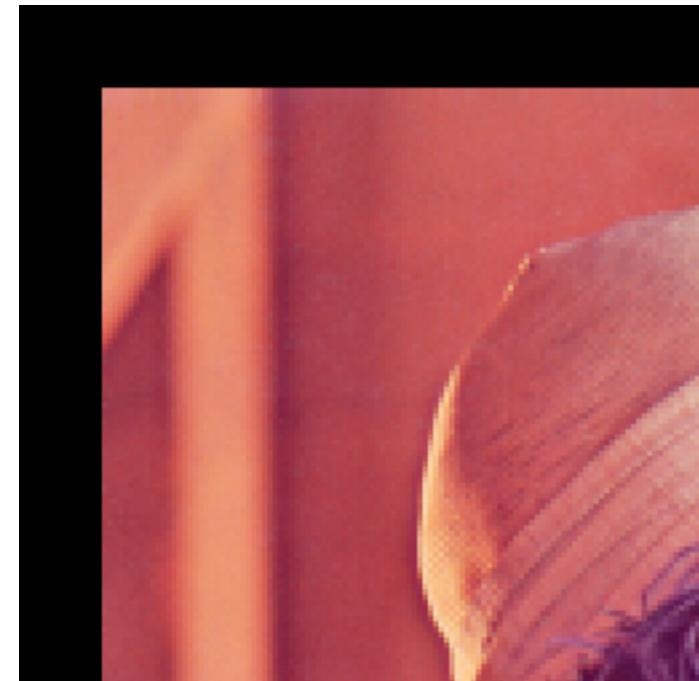
$$x' = (x / S_x) - T_x$$
$$y' = (y / S_y) - T_y$$

# Example: Combined Geometric Transformation Operations

Method2 : Scaling then Translation



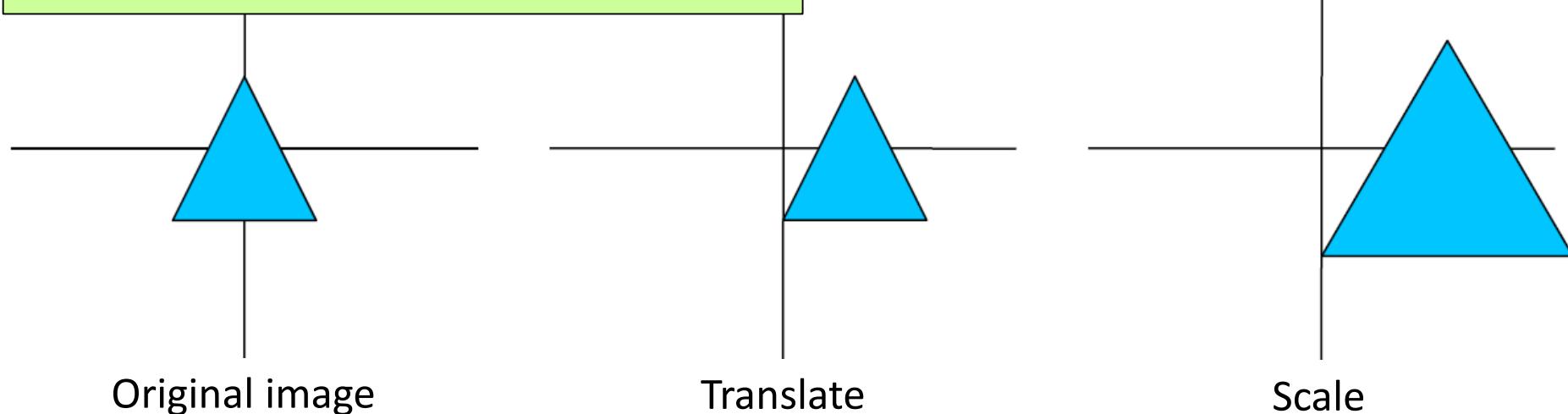
Original image



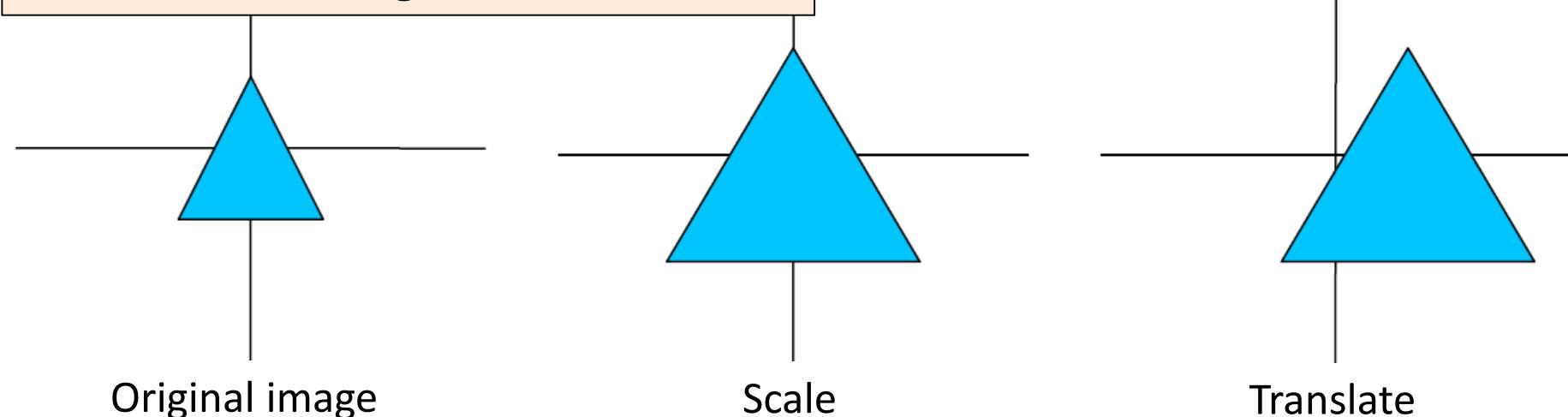
The resulted image with  $S_x = 2$ ,  
 $S_y = 2$ ,  $T_x = 20$ , and  $T_y = 20$

# Combined Geometric Transformation Operations

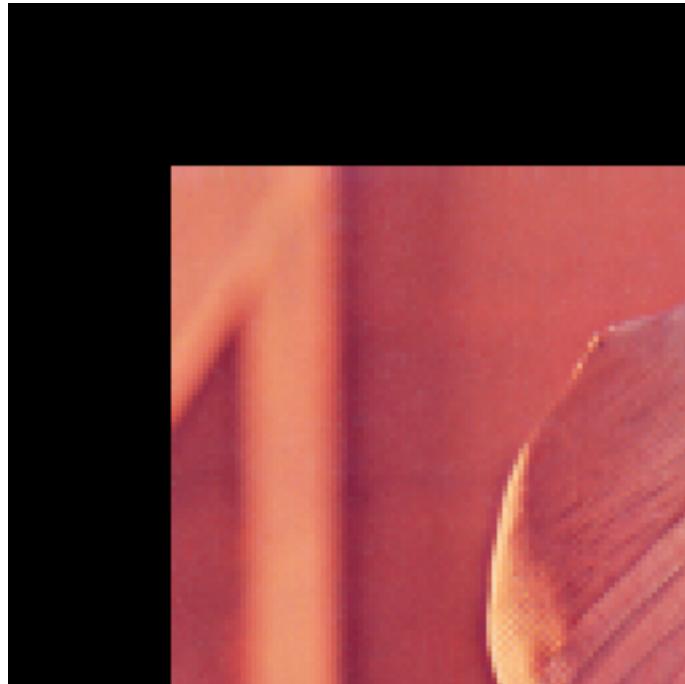
## Method1 : Translation then Scaling



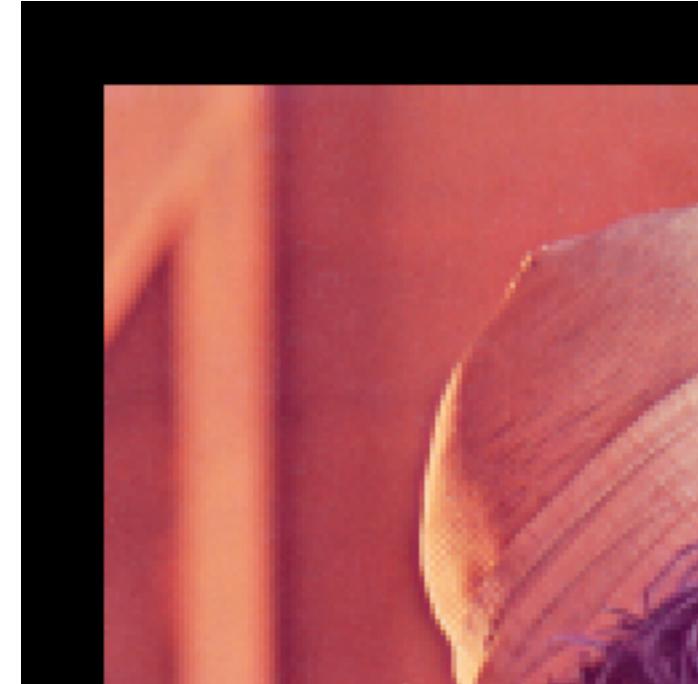
## Method2 : Scaling then Translation



# Example: Combined Geometric Transformation Operations

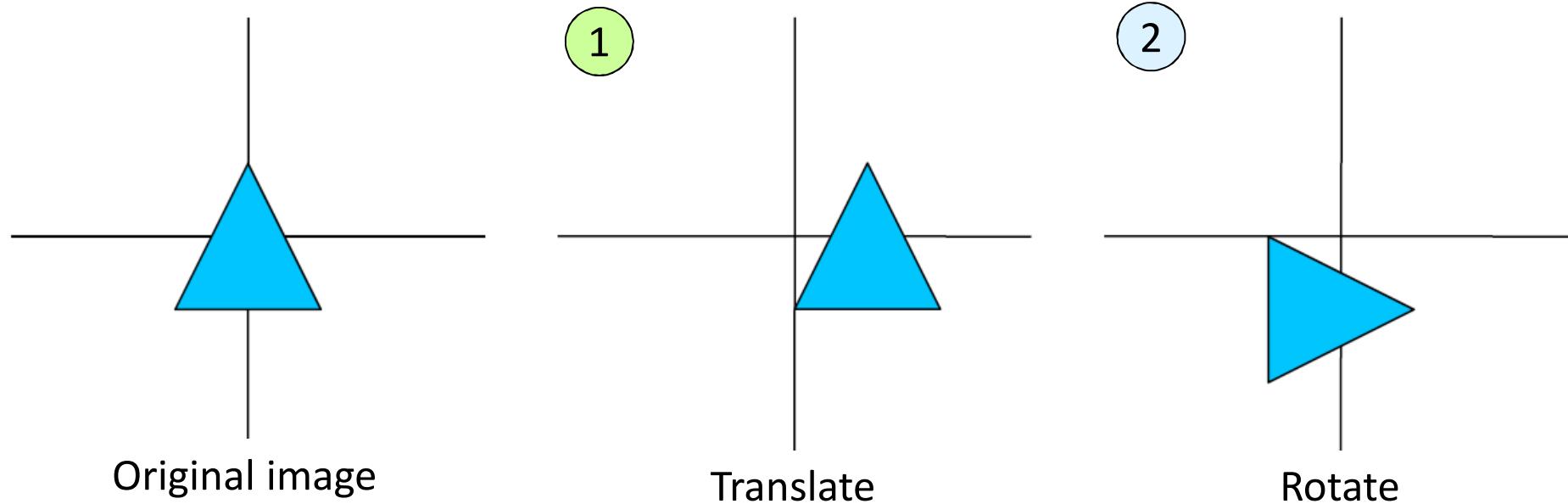


Method1  
Translation then Scaling



Method2  
Scaling then Translation

# Combined Geometric Transformation Operations

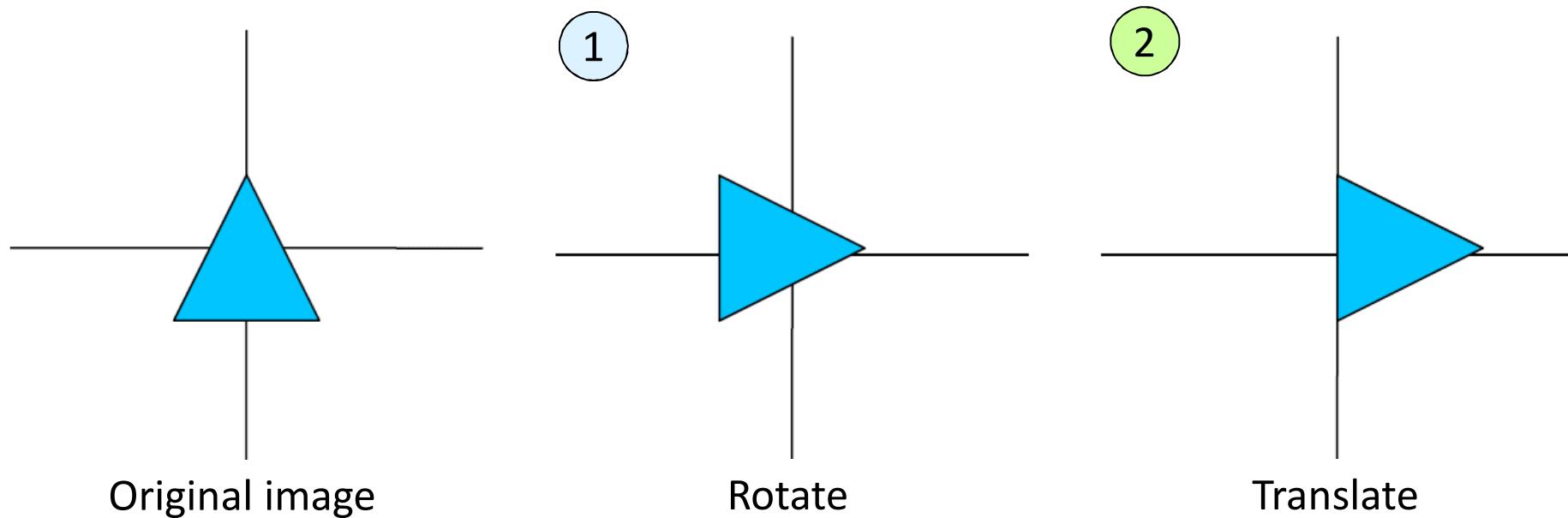
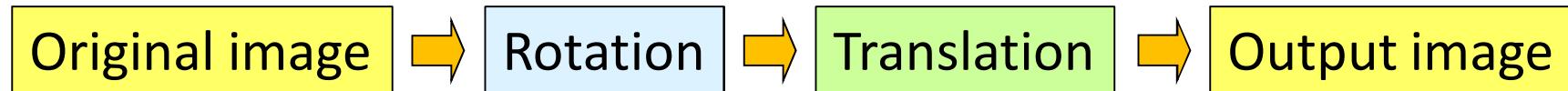


Translation then Rotation



$$x' = (x - T_x) \cdot \cos \theta - (y - T_y) \cdot \sin \theta$$
$$y' = (x - T_x) \cdot \sin \theta + (y - T_y) \cdot \cos \theta$$

# Combined Geometric Transformation Operations



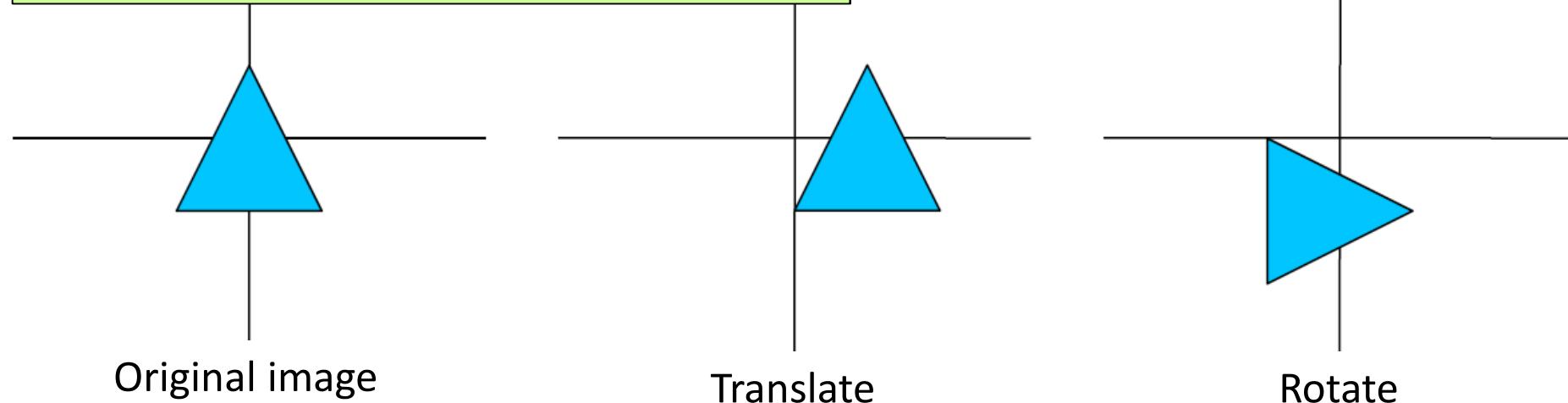
Rotation then Translation



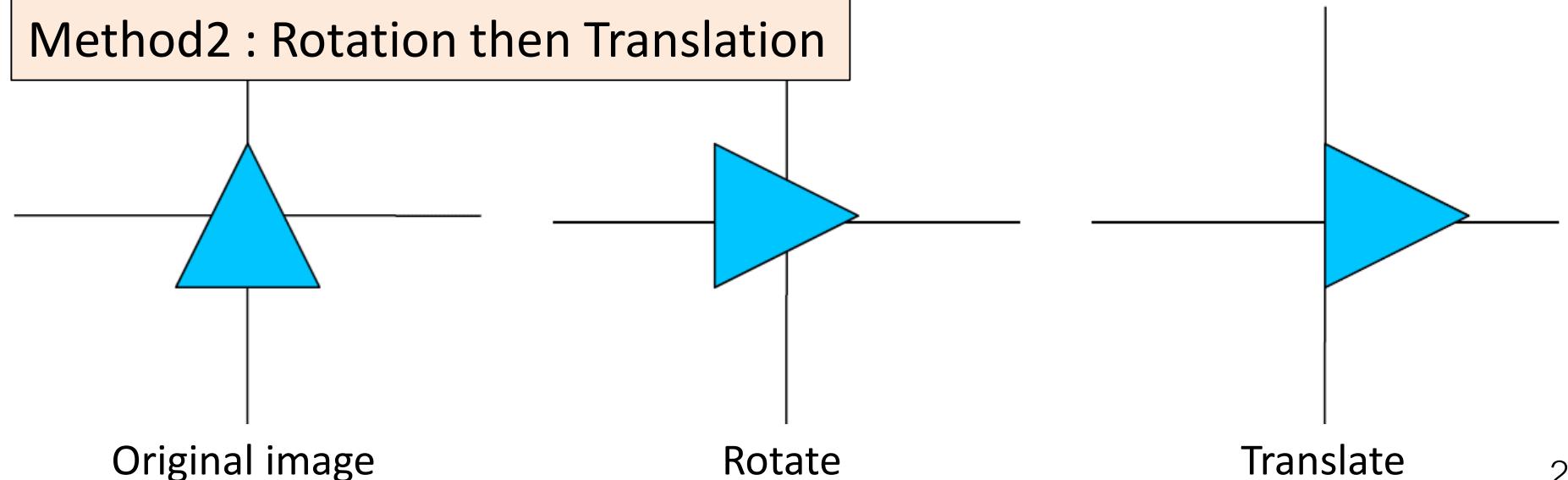
$$\begin{aligned}x' &= (x \cdot \cos \theta - y \cdot \sin \theta) - T_x \\y' &= (x \cdot \sin \theta + y \cdot \cos \theta) - T_y\end{aligned}$$

# Combined Geometric Transformation Operations

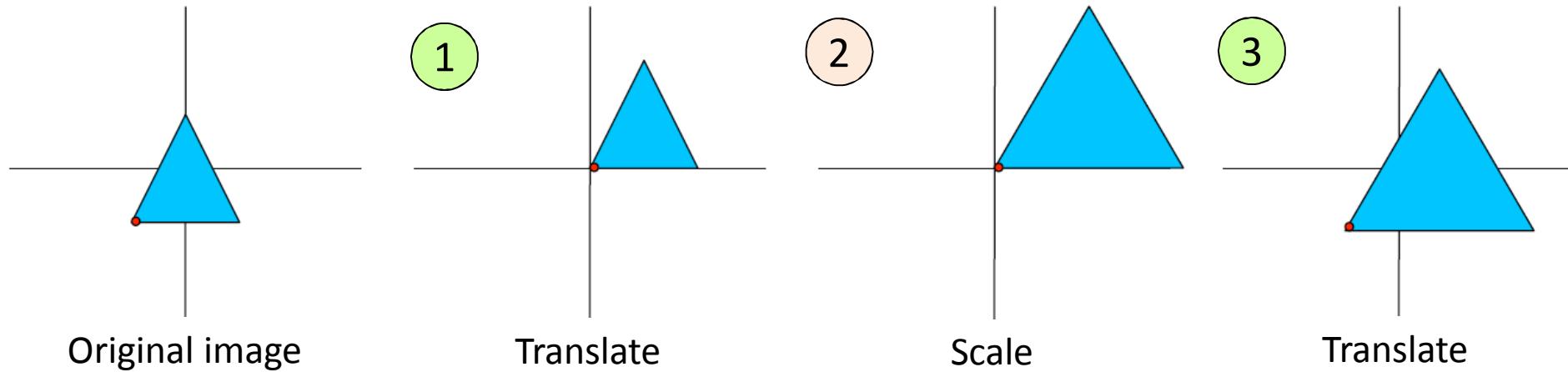
Method1 : Translation then Rotation



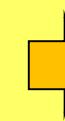
Method2 : Rotation then Translation



# Combined Geometric Transformation Operations

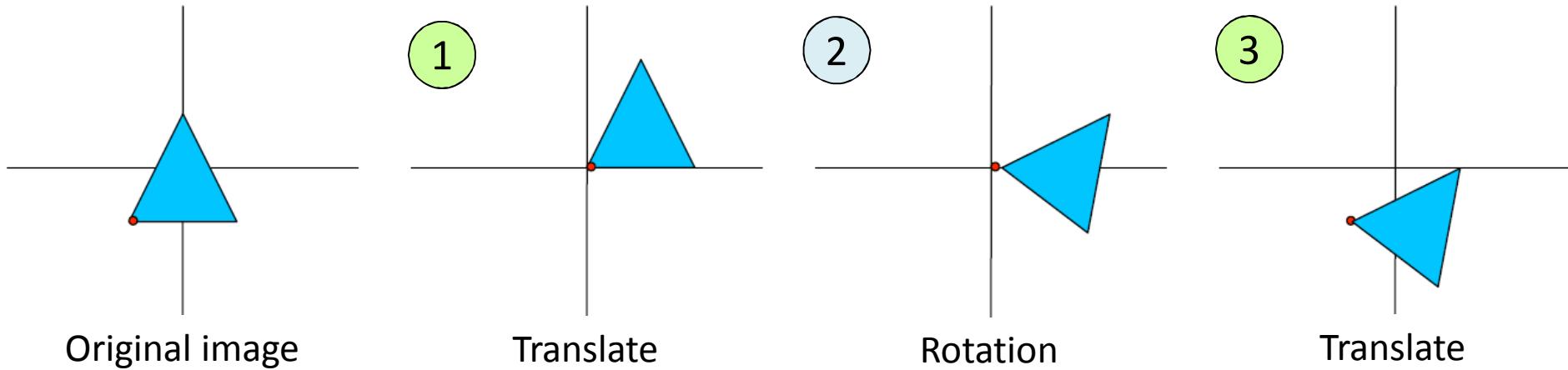


1) Translation 2) Scaling 3) Translation



$$x' = ((x - T_x) / S_x) + T_x$$
$$y' = ((y - T_y) / S_y) + T_y$$

# Combined Geometric Transformation Operations



1) Translation 2) Rotation 3) Translation :

$$x' = ((x - T_x) \cdot \cos \theta - (y - T_y) \cdot \sin \theta) + T_x$$

$$y' = ((x - T_x) \cdot \sin \theta + (y - T_y) \cdot \cos \theta) + T_y$$

# Combined Geometric Transformation Operations

- Geometric transformation operations can be performed using Homogeneous coordinates and multiplication of 3x3 affine matrices:

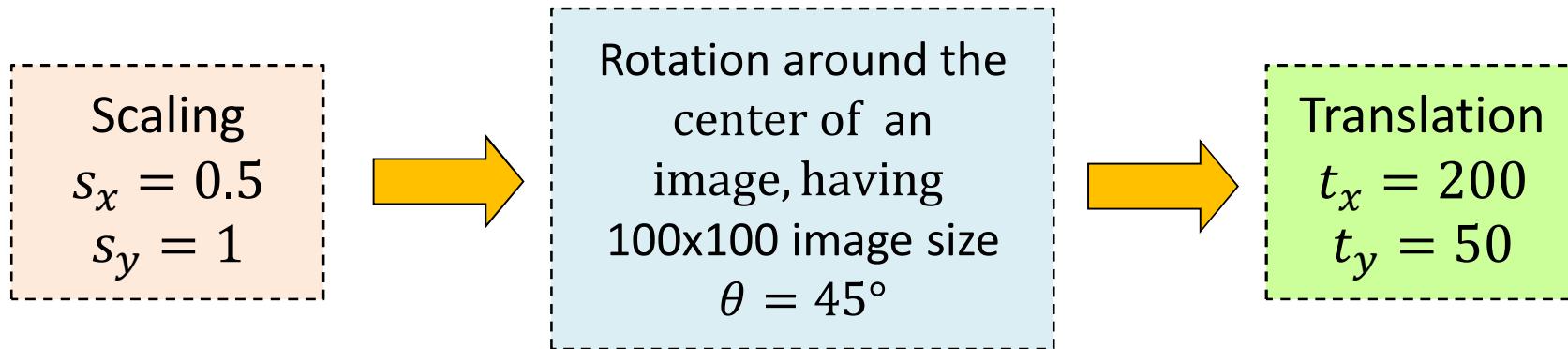
Translation	$x' = x + T_x$ $y' = y + T_y$	$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & T_x \\ 0 & 1 & T_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$
Scaling	$x' = x.S_x$ $y' = y.S_y$	$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} S_x & 0 & 0 \\ 0 & S_y & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$
Rotation	$x' = x.\cos\theta - y.\sin\theta$ $y' = x.\sin\theta + y.\cos\theta$	$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} \cos\theta & -\sin\theta & 0 \\ \sin\theta & \cos\theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$
Shearing	$x' = x + y.Sh_x$ $y' = y + x.Sh_y$	$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & Sh_x & 0 \\ Sh_y & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$

# Combined Geometric Transformation Operations

Translation	$x = x' - T_x$	$y = y' - T_y$	$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & T_x \\ 0 & 1 & T_y \\ 0 & 0 & 1 \end{bmatrix}^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$
Scaling	$x = x'.(1 / S_x)$	$y = y'.(1 / S_y)$	$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} S_x & 0 & 0 \\ 0 & S_y & 0 \\ 0 & 0 & 1 \end{bmatrix}^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$
Rotation	$x = x'.\cos\theta + y'.\sin\theta$	$y = -x'.\sin\theta + y'.\cos\theta$	$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} \cos\theta & -\sin\theta & 0 \\ \sin\theta & \cos\theta & 0 \\ 0 & 0 & 1 \end{bmatrix}^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$
Shearing	$x = x' + y'.(1 / Sh_x)$	$y = y' + x'.(1 / Sh_y)$	$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & Sh_x & 0 \\ Sh_y & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$

# Example : Combined Geometric Operations

- Example : If we have a sequence to transform image below.



$$S = \begin{bmatrix} s_x & 0 & 0 \\ 0 & s_y & 0 \\ 0 & 0 & 1 \end{bmatrix} \quad R_c = \begin{bmatrix} \cos\theta & -\sin\theta & (-x_c \cos\theta + y_c \sin\theta + x_c) \\ \sin\theta & \cos\theta & (-x_c \sin\theta - y_c \cos\theta + y_c) \\ 0 & 0 & 1 \end{bmatrix} \quad T_r = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix}$$

$$\text{Map} = T_r \cdot R_c \cdot S = \begin{bmatrix} a_0 & a_1 & a_2 \\ b_0 & b_1 & b_2 \\ 0 & 0 & 1 \end{bmatrix}$$

# Example : Combined Geometric Operations

$$S = \begin{bmatrix} 0.5 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

$$R_c = \begin{bmatrix} \cos 45^\circ & -\sin 45^\circ & (-50 \cos 45^\circ + 50 \sin 45^\circ + 50) \\ \sin 45^\circ & \cos 45^\circ & (-50 \sin 45^\circ - 50 \cos 45^\circ + 50) \\ 0 & 0 & 1 \end{bmatrix}$$

$$R_c = \begin{bmatrix} 0.707 & -0.707 & 50 \\ 0.707 & 0.707 & -20.7 \\ 0 & 0 & 1 \end{bmatrix}$$

$$Tr = \begin{bmatrix} 1 & 0 & 200 \\ 0 & 1 & 50 \\ 0 & 0 & 1 \end{bmatrix}$$

# Example : Combined Geometric Operations

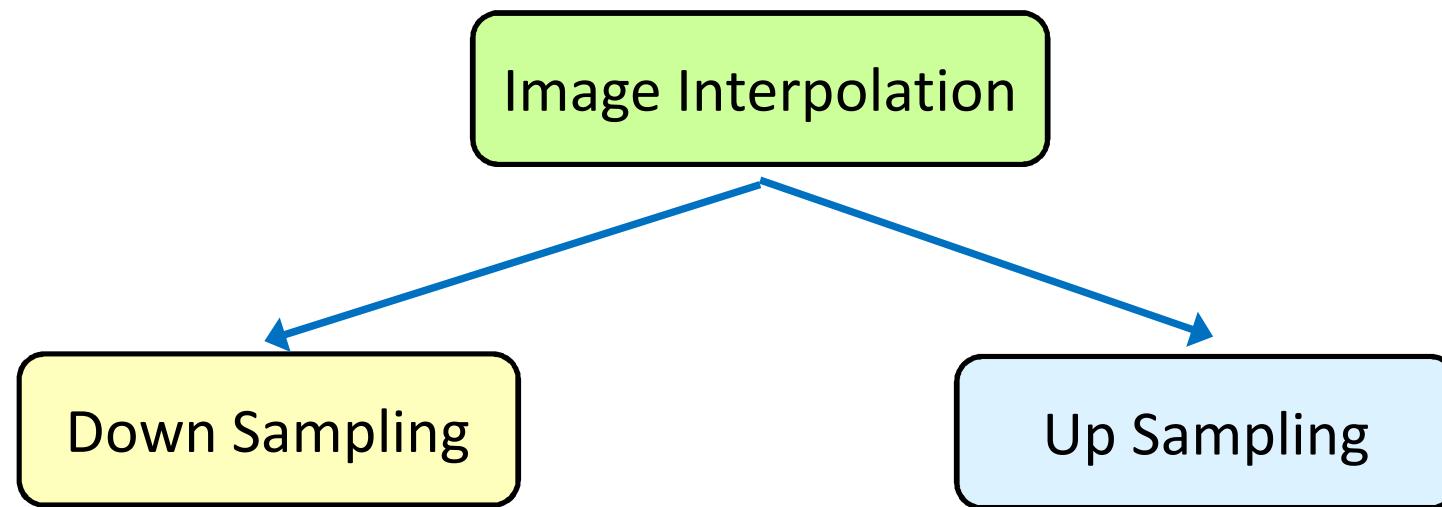
$$Rc \cdot S = \begin{bmatrix} 0.707 & -0.707 & 50 \\ 0.707 & 0.707 & -20.7 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 0.5 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} = \begin{bmatrix} 0.3535 & -0.707 & 50 \\ 0.3535 & 0.707 & -20.7 \\ 0 & 0 & 1 \end{bmatrix}$$

$$Map = Tr \cdot Rc \cdot S = \begin{bmatrix} 1 & 0 & 200 \\ 0 & 1 & 50 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 0.3535 & -0.707 & 50 \\ 0.3535 & 0.707 & -20.7 \\ 0 & 0 & 1 \end{bmatrix}$$

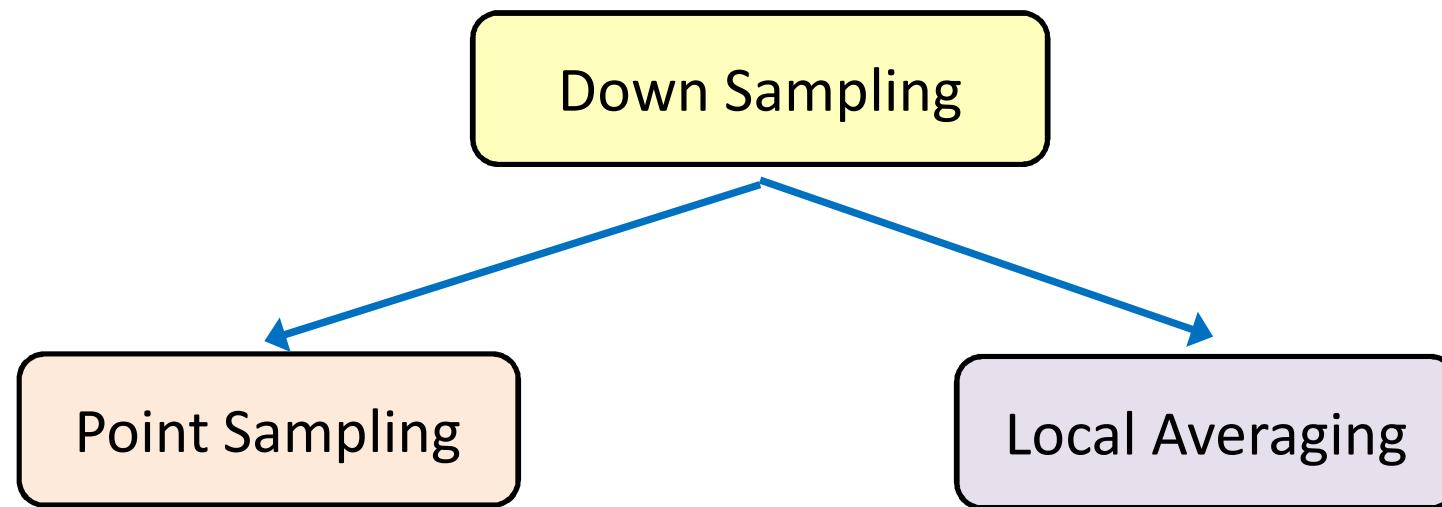
$$Map = Tr \cdot Rc \cdot S = \begin{bmatrix} 0.3535 & -0.707 & 250 \\ 0.3535 & 0.707 & 29.3 \\ 0 & 0 & 1 \end{bmatrix} = \begin{bmatrix} a_0 & a_1 & a_2 \\ b_0 & b_1 & b_2 \\ 0 & 0 & 1 \end{bmatrix}$$

$Tr \cdot Rc \cdot S \neq S \cdot Rc \cdot Tr$

# Image Interpolation

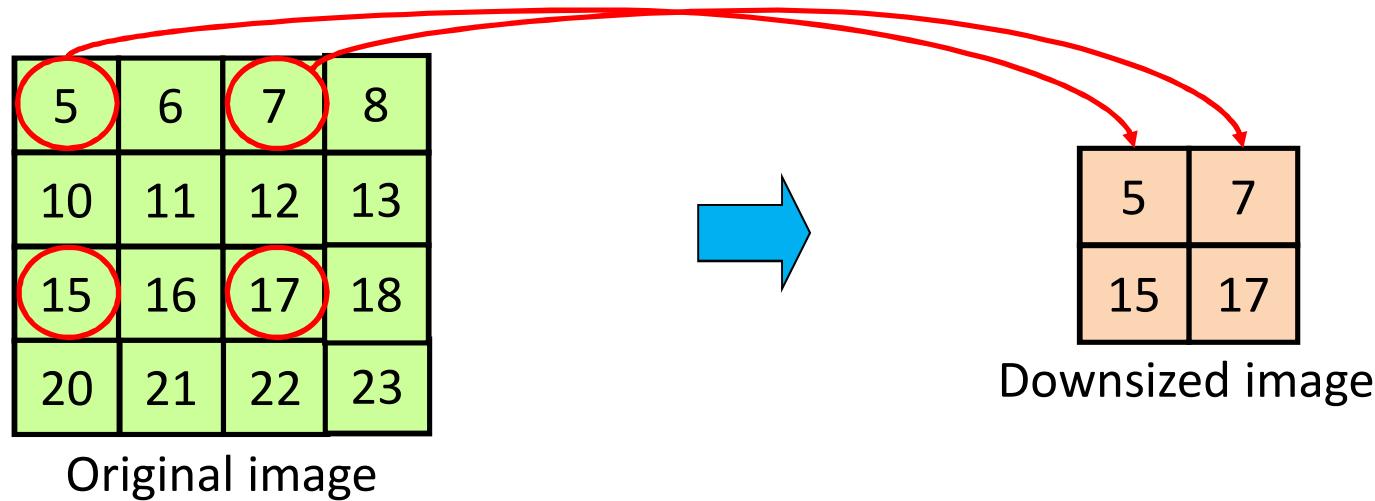


# Down Sampling



# Point Sampling

- Point sampling : It used to quickly interpolate an original image down to half the size in x and y.

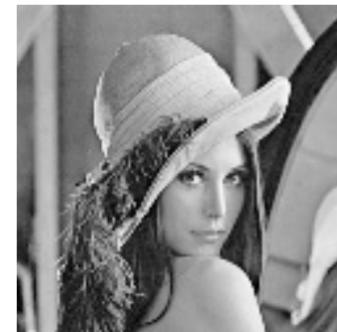
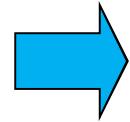


- Advantage : fast and easy to implement
- Disadvantage : possible loss of data

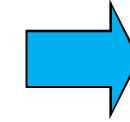
# Example : Point Sampling



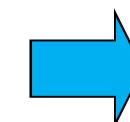
256x256



128x128



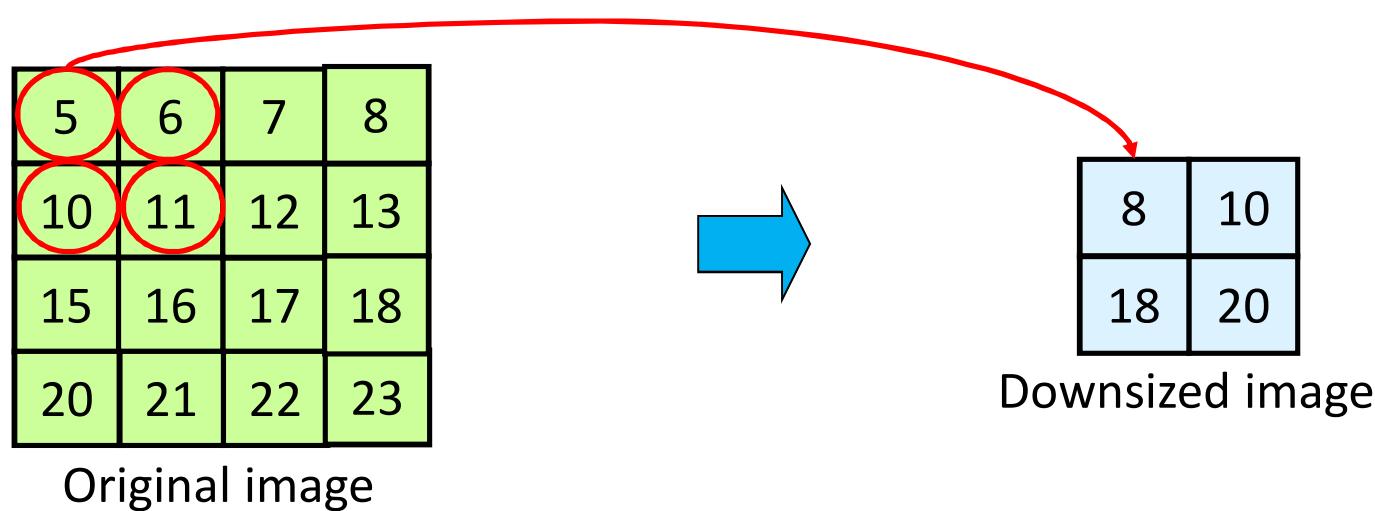
64x64



32x32

# Local Averaging

- Local averaging : use average of 2x2 neighborhood to calculate output pixels.



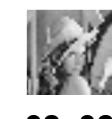
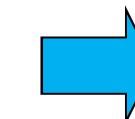
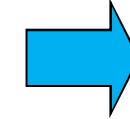
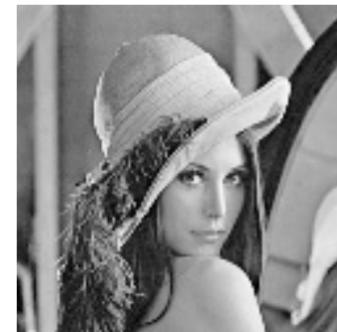
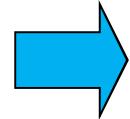
- Advantage : uses all image pixels
- Disadvantage : slightly slower

# Example : Local Averaging



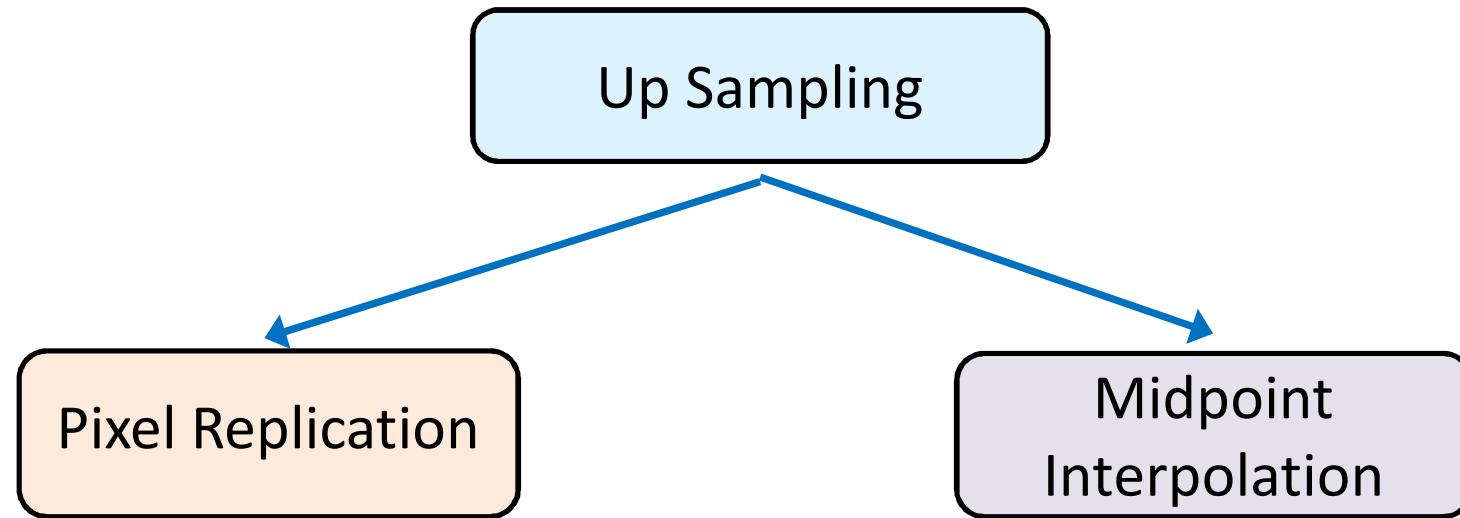
38

# Example : Point Sampling



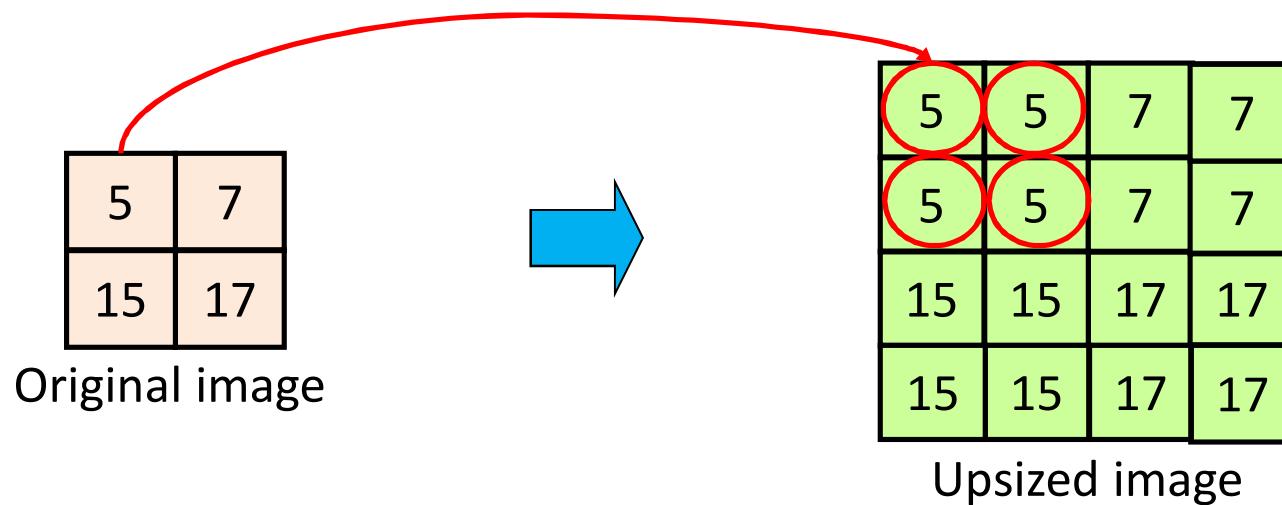
32x32

# Up Sampling



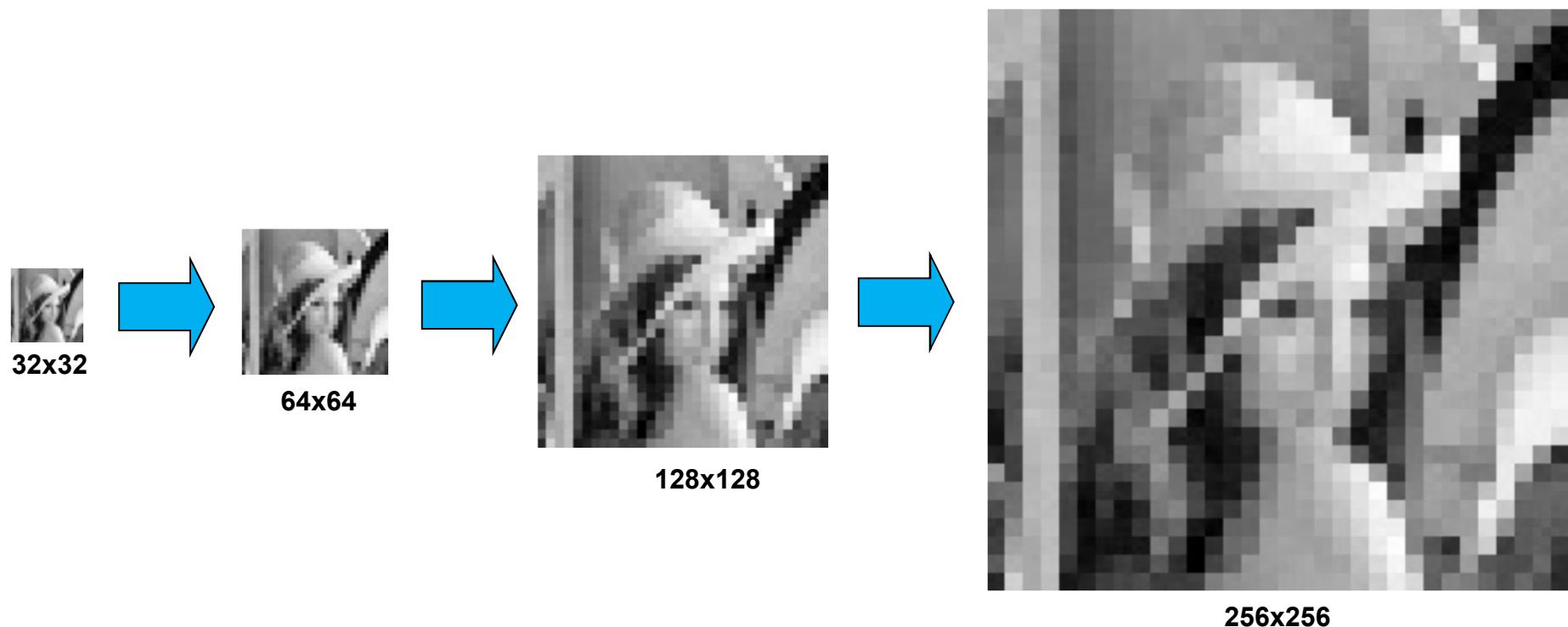
# Pixel Replication

- Pixel replication : repeat the pixel values to double the size of an image.



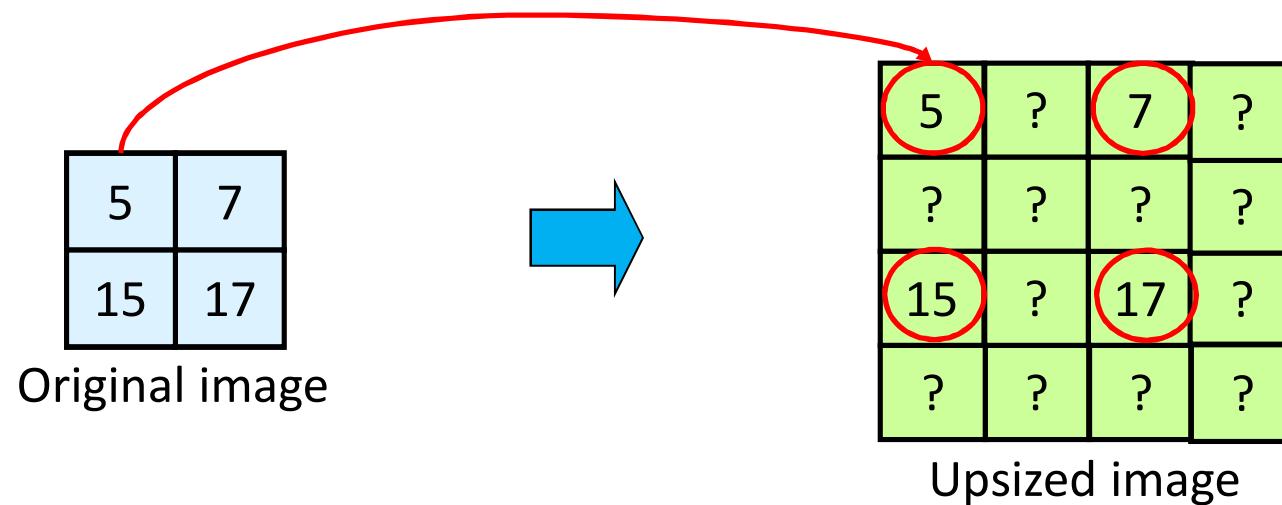
- Advantage : very easy to implement
- Disadvantage : produces undesired checkerboard pattern (aliasing) effect

# Example : Pixel Replication



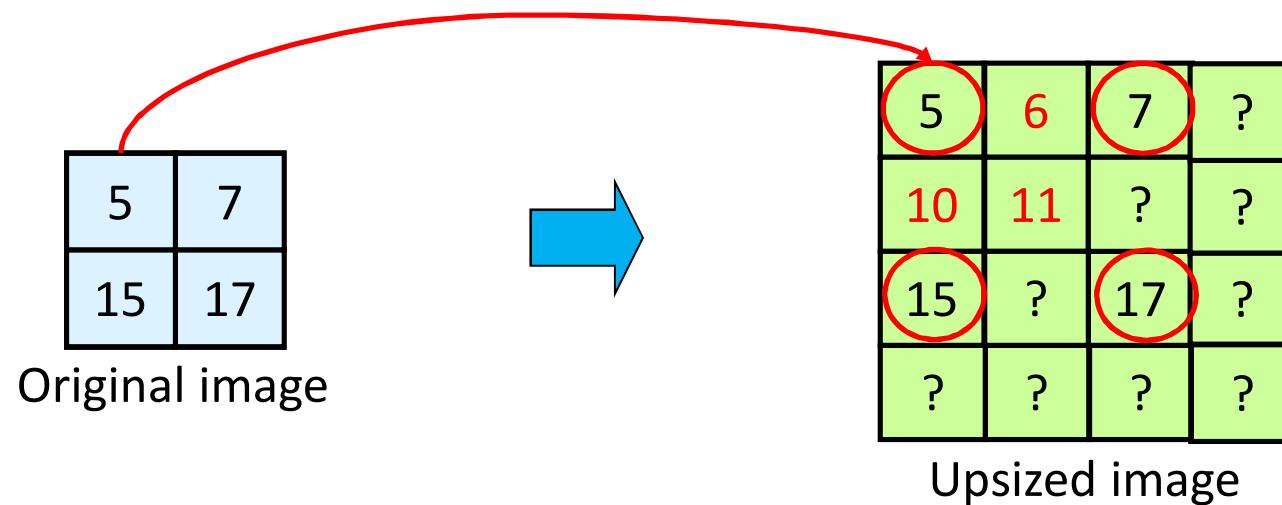
# Midpoint Interpolation

- Midpoint interpolation use values half way between adjacent pixels to fill in output pixels.



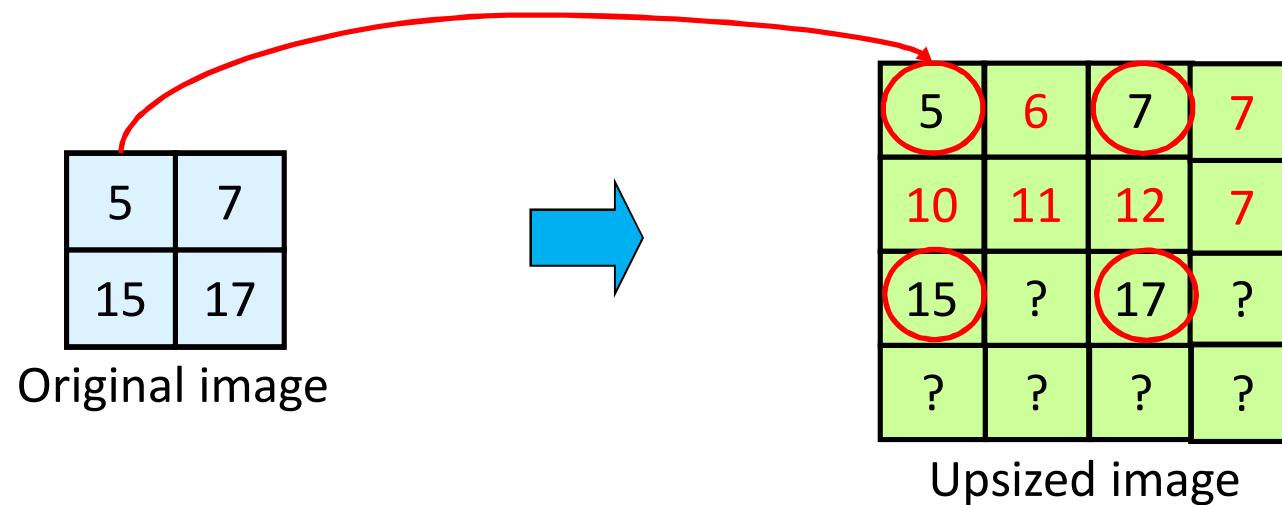
# Midpoint Interpolation

- Midpoint interpolation – use values half way between adjacent pixels to fill in output pixels.



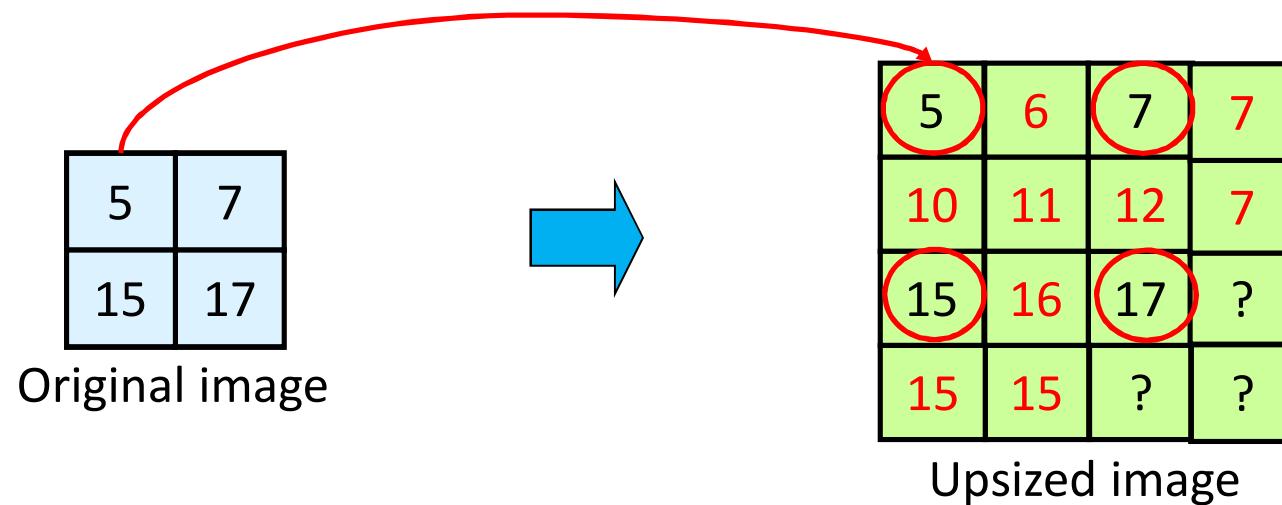
# Midpoint Interpolation

- Midpoint interpolation – use values half way between adjacent pixels to fill in output pixels.



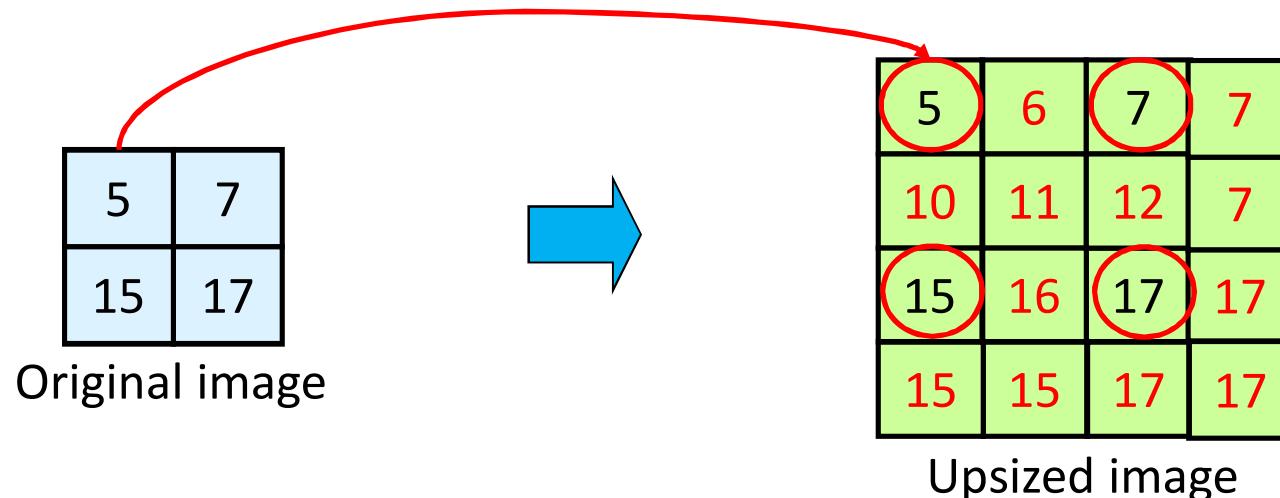
# Midpoint Interpolation

- Midpoint interpolation – use values half way between adjacent pixels to fill in output pixels.



# Midpoint Interpolation

- Midpoint interpolation – use values half way between adjacent pixels to fill in output pixels.

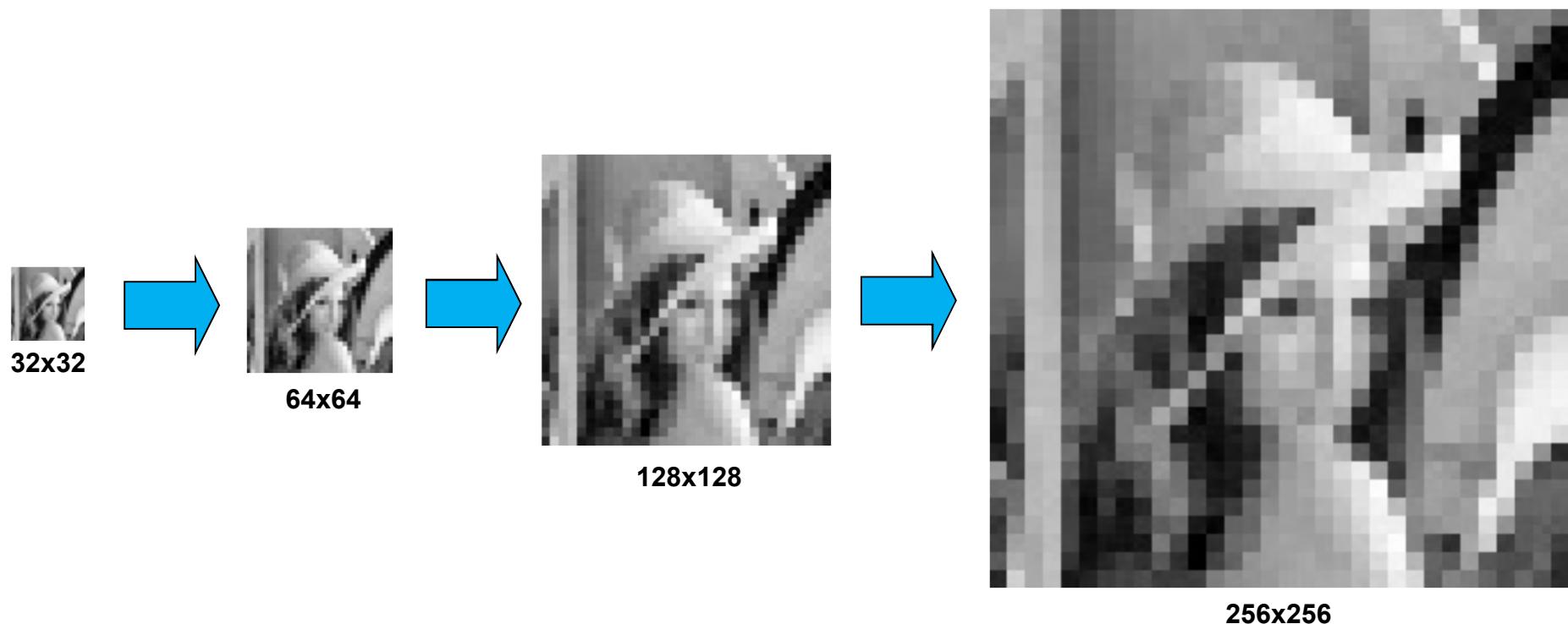


- Advantage : results in smoother output image
- Disadvantages :
  - uses more additions and divisions
  - must handle last row and column as a special case (typically using pixel replication)

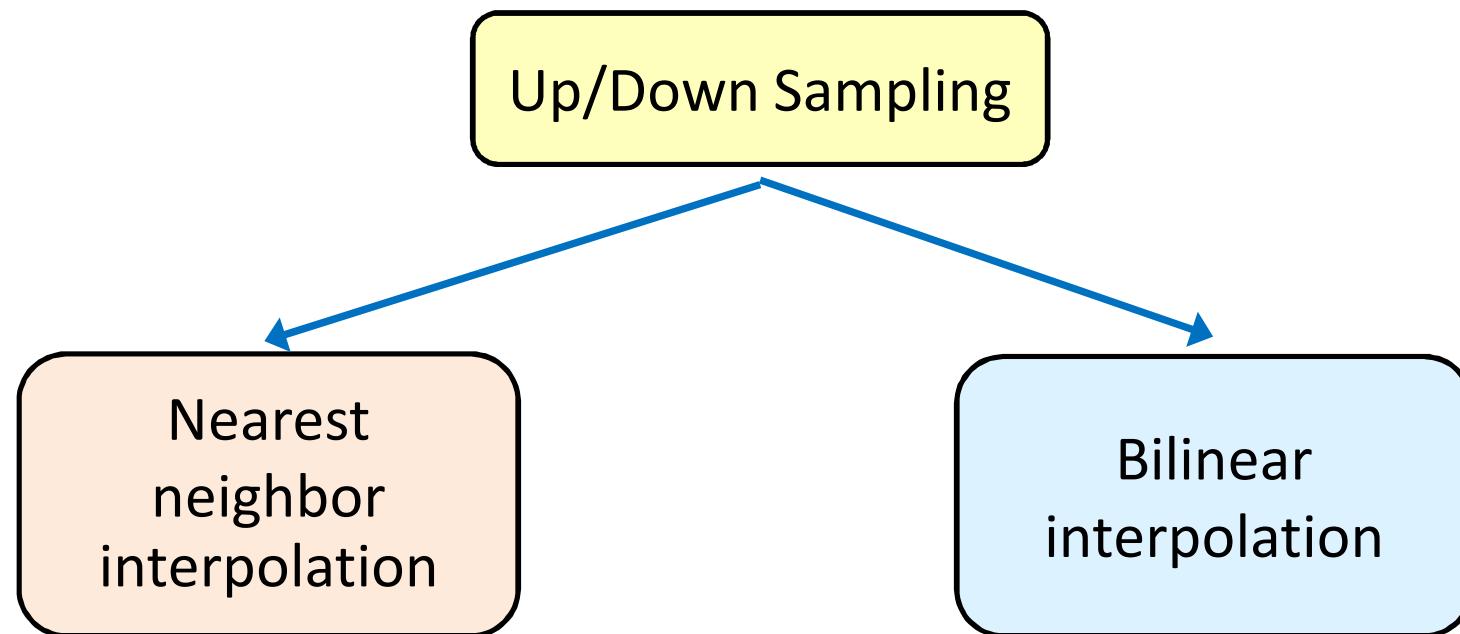
# Example : Midpoint Interpolation



# Example : Pixel Replication



# Image Interpolation



# Nearest Neighbor Interpolation

- Nearest neighbor interpolation use rounding to get closest integer value. It can be used to interpolate images up/down to any size.
- Advantage : fast and easy to implement
- Disadvantage : data loss or block artifacts

# Example : Nearest Neighbor Interpolation



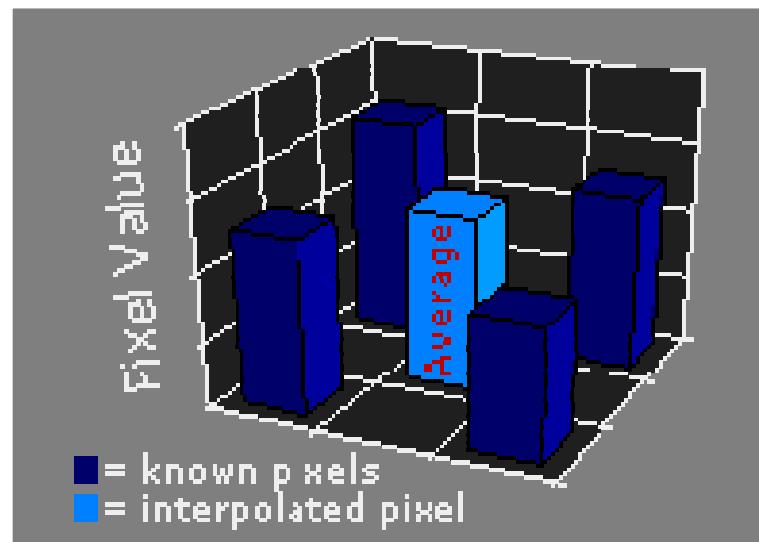
Resized image  
180x300



Resized image  
300x180

# Bilinear Interpolation

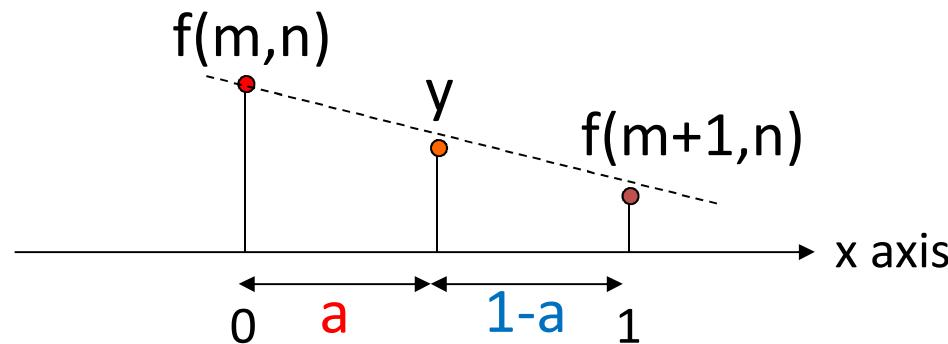
- Bilinear interpolation use distance weighted average of adjacent pixels to obtain output pixel value. It can be used to interpolate images up/down to any size.



- Advantage : more accurate than nearest neighbor
- Disadvantage : slower and more complex to implement

# Bilinear Interpolation

- Method of linear: the closer to a pixel, the higher weight is assigned



$$y - y_1 = \frac{(y_2 - y_1)}{(x_2 - x_1)}(x - x_1)$$

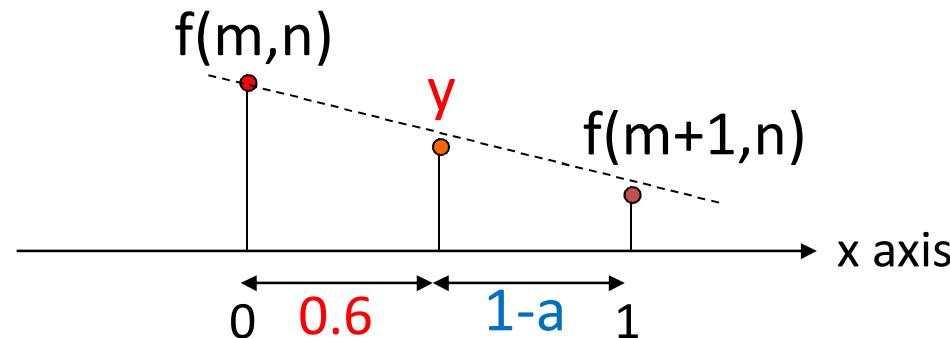
$$y - f(m, n) = \frac{(f(m+1, n) - f(m, n))}{(1 - 0)}(a - 0)$$

$$y = (1 - a) \times f(m, n) + a \times f(m+1, n)$$

- When  $a=0.5$ , we can use the average of two values,  $0 < a < 1$

# Example : Linear Interpolation

- Define  $f(m,n)=10$  and  $f(m+1,n)=40$



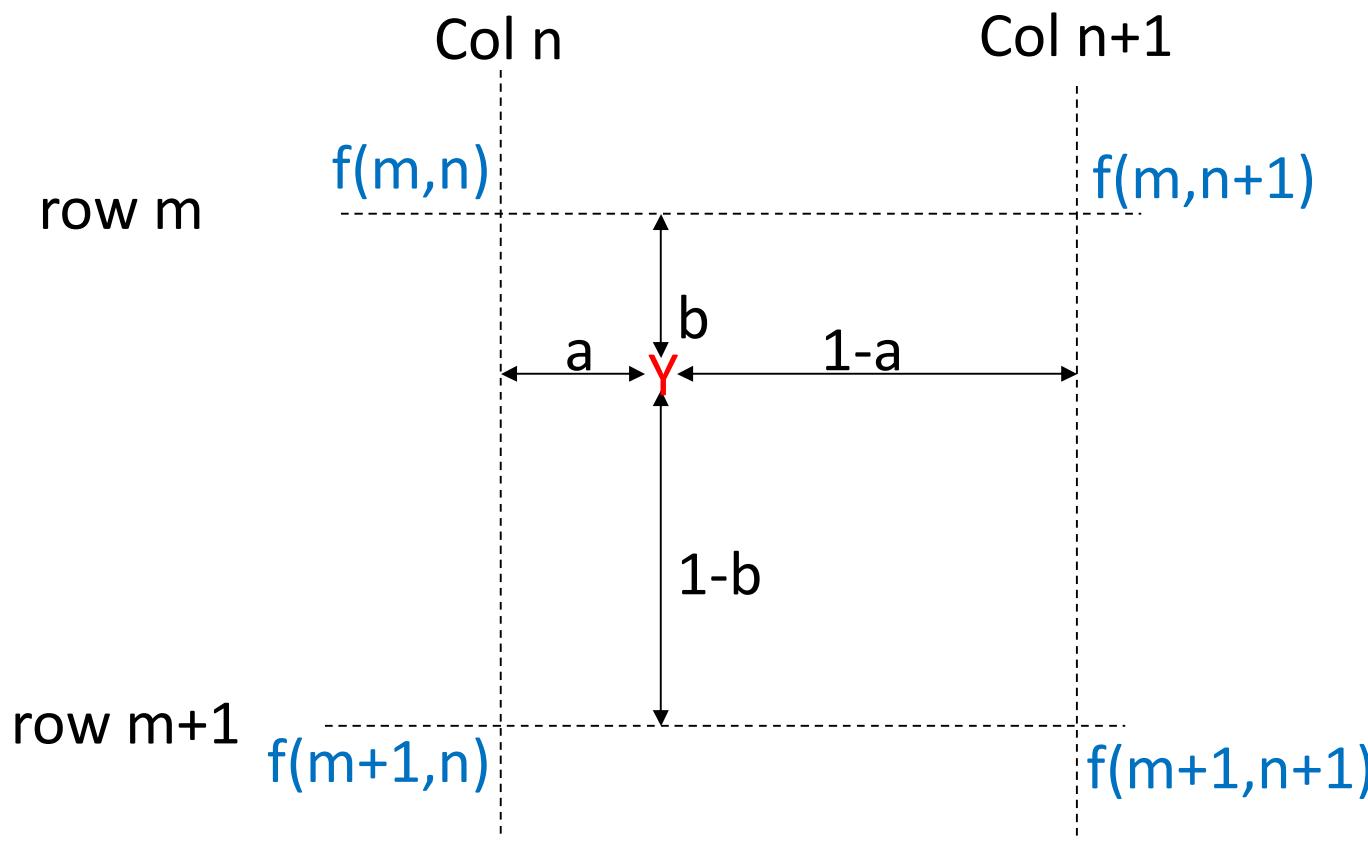
$$y = (1 - a) \times f(m, n) + a \times f(m + 1, n)$$

$$y = (0.4 \times 10) + (0.6 \times 40)$$

$$y = 28$$

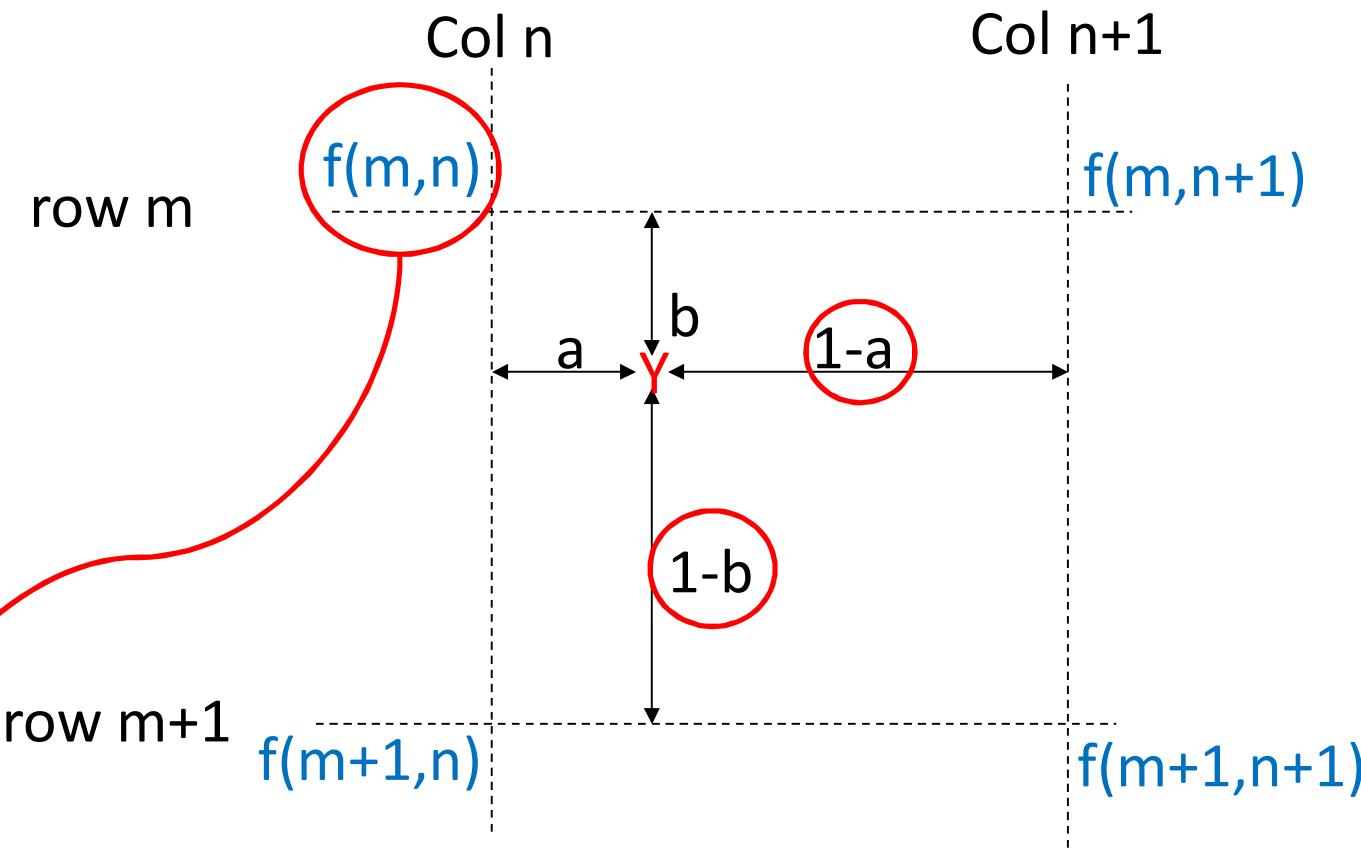
# Bilinear Interpolation

- What is the interpolated value at Y?



# Bilinear Interpolation

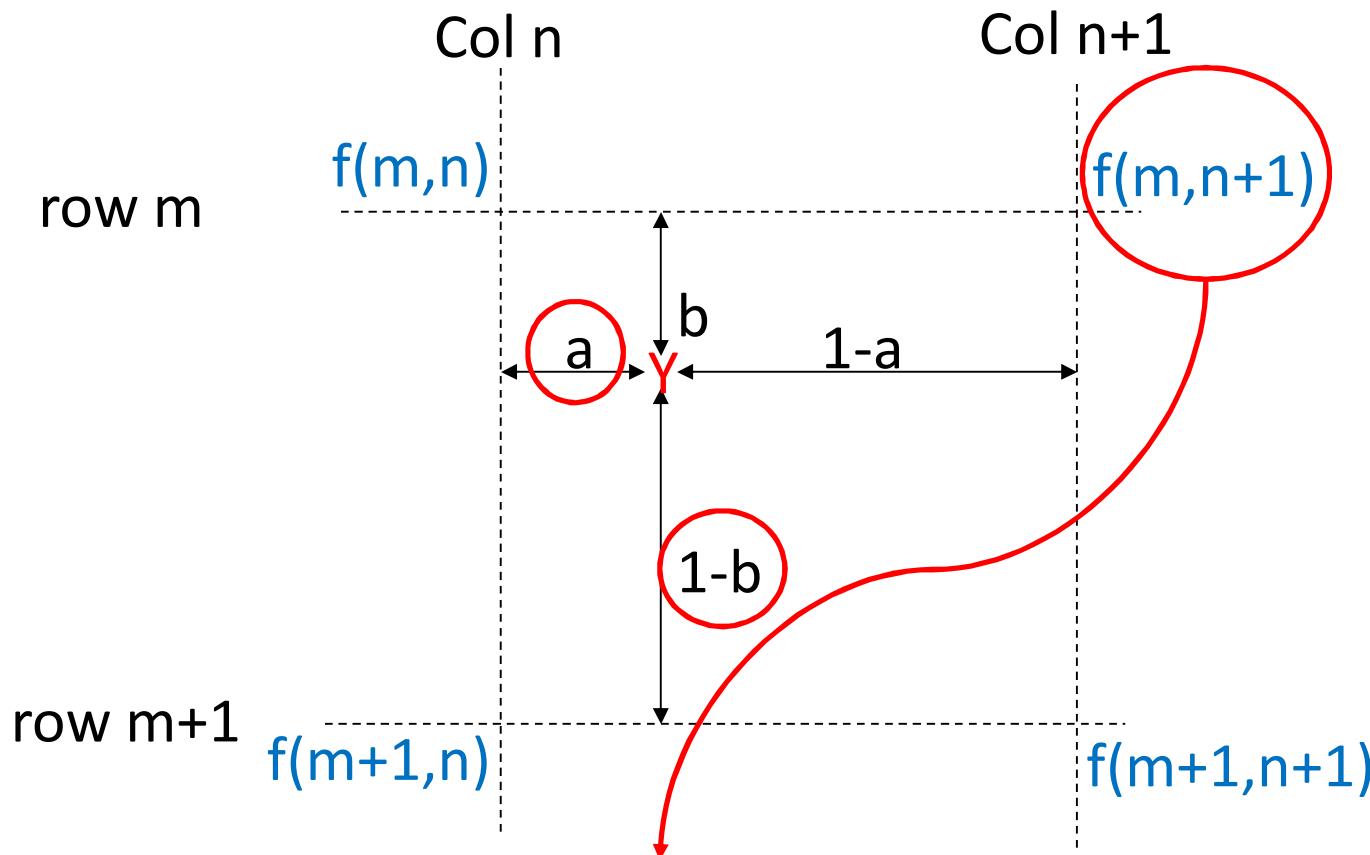
- What is the interpolated value at Y?



Ans:  $(1-a) \times (1-b) \times f(m, n)$

# Bilinear Interpolation

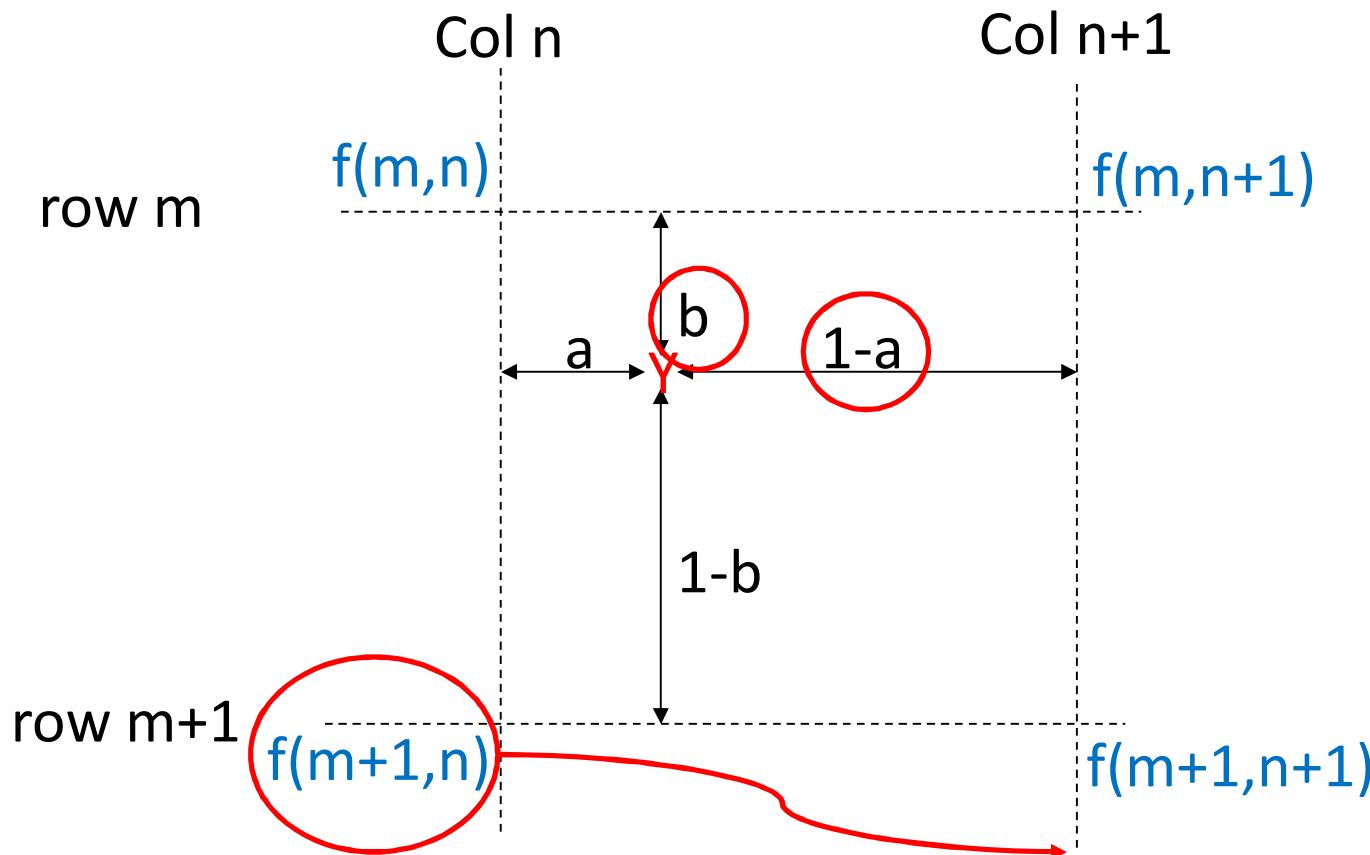
- What is the interpolated value at Y?



Ans:  $(1-a)(1-b)f(m,n) + a(1-b)f(m,n+1) + (1-a)b f(m+1,n) + ab f(m+1,n+1)$

# Bilinear Interpolation

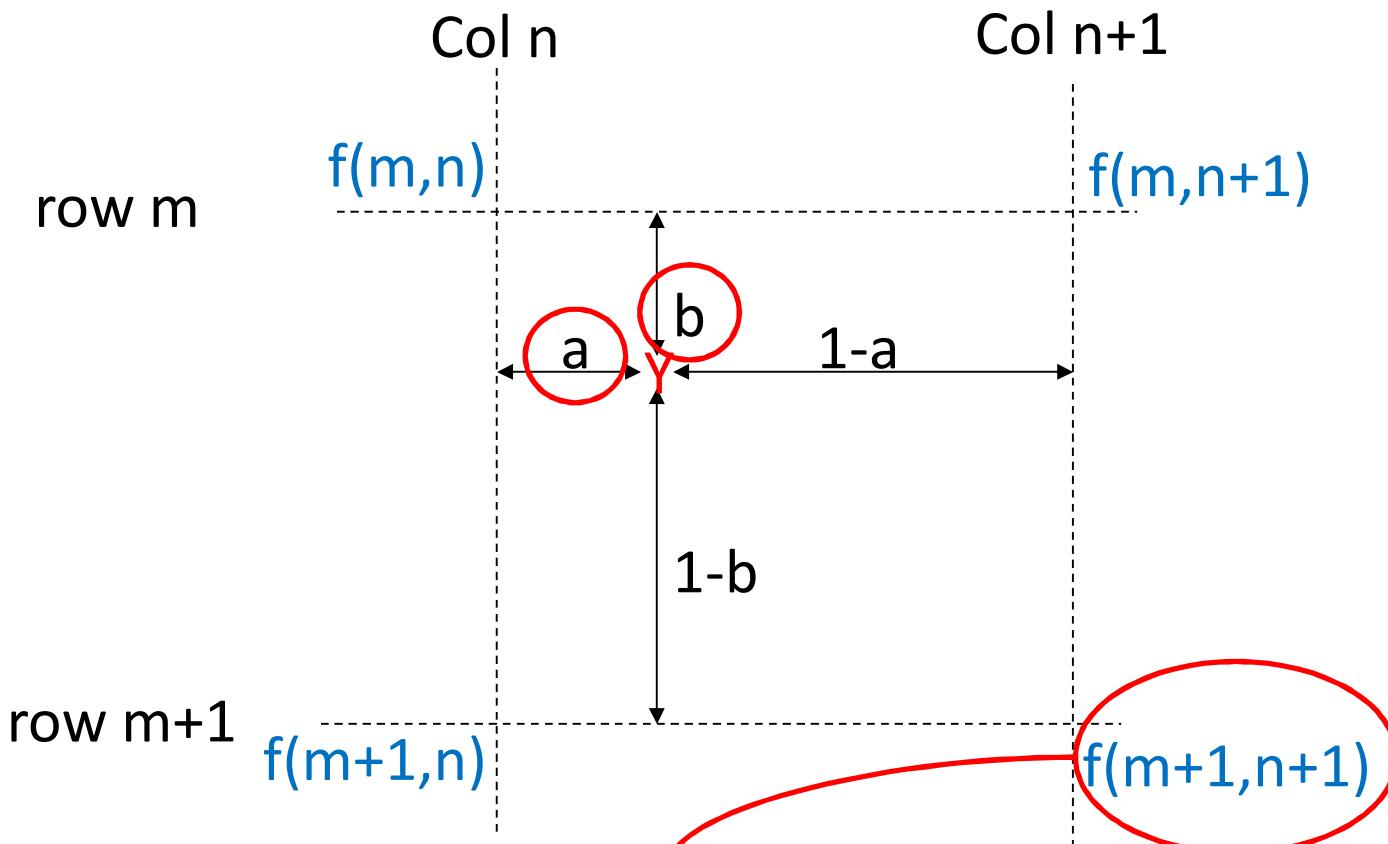
- What is the interpolated value at Y?



Ans:  $(1-a) \times (1-b) \times f(m,n) + a \times (1-b) \times f(m,n+1) + (1-a) \times b \times f(m+1,n)$

# Bilinear Interpolation

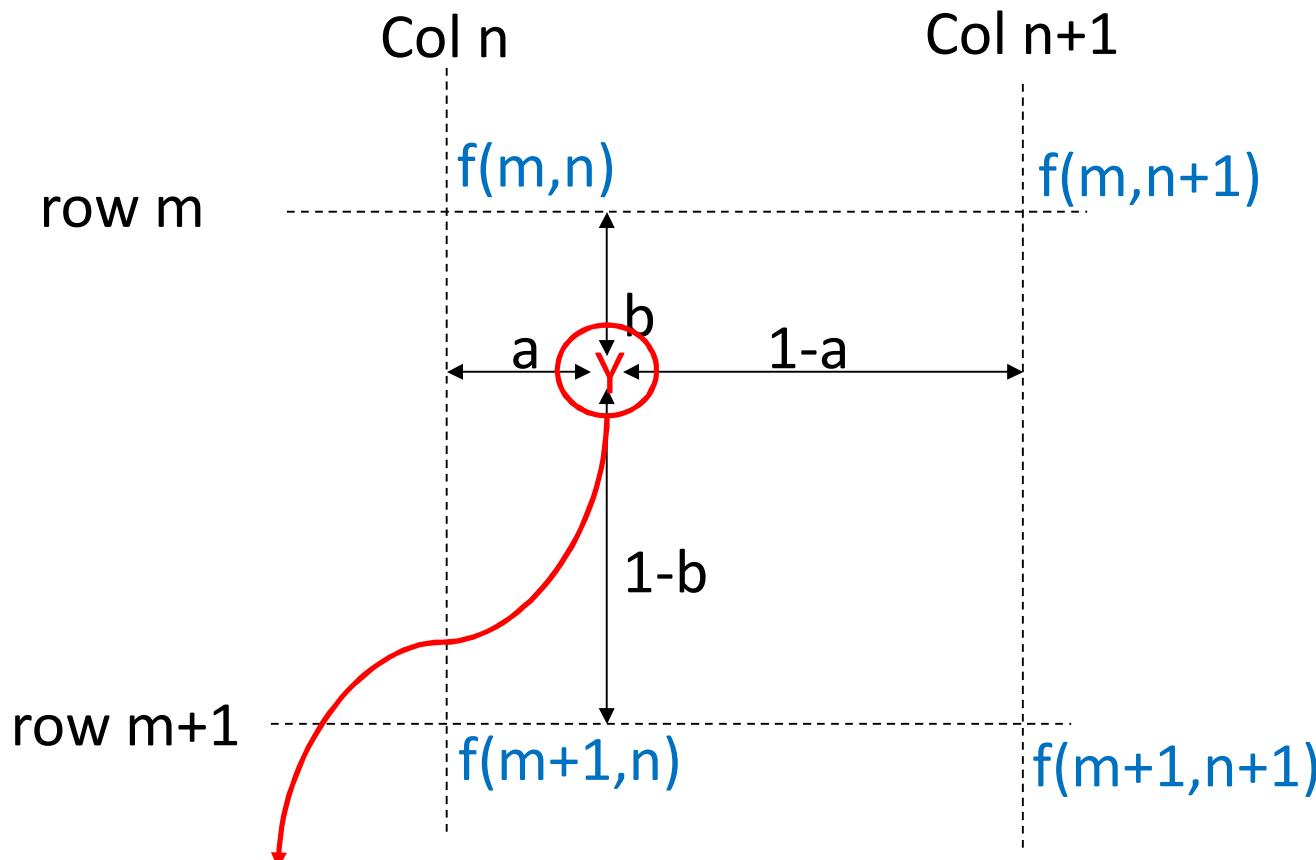
- What is the interpolated value at Y?



$$\text{Ans: } (1-a) \times (1-b) \times f(m,n) + a \times (1-b) \times f(m,n+1) + (1-a) \times b \times f(m+1,n) \\ + a \times b \times f(m+1,n+1)$$

# Bilinear Interpolation

- What is the interpolated value at  $Y$ ?



Ans:  $(1-a) \times (1-b) \times f(m,n) + a \times (1-b) \times f(m,n+1) + (1-a) \times b \times f(m+1,n)$   
 $+ a \times b \times f(m+1,n+1)$

# Example : Bilinear Interpolation



Resized image  
180x300



Resized image  
300x180

# Example : Nearest Neighbor Interpolation

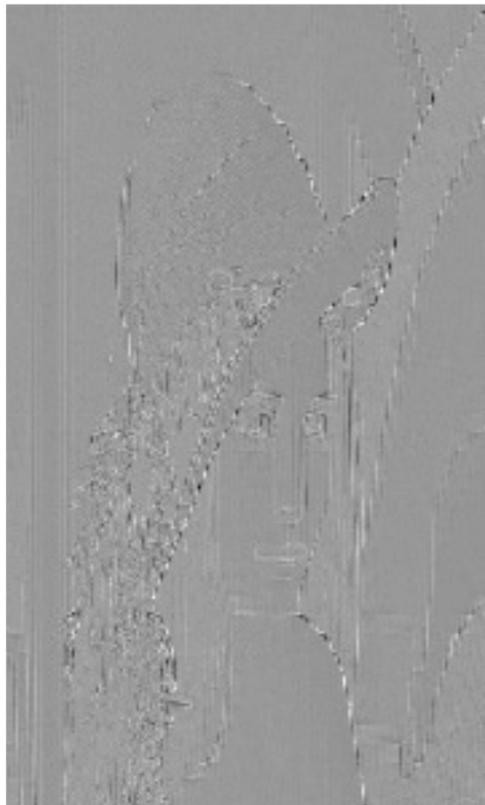


Resized image  
180x300

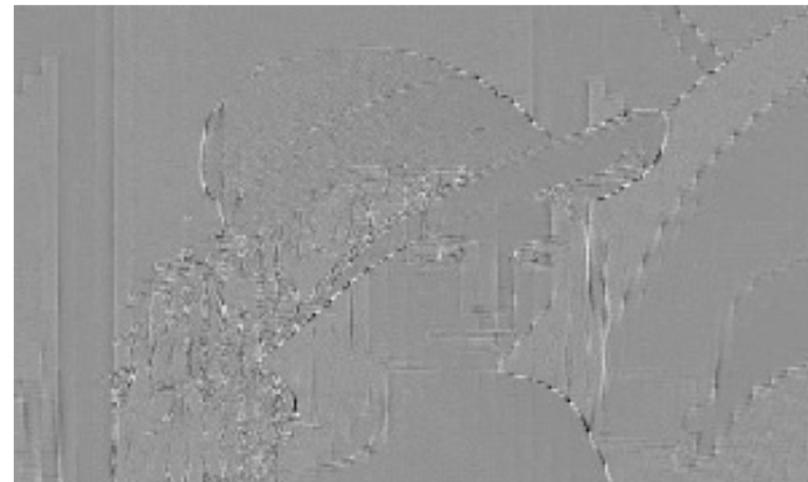


Resized image  
300x180

# Compared Bilinear with Nearest Neighbor



Resized image  
180x300



Resized image  
300x180

# Compared Bilinear with Nearest Neighbor

- Nearest neighbor interpolation:
  - fastest processing
  - produces undesired checkerboard pattern (**aliasing**) effect
- Bilinear interpolation:
  - smoother looking images than nearest neighbor.
  - has an **anti-aliasing** effect, therefore less aliasing effect than nearest neighbor.

**Thanks for your attention**