# 影像處理 02 數位影像基礎

教師:許閱傑、蕭兆翔

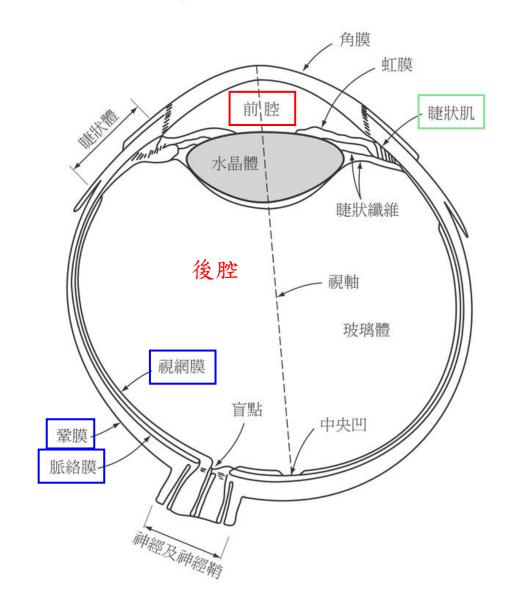
助教:莊媞涵

#### 大綱

- ▶ 視覺感知
- > 影像感應與擷取
- > 影像取樣與量化
- ▶ 內插法(Interpolation)
- > 空間轉換

#### 2.1 視覺感知的要素

圖 **2.1** 人類眼睛橫剖面 的簡化圖形



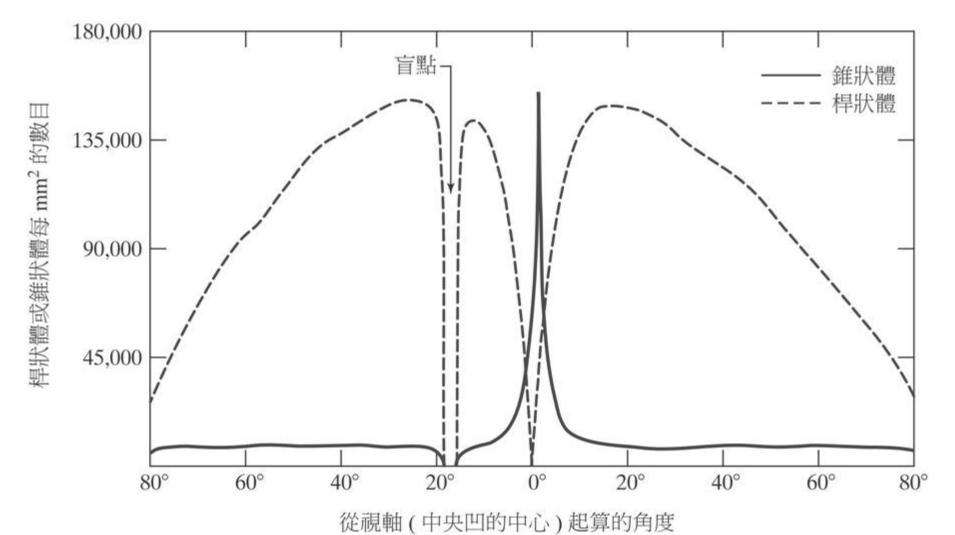


圖 2.2 視網膜上桿狀體 和錐狀體的分布

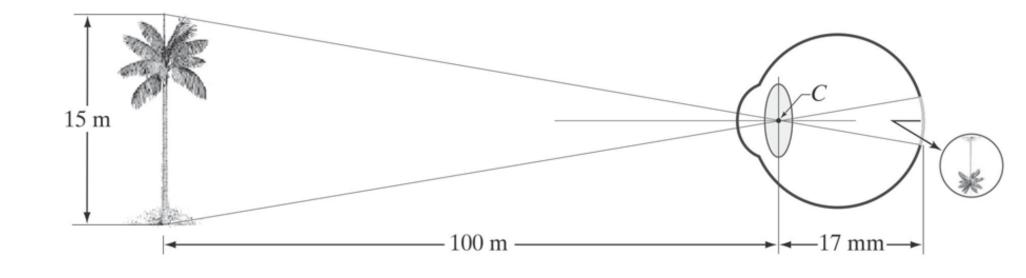
錐細胞(Cone): 負責亮光視覺

桿細胞(Rod): 負責昏暗視覺

#### 眼睛中的細胞

圖 2.3

注視一棵棕櫚樹 時眼睛的圖形表 示。C 點是水晶 體的聚焦中心。

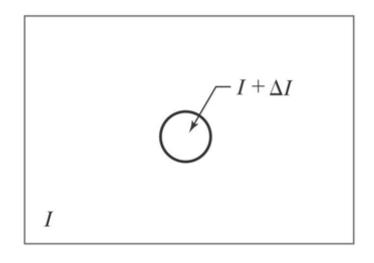


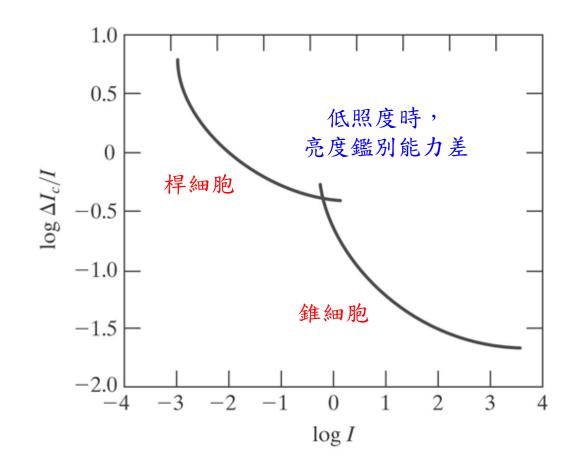
$$\frac{15}{100} = \frac{h}{17} \qquad h = 2.25 \text{mm}$$

#### 眼睛的亮度鑑別

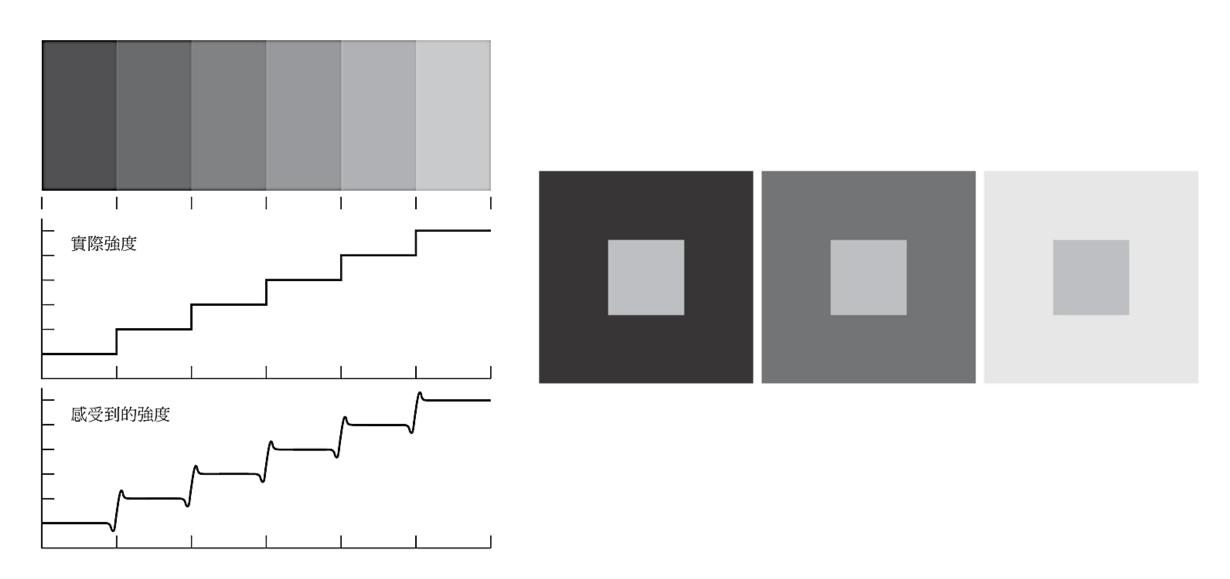
章伯比(Weber ratio)

$$\rightarrow \Delta I_c/I$$

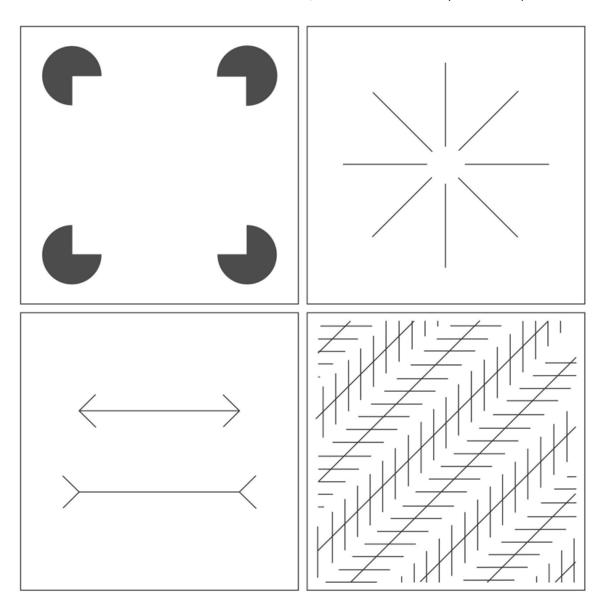




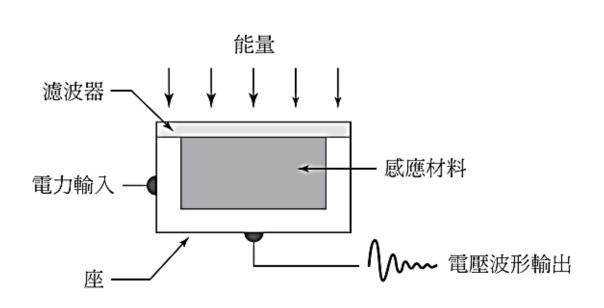
## 人眼的視覺假象(1/2)



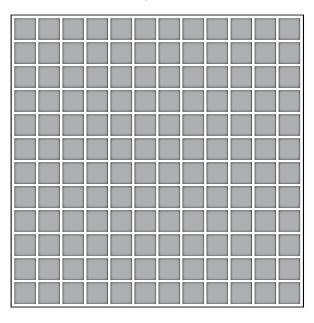
## 人眼的視覺假象(2/2)



#### 2.2 影像的感應與擷取



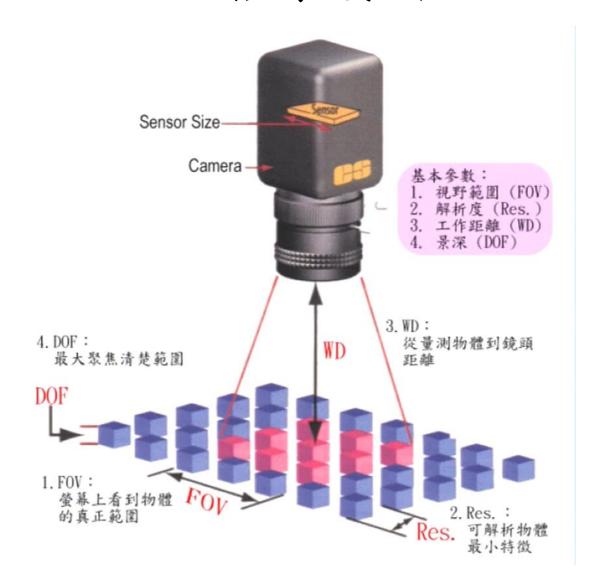
#### 面影像感測器



線影像感測器

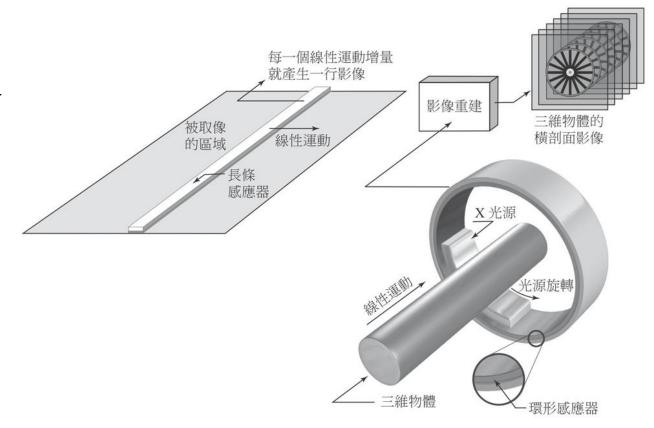


#### 面影像感測器



#### 線影像感測器

- > 刷載具
- > 無人機空中成像
- ▶ 核磁共振MRI
- > PET



#### a b

#### 圖 2.12

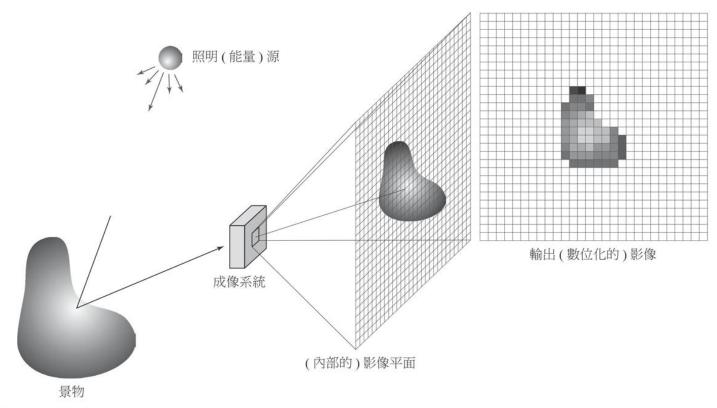
(a) 用一個長條 線型感應器的影 像擷取;(b) 用 一個圓形長條感 應器的影像擷 取。

#### Rolling Shutter Effect

https://www.youtube.com/watch?v=dNVtMmLlnoE&t=33s



#### 2D影像形成模型



a b c d e

圖 **2.13** 一個數位影像擷取的例子:(a) 照明 (能量)源;(b) 一個景物;(c) 成像系統;(d) 將景物投影到影像平面上;(e) 數位化的影像。

$$0 \le f(x, y) < \infty$$

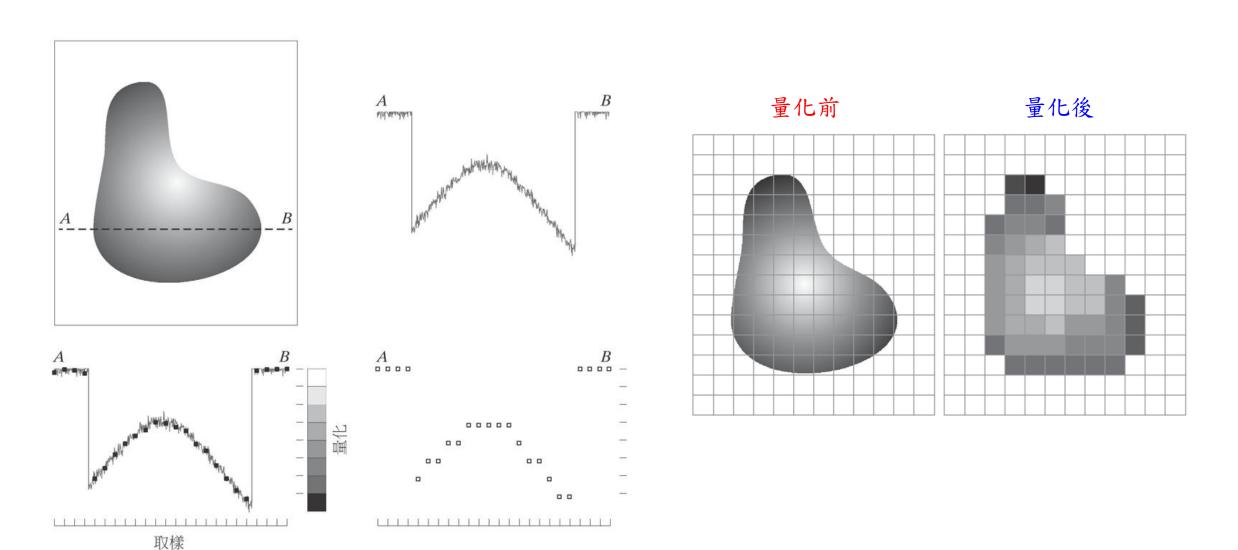
照明量X反射量

$$f(x, y) = i(x, y)r(x, y)$$

$$0 \le i(x, y) < \infty$$

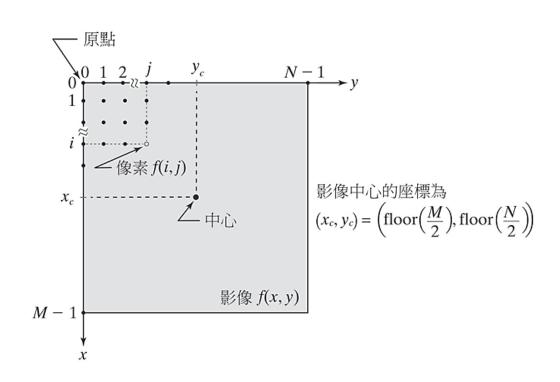
$$0 \le r(x, y) \le 1$$

#### 2.3 影像的取樣和量化

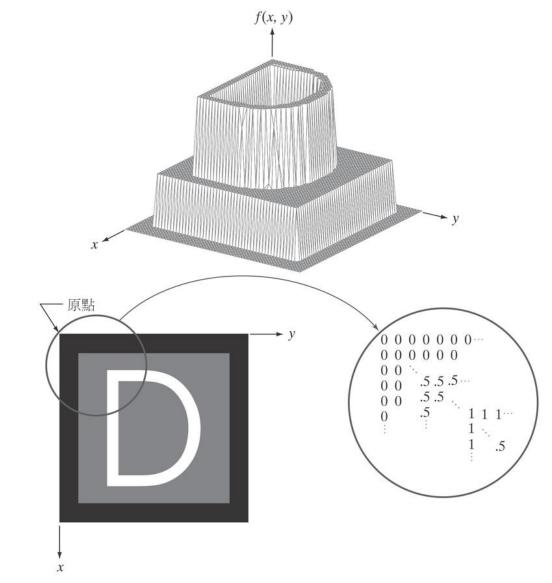


#### 數位影像表達

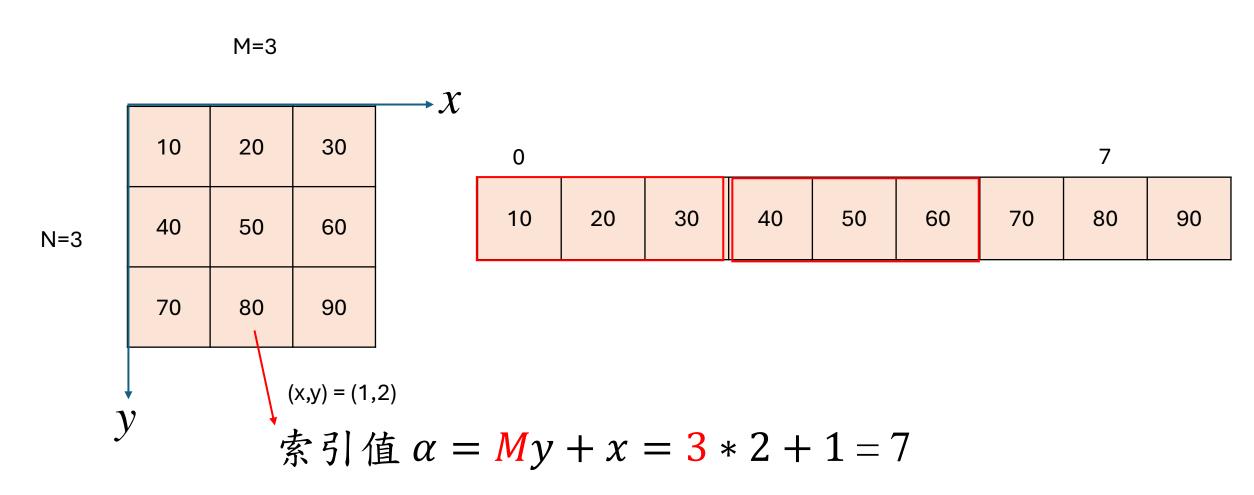
(2-7)



$$f(x,y) = \begin{bmatrix} f(0,0) & f(0,1) & \cdots & f(0,N-1) \\ f(1,0) & f(1,1) & \cdots & f(1,N-1) \\ \vdots & \vdots & & \vdots \\ f(M-1,0) & f(M-1,1) & \cdots & f(M-1,N-1) \end{bmatrix}$$



#### 影像索引2D



#### 影像索引2D

M=3

1				$\mathcal{X}$
	10	20	30	
N=3	40	50	60 (2,1)	
	70	80	90	
			-	•

0					5			
10	20	30	40	50	60	70	80	90

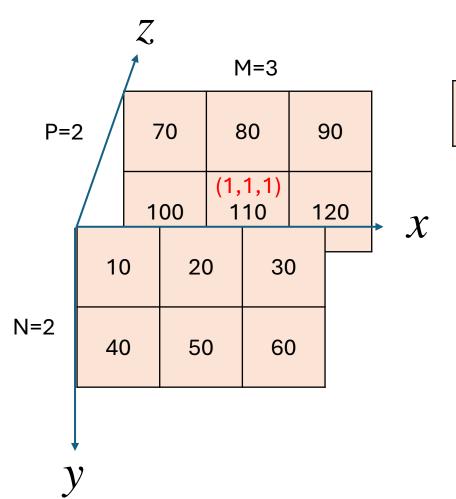
已知索引值α求(x,y)

$$\triangleright x = \alpha \mod M$$

$$\triangleright y = (\alpha - x) / M$$

$$x = 5 \mod 3 = 2$$
  
 $y = (5 - 2) / 3 = 1$ 

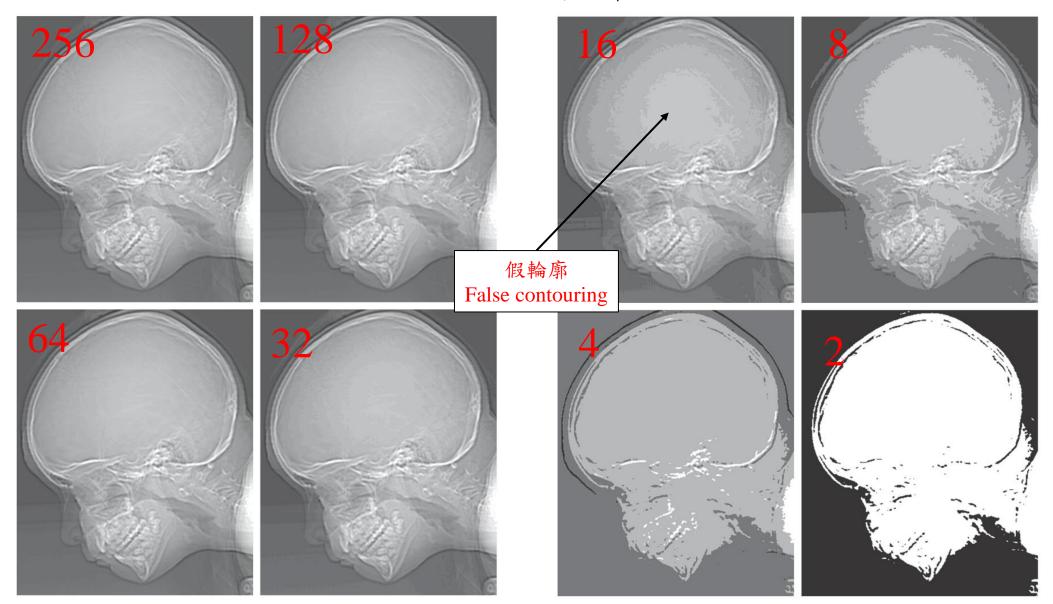
#### 影像索引3D



索引值 
$$S = x + My + MNz = x + M(y + Nz)$$

- $\triangleright x = S \mod MN \mod M$
- $> y = S \mod MN/M ($ 取商數)
- > z = S/MN (取商數)

## 強度解析度



#### 影像內插(Interpolation)

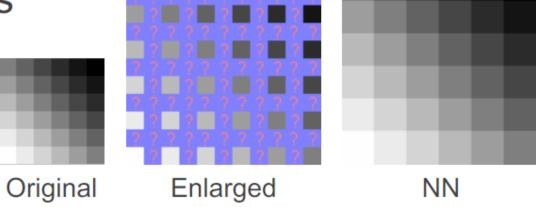




**圖 2.25** (a) 縮小到 72 dpi 再用最近鄰插補放大回其原來 930 dpi 大小的影像。此圖與圖 2.21(d) 相同;(b) 縮小再用雙線性插補放大的影像;(c) 與 (b) 同但用雙立方插補。

#### 影像內插(Interpolation)

- Common interpolation techniques
  - Nearest Neighbor (NN)
  - Bilinear
  - Bicubic





Nearest Neighbor

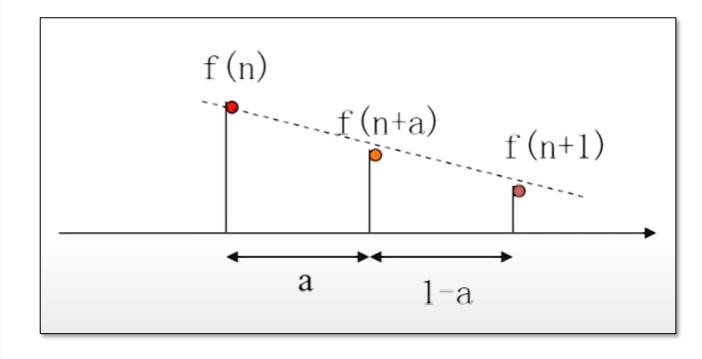
Bilinear

## 1D-影像內插(Interpolation)

1-D最近鄰內插法

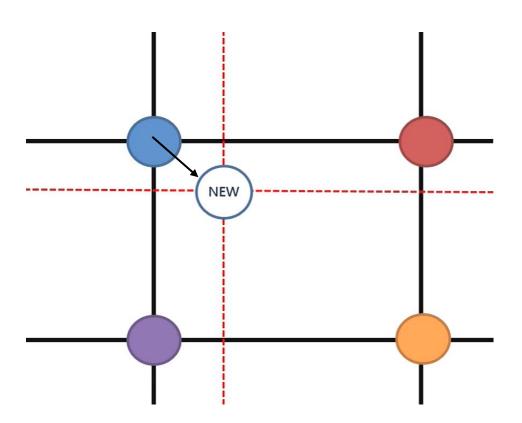
1-D線性內插法

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



#### 2-D最鄰近內插法 (Nearest Neighbor Interpolation)

2-D最鄰近內插法





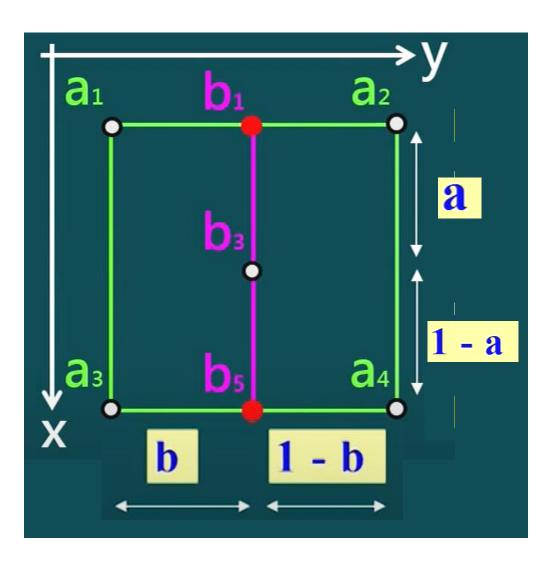
## ★ 2-D 雙線性內插法(Bilinear Interpolation)

#### 1-D線性內插法

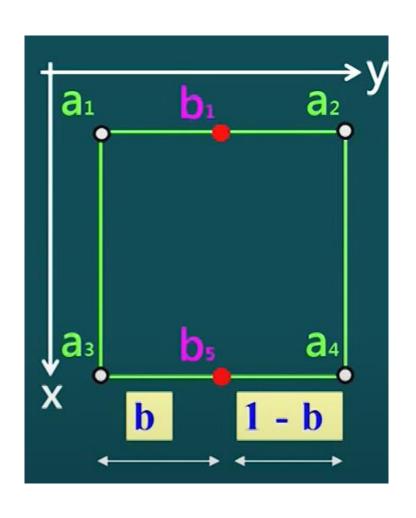
$$f(n+a) = (1-a) \times f(n) + a \times f(n+1)$$

#### 2-D線性內插法

$$b_3 = (1 - a) \times [(1 - b) \times a_1 + b \times a_2]$$
$$+a \times [(1 - b) \times a_3 + b \times a_4]$$



#### 2-D 雙線性內插法 推導(1/3):水平方向內插



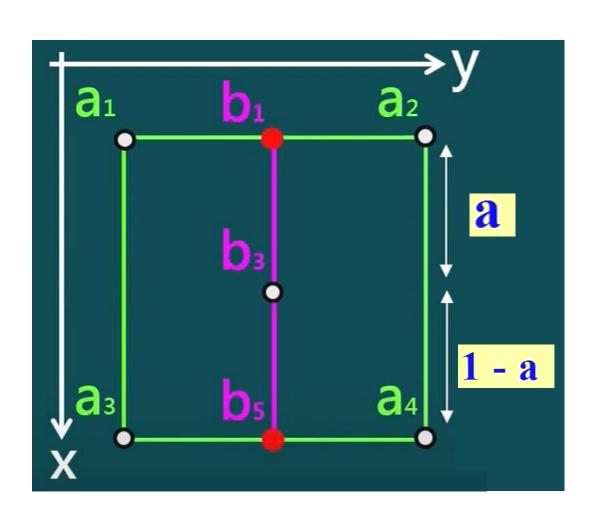
用像素a1、a2 估測出 b1

$$b_1 = (1 - b) \times a_1 + b \times a_2$$

用像素a3、a4 估測出 b5

$$b_5 = (1 - b) \times a_3 + b \times a_4$$

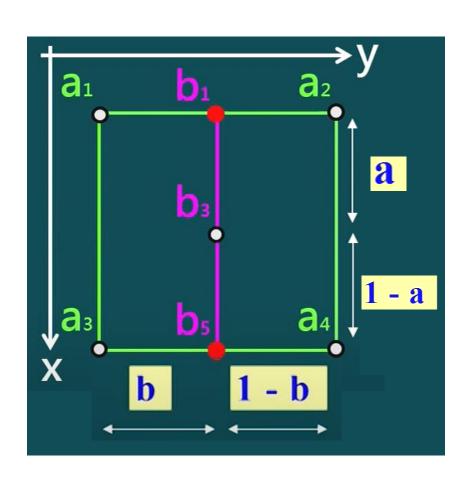
#### 2-D 雙線性內插法 推導(2/3):垂直方向內插



用像素b1、b5 估測出 b3

$$b_3 = (1 - a) \times b_1 + a \times b_5$$

#### 2-D 雙線性內插法 推導(3/3):合併



用像素a1、a2 估測出 b1

$$b_1 = (1 - b) \times a_1 + b \times a_2$$

用像素a3、a4 估測出 b5

$$b_5 = (1 - b) \times a_3 + b \times a_4$$

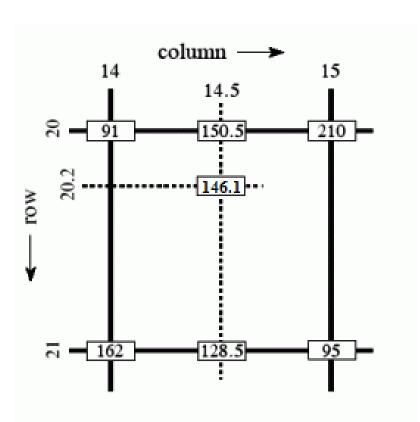
用像素b1、b5 估測出 b3

$$b_3 = (1 - a) \times b_1 + a \times b_5$$

通式

$$b_3 = (1 - a) \times [(1 - b) \times a_1 + b \times a_2]$$
  
  $+a \times [(1 - b) \times a_3 + b \times a_4]$ 

https://en.wikipedia.org/wiki/Bilinear\_interpolation

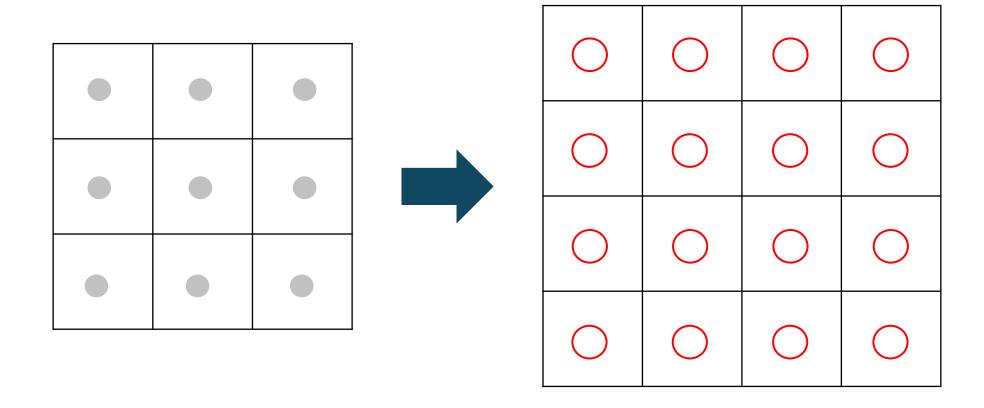


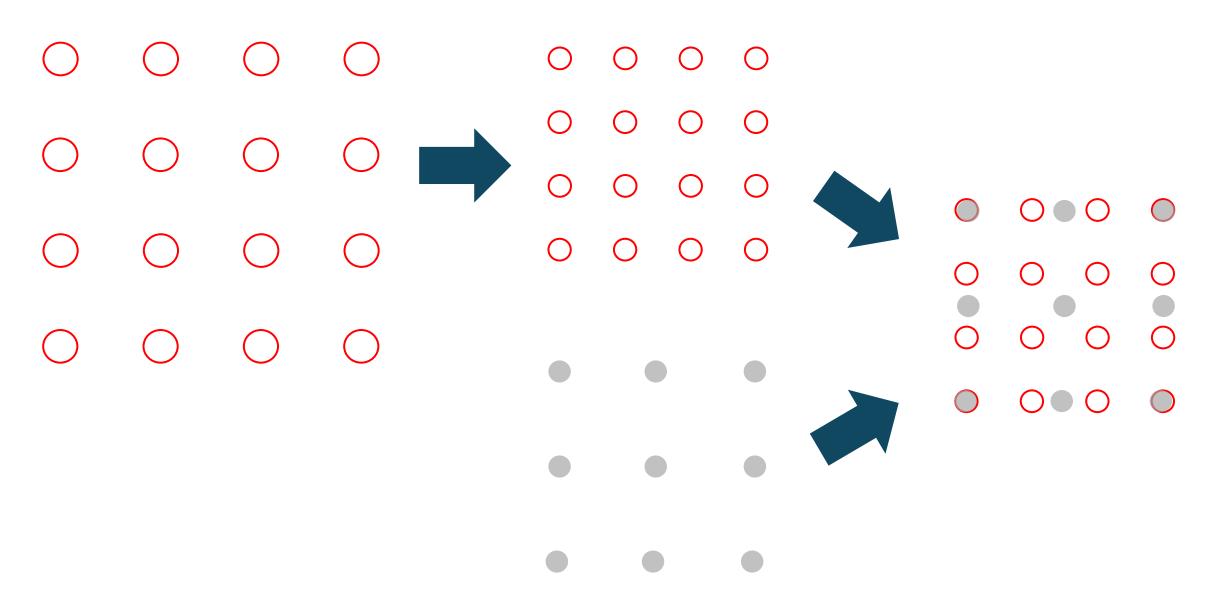
$$I_{21,14.5} = \frac{15 - 14.5}{15 - 14} \cdot 91 + \frac{14.5 - 14}{15 - 14} \cdot 210 = 150.5$$

$$I_{21,14.5} = \frac{15 - 14.5}{15 - 14} \cdot 162 + \frac{14.5 - 14}{15 - 14} \cdot 95 = 128.5$$

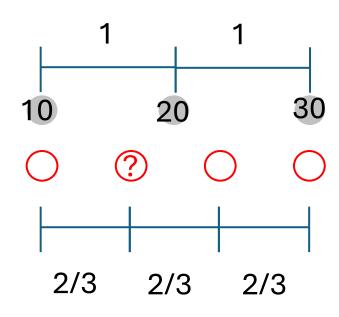
$$I_{20.2,14.5} = \frac{21 - 20.2}{21 - 20} \cdot 150.5 + \frac{20.2 - 20}{21 - 20} \cdot 128.5 = 146.1$$

10	20	30	10		30
40	50	60			
70	80	90			
70	80	30	70		90





#### 計算縮放比例

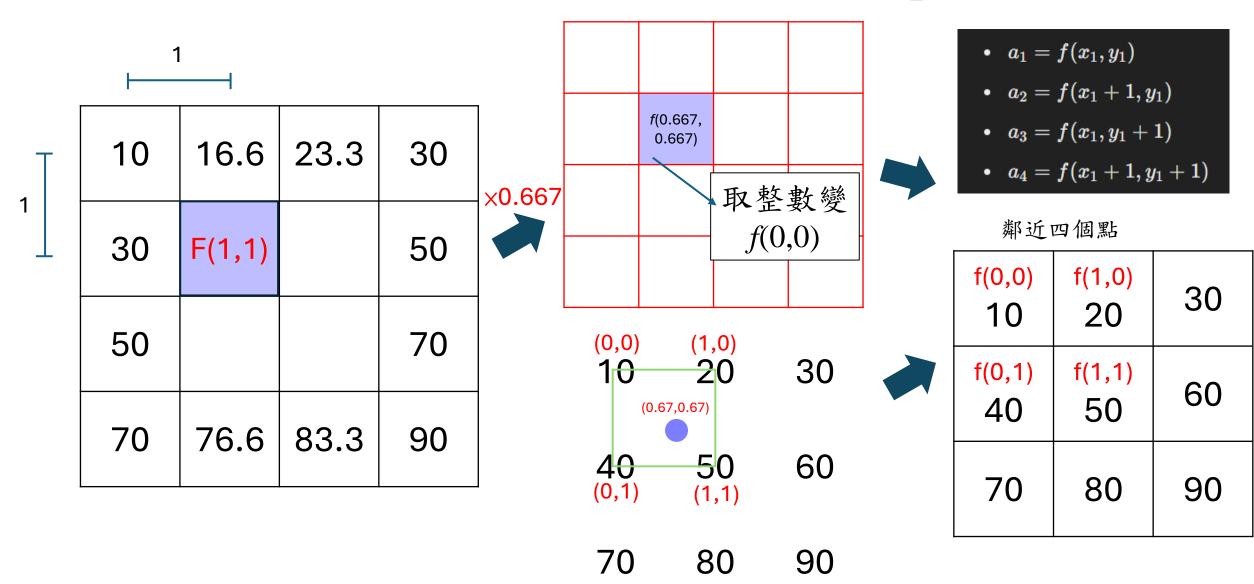


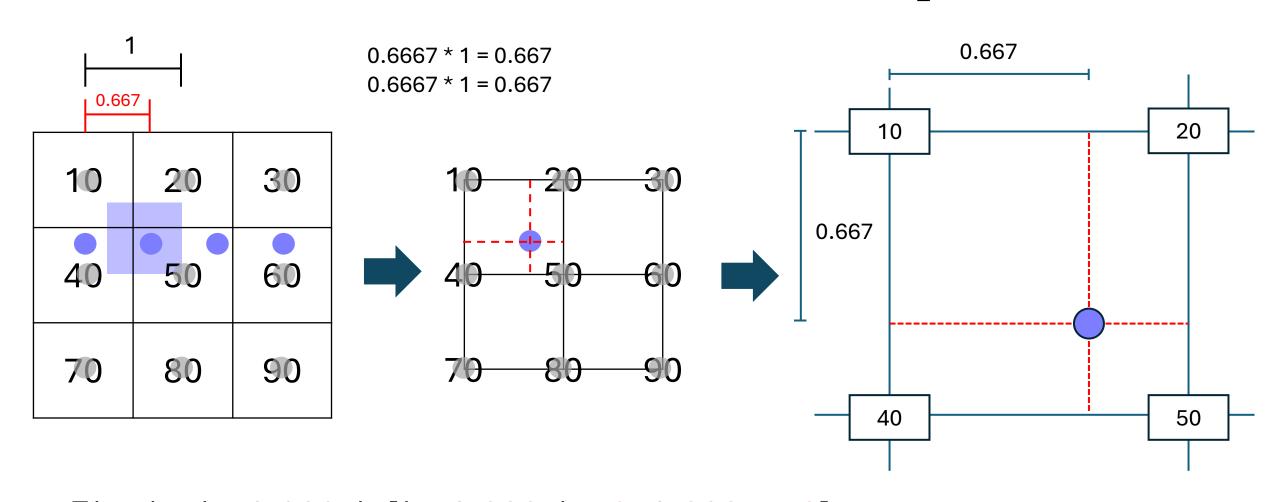
#### 計算縮放比例

- ▶原始圖像尺寸:寬度 $w_1=3$ ,高度 $h_1=3$
- ▶目標圖像尺寸:寬度 $w_2 = 4$ ,高度 $h_2 = 4$

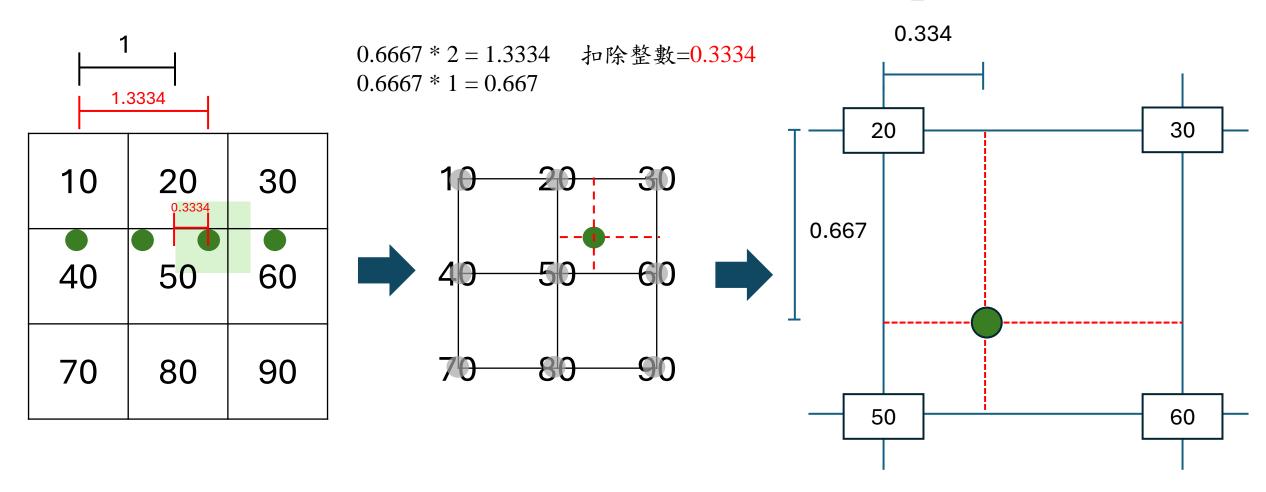
$$S_x = \frac{w_1 - 1}{w_2 - 1} = \frac{3 - 1}{4 - 1} = \frac{2}{3} \approx 0.667$$

$$S_y = \frac{h_1 - 1}{h_2 - 1} = \frac{2}{3} \approx 0.667$$



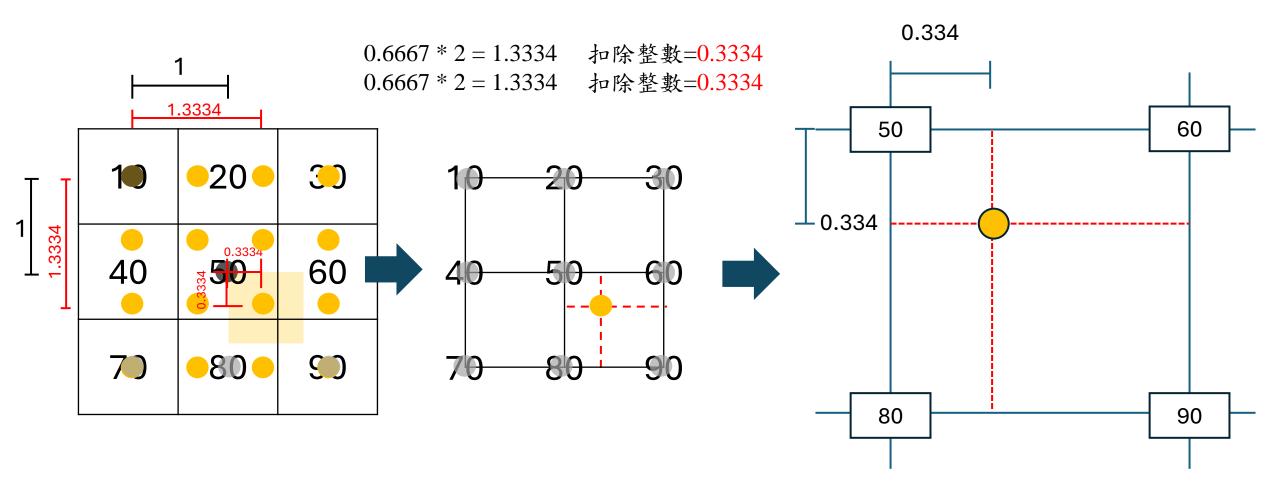


$$F(1,1) = (1-0.6667) \times [(1-0.6667) \times 10 + 0.6667 \times 40] + 0.6667 \times [(1-0.6667) \times 20 + 0.6667 \times 50] = 36.6672$$



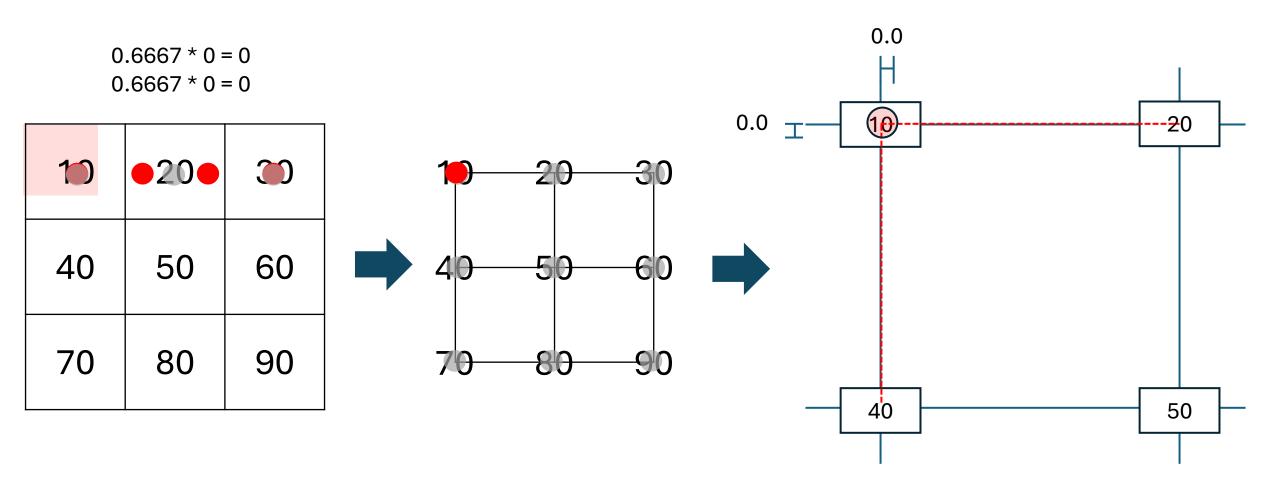
$$F(2,1) = (1-0.3334) \times [(1-0.6667) \times 20 + 0.6667 \times 50] + 0.3334 \times [(1-0.6667) \times 30 + 0.6667 \times 60] = 43.3352$$

## 2-D 雙線性內插法 範例Example 2



$$F(2,1) = (1-0.334) \times [(1-0.334) \times 50 + 0.334 \times 80] + 0.334 \times [(1-0.334) \times 60 + 0.334 \times 90] = 63.36$$

## 2-D 雙線性內插法 範例Example 2



$$F(0,0) = 1 \times [0 \times 40 + 1 \times 10] + 0 \times [(0 \times 50 + 1 \times 20] = 10$$

# 2-D 雙線性內插法 範例Example 2

10	20	30
40	50	60
70	80	90



10	16.6	23.3	30
30	36.6	43.3	50
50	56.6	63.3	70
70	76.6	83.3	90

### 2-D 雙線性內插法 整理

#### Step1:縮放比例 (Scaling Ratio)

- ▶ 原始圖像尺寸:寬度w<sub>1</sub>,高度h<sub>1</sub>
- ▶ 目標圖像尺寸:寬度w<sub>2</sub>,高度h<sub>2</sub>

$$S_{x} = \frac{w_{1} - 1}{w_{2} - 1} \qquad S_{y} = \frac{h_{1} - 1}{h_{2} - 1}$$

#### Step2:映射到原圖

要算目標圖F(x',y')的值 先算映射到原圖的f(x,y)

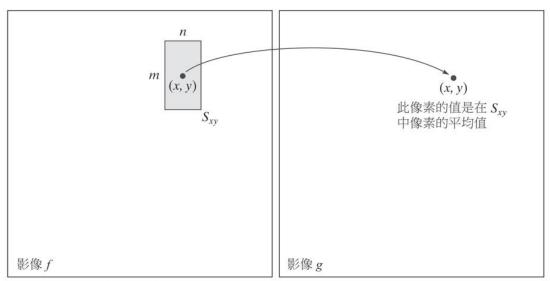
$$x = x' \times S_x$$
$$y = y' \times S_y$$

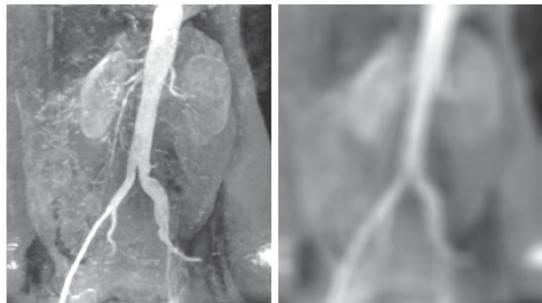
#### Step3:計算目標圖值

$$x_1 = [x]$$
  $x_2 = [x]+1$   $b=x-[x]$   $y_1 = [y]$   $y_2 = [y]+1$   $a=y-[y]$ 
 $Q_1:f(x_1, y_1)$ 
 $Q_2: f(x_2, y_1)$ 
 $Q_3: f(x_1, y_2)$ 
 $Q_4: f(x_2, y_2)$ 

$$F(x', y') = (1-b) \times [(1-a) \times Q_1 + a \times Q_3] + b \times [(1-a) \times Q_2 + a \times Q_4]$$

# 2.5 空間運算: 鄰域運算





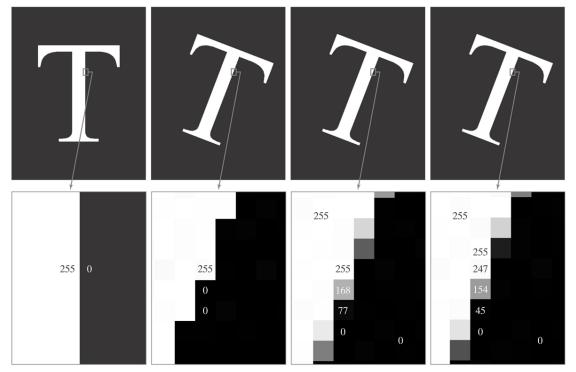
### 平均

$$g(x, y) = \frac{1}{mn} \sum_{(r, c) \in S_{xy}} f(r, c)$$

# 2.5 空間運算: 仿射轉換

表 2.1 依據 (2-23) 式的仿射轉換

轉換名稱	仿射矩陣 A	座標方程式	例 子
恆等式	$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$	x' = x $y' = y$	y' y'
尺度調整/翻轉(對於翻轉,將一個尺度因子設成-1且其它設成0)	$\begin{bmatrix} c_x & 0 & 0 \\ 0 & c_y & 0 \\ 0 & 0 & 1 \end{bmatrix}$	$x' = c_x x$ $y' = c_y y$	y' x'
旋轉(對原點)	$\begin{bmatrix} \cos\theta & -\sin\theta & 0\\ \sin\theta & \cos\theta & 0\\ 0 & 0 & 1 \end{bmatrix}$	$x' = x\cos\theta - y\sin\theta$ $y' = x\sin\theta + y\cos\theta$	x'
平移	$\begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x + t_x$ $y' = y + t_y$	y' y'
切變(垂直)	$\begin{bmatrix} 1 & s_{\nu} & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x + s_{\upsilon} y$ $y' = y$	y' y'
切變 (水平)	$\begin{bmatrix} 1 & 0 & 0 \\ s_h & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x$ $y' = s_h x + y$	<i>y'</i>



a b c d e f g h

**圖 2.29** (a) 字母 T 的  $541 \times 421$  影像;(b) 用最近鄰插補法做強度指定給經旋轉  $-21^\circ$  的影像;(c) 用雙線性插補法使影像旋轉  $-21^\circ$ ;(d) 用雙立方插補法使影像旋轉  $-21^\circ$ 。(e)~(h) 放大部分 ( 每個方形是一個像素,而所顯示的數字是強度值 )。

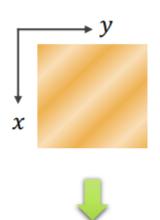
$$[x \ y \ 1] = [v \ w \ 1] \mathbf{T} = [v \ w \ 1] \begin{bmatrix} t_{11} & t_{12} & 0 \\ t_{21} & t_{22} & 0 \\ t_{31} & t_{32} & 1 \end{bmatrix}$$

### Identity transformation

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Identity

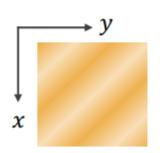
$$\mathbf{A} = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

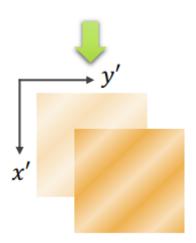


$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Translation

$$\mathbf{A} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix}$$

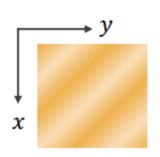


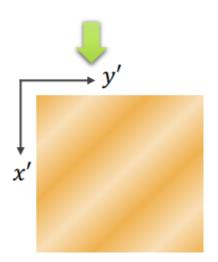


$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Scaling

$$\mathbf{A} = \begin{bmatrix} c_x & 0 & 0 \\ 0 & c_y & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

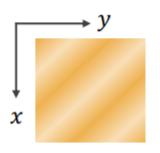


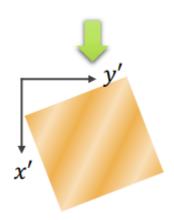


$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Rotation

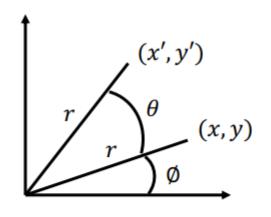
$$\mathbf{A} = \begin{bmatrix} \cos \theta & -\sin \theta & 0 \\ \sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix}$$





#### Rotation

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} \cos \theta & -\sin \theta & 0 \\ \sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$



$$x = r \cos \emptyset \qquad x' = r \cos(\emptyset + \theta)$$

$$y = r \sin \emptyset \qquad y' = r \sin(\emptyset + \theta)$$

$$x' = r \cos(\emptyset) \cos(\theta) - r \sin(\emptyset) \sin(\theta)$$

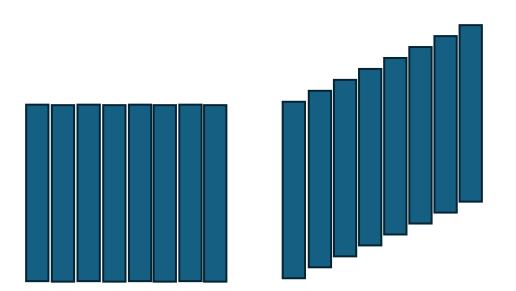
$$y' = r \sin(\emptyset) \cos(\theta) + r \cos(\emptyset) \sin(\theta)$$

$$x' = x \cos(\theta) - y \sin(\theta)$$

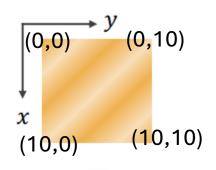
$$y' = x \sin(\theta) + y \cos(\theta)$$

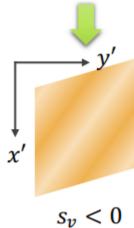
$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

### Shearing (vertical)



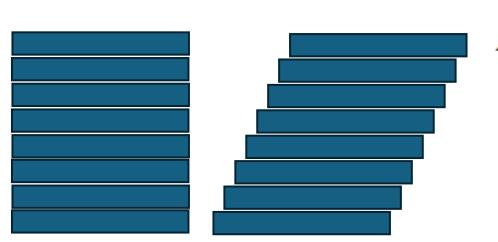
$$\mathbf{A} = \begin{bmatrix} 1 & s_v & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$



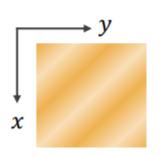


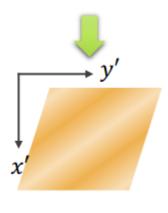
$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Shearing (horizontal)



$$\mathbf{A} = \begin{bmatrix} 1 & 0 & 0 \\ s_h & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$





$$s_{h} < 0$$

Forward mapping

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \mathbf{A} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Backward mapping

$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \mathbf{A}^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

#### Problem 2.37

(a) The forward scaling transformations is:

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} c_x & 0 & 0 \\ 0 & c_y & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

and the corresponding inverse transformation is

$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} 1/c_x & 0 & 0 \\ 0 & 1/c_y & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

(b) The forward translation transformation is

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

and the corresponding inverse transformation is

$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & -t_x \\ 0 & 1 & -t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

(c) The forward vertical shear transformation is

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & s_y & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

and the corresponding inverse transformation is

$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & -s_y & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

Similarly for horizontal shear,

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 \\ s_k & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 \\ -s_k & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

(d) The forward rotation transformation is

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} \cos\theta & -\sin\theta & 0 \\ \sin\theta & \cos\theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y \\ 1 \end{bmatrix}$$

and the corresponding inverse rotation transformation is

$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} \cos \theta & \sin \theta & 0 \\ -\sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

(e) A composite translation/rotation transformation is

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos \theta & -\sin \theta & 0 \\ \sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos \theta & -\sin \theta & t_x \\ \sin \theta & \cos \theta & t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

and the corresponding inverse transformation is

$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} \cos\theta & \sin\theta & 0 \\ -\sin\theta & \cos\theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & -t_x \\ 0 & 1 & -t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} \cos\theta & \sin\theta & -t_x\cos-t_y\sin\theta \\ -\sin\theta & \cos\theta & t_x\sin\theta-t_y\sin\theta \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

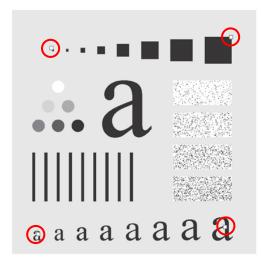
Note the order of the matrices in the forward vs the inverse composite transformations.

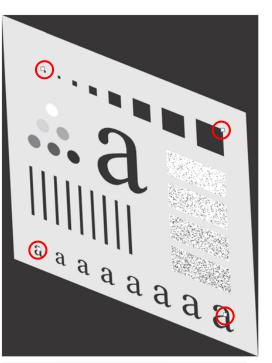
$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = A \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

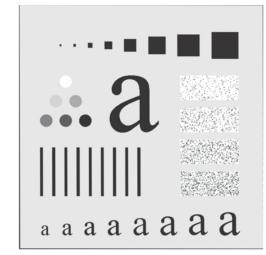
$$\begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = A^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

### a b c d

#### 圖 2.31









$$x = c_1 \upsilon + c_2 w + c_3 \upsilon w + c_4$$

$$y = c_5 v + c_6 w + c_7 v w + c_8$$

×4組

# 小考

- 2.6 (a) (b) 線性索引
- 2.14 (a)~(e) 仿射