Geometrijsketransformacije i interpolacija

Sadržaj

- Osnovne globalne geometrijske transformacije
 - Translacija
 - Skaliranje
 - Rotiranje
 - Nakošenje
 - Opća afina transformacija
 - Projekcijska transformacija
- Homogene koordinate
- Unaprijedna i unatražna transformacija
- Interpolacija
 - Najbližim susjedom
 - Bilinearna
 - Bikubična
- Radijalna distorzija
- Deformacijska polja

Slikovne transformacije

Ulazna slika: f(x,y) Izlazna slika: g(x,y)

a) Transformacije intenziteta:

```
g(x,y) = Tr(f(x,y))
```

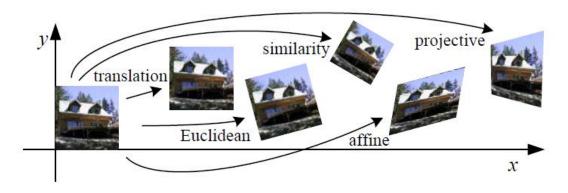
- mijenja kodomenu slike (engl. range) intenzitete piksela
- -> ne proučavamo ovdje, njima se bavi područje obrade slike (≠ računalni vid)

b) Geometrijske transformacije (engl. warping):

```
g(x,y) = f(Td(x,y))
```

- mijenja domenu (engl. domain) lokacije piksela / oblik slike
- ovdje se bavimo njima

Hijerarhija geometrijskih transformacija

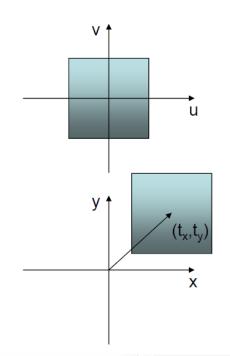


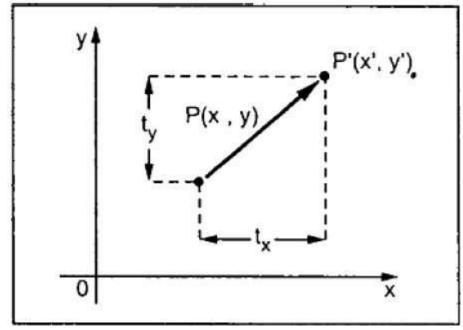
Transformation	Matrix	# DoF	Preserves	Icon
translation	$egin{bmatrix} \mathbf{I} & \mathbf{t} \end{bmatrix}_{2 imes 3}$	2	orientation	
rigid (Euclidean)	$egin{bmatrix} \mathbf{R} & \mathbf{t} \end{bmatrix}_{2 imes 3}$	3	lengths	\Diamond
similarity	$\begin{bmatrix} s\mathbf{R} & \mathbf{t} \end{bmatrix}_{2\times 3}$	4	angles	\Diamond
affine	$\left[\mathbf{A}\right]_{2\times3}$	6	parallelism	
projective	$\left[ilde{\mathbf{H}} ight]_{3 imes 3}$	8	straight lines	

(Szeliski 2022)

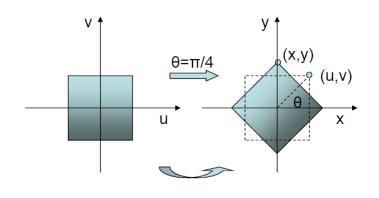
Translacija

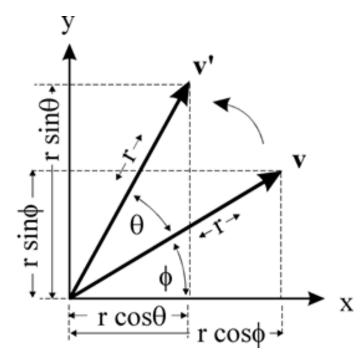
Inverzna translacija:





Rotacija





(https://math.stackexchange.com/questions/346672 /2d-rotation-of-point-about-origin)

$$x = r \cos \phi$$
; $y = r \sin \phi$

Konačna točka: v'=(x',y')

$$x' = r \cos(\phi + \theta)$$

$$x' = r\cos\phi\cos\theta - r\sin\phi\sin\theta$$

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

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

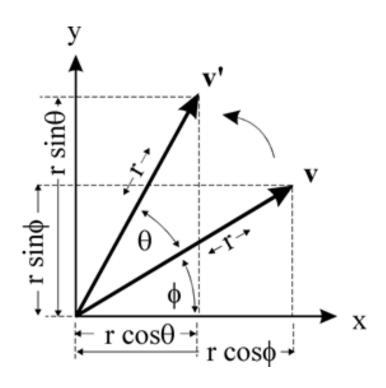
$$y' = r \sin(\phi + \theta)$$

$$y' = r \cos \phi \sin \theta + r \sin \phi c$$

$$y' = r \cos \phi \sin \theta + r \sin \phi \cos \theta$$

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

Inverzna rotacija



Inverzna rotacija = rotacija za $-\theta$ Vrijedi:

$$\sin(-\theta) = -\sin \theta$$
$$\cos (-\theta) = \cos \theta$$

pa je:

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

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

(https://math.stackexchange.com/questions/34 6672/2d-rotation-of-point-about-origin)

Skaliranje

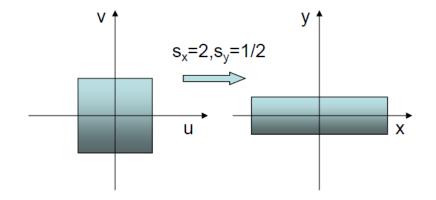
$$x' = Sx*x$$
$$y' = Sy*y$$

• Opći slučaj:

$$\begin{bmatrix} x' \\ y' \end{bmatrix} = \begin{bmatrix} Sx & 0 \\ 0 & Sy \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

• Jednoliko u oba smjera:

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



Inverzno skaliranje

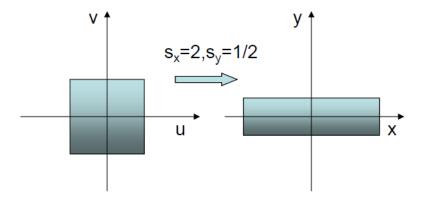
$$x = (1/Sx)*x'$$
$$y = (1/Sy)*y'$$



$$\begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} 1/Sx & 0 \\ 0 & 1/Sy \end{bmatrix} \begin{bmatrix} x' \\ y' \end{bmatrix}$$

• Jednoliko:

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



Nakošenje

- (engl. skew, shear)
- Horizontalno:

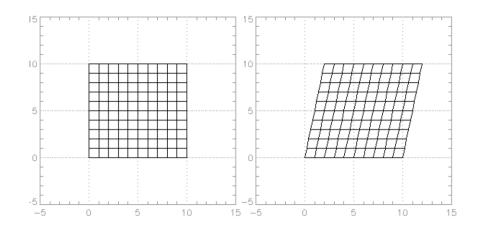
$$x' = x + a*y$$
$$y' = y$$

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

• Vertikalno:

$$x' = x$$
$$y' = y + a*x$$

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



Inverzno nakošenje

• Horizontalno:

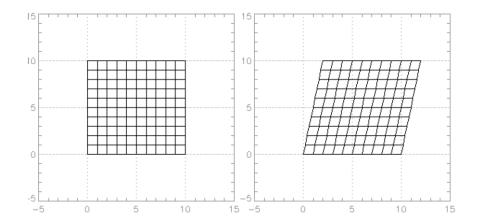
$$x' = x - a^*y$$
$$y' = y$$

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

• Vertikalno:

$$x' = x$$
$$y' = y - ax$$

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



Opća afina transformacija

Kombinacija skaliranja, rotacije, nakošenja i translacije

$$\begin{bmatrix} x' \\ y' \end{bmatrix} = \begin{bmatrix} a11 & a12 \\ a21 & a22 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} tx \\ ty \end{bmatrix}$$

Možemo pisati:

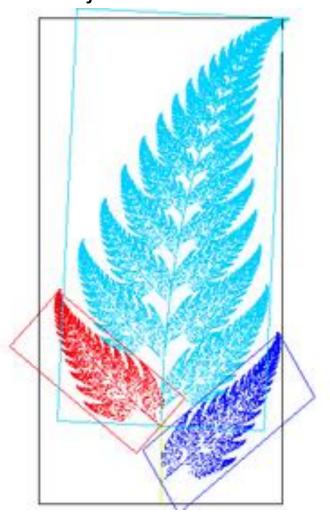
$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} a11 & a12 & tx \\ a21 & a22 & ty \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = A \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

$$A = \begin{bmatrix} RSW | T \\ 0 \ 0 \ | 1 \end{bmatrix}$$

(R, S i W su matrice, redom, rotacije, skaliranja i nakošenja, a T vektor pomaka (translacije))

Inverz:

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



Transformation Name	Affine Matrix, A	Coordinate Equations	Example
Identity	$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$	x' = x $y' = y$	y'
Scaling/Reflection (For reflection, set one scaling factor to -1 and the other to 0)	$egin{bmatrix} c_x & 0 & 0 \ 0 & c_y & 0 \ 0 & 0 & 1 \end{bmatrix}$	$x' = c_x x$ $y' = c_y y$	x'
Rotation (about the origin)	$\begin{bmatrix} \cos \theta & -\sin \theta & 0 \\ \sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x \cos \theta - y \sin \theta$ $y' = x \sin \theta + y \cos \theta$	y'
Translation	$\begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x + t_x$ $y' = y + t_y$	y'
Shear (vertical)	$\begin{bmatrix} 1 & s_v & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x + s_v y$ $y' = y$	y'
Shear (horizontal)	$\begin{bmatrix} 1 & 0 & 0 \\ s_h & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$	$x' = x$ $y' = s_h x + y$	y'

Afine transformacije

(Gonzales & Woods, 2018)

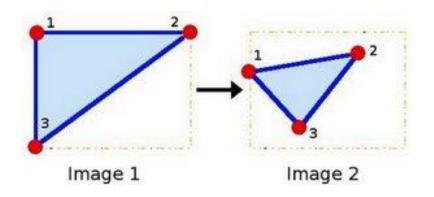
Određivanje afine transformacije

$$\bullet \begin{bmatrix} x' \\ y' \end{bmatrix} = \begin{bmatrix} a11 & a12 \\ a21 & a22 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} tx \\ ty \end{bmatrix}$$

- Potrebno odrediti 6 nepoznanica:
 a11, a12, a21, a22, tx i ty
- Uz poznata 3 para korespodentnih točaka (3 nekolinearne točke u izvornoj slici i odgovarajuće 3 točke u transformiranoj slici) možemo postaviti sustav 6 jednadžbi s 6 nepoznanica:

$$a11x1 + a12y1 + tx = x1'$$

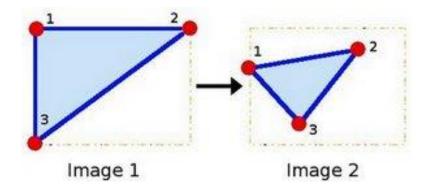
 $a21x1 + a22y1 + ty = y1'$
 $a11x2 + a12y2 + tx = x2'$
 $a21x2 + a22y2 + ty = y2'$
 $a11x3 + a12y3 + tx = x3'$
 $a21y3 + a22y3 + ty = y3'$



Određivanje afine transformacije

$$a11x1 + a12y1 + tx = x1'$$

 $a21x1 + a22y1 + ty = y1'$
 $a11x2 + a12y2 + tx = x2'$
 $a21x2 + a22y2 + ty = y2'$
 $a11x3 + a12y3 + tx = x3'$
 $a21y3 + a22y3 + ty = y3'$



Matrični zapis:

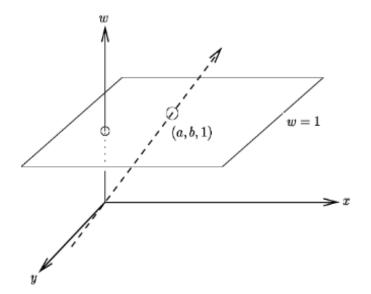
$$\begin{bmatrix} x1 & y1 & 0 & 0 & 1 & 0 \\ 0 & 0 & x1 & y1 & 0 & 1 \\ x2 & y2 & 0 & 0 & 1 & 0 \\ 0 & 0 & x2 & y2 & 0 & 1 \\ x3 & y3 & 0 & 0 & 1 & 0 \\ 0 & 0 & x3 & y3 & 0 & 1 \end{bmatrix} \begin{bmatrix} a11 \\ a12 \\ a21 \\ a22 \\ tx \\ ty \end{bmatrix} = \begin{bmatrix} x1' \\ y1' \\ x2' \\ y2' \\ x3' \\ y3' \end{bmatrix}$$

$$Ax = b = np.linalg.solve(A,b)$$

Homogene koordinate

$$\bullet \begin{bmatrix} x \\ y \end{bmatrix} \to \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} \to \begin{bmatrix} \widetilde{w}x \\ \widetilde{w}y \\ \widetilde{w} \end{bmatrix} \to \begin{bmatrix} \widetilde{x} \\ \widetilde{y} \\ \widetilde{w} \end{bmatrix}$$

- Nazad u nehomogene: $x = \frac{\tilde{x}}{\tilde{w}}$; $y = \frac{\tilde{y}}{\tilde{w}}$
- Geometrijska interpretacija
 - Prelazimo u 3D prostor $(\tilde{x}, \tilde{y}, \tilde{w})$
 - Ravnina $\widetilde{w}=1$ predstavlja izvornu 2D ravninu
 - Sve točke na pravcu iz ishodišta 3D koord. sustava kroz točku u ravnini $\widetilde{w} = 1$ smatraju se ekvivalentnima
- Omogućuju matrični zapis (3x3 matricama) složenijih transformacija (projektivna tr. – homografija); prikaz točaka u beskonačnosti

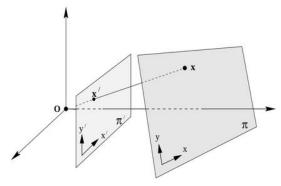


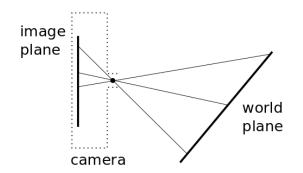
Projekcijska transformacija (homografija) u 2D

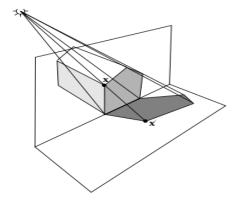
- Preslikavanje između dviju ravnina u prostoru kroz jednu točku
- *Opisana 3x3 matricom u homogenim koordinatama:*

$$\begin{bmatrix} \widetilde{x}' \\ \widetilde{y}' \\ \widetilde{w}' \end{bmatrix} = \begin{bmatrix} h11 & h12 & h13 \\ h21 & h22 & h23 \\ h31 & h32 & h33 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = H \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

• 8 stupnjeva slobode (**ne** 9) (zbog ekvivalencije skaliranih homogenih koordinata, možemo podijeliti obje strane jednadžbe proizvoljnom konstantom i fiksirati jedan od elemenata h_{ij} na proizvoljnu vrijednost (npr. h_{33} na 1)







Projekcijska transformacija (homografija) u 2D

$$\begin{bmatrix} \widetilde{x'} \\ \widetilde{y'} \\ \widetilde{w'} \end{bmatrix} = \begin{bmatrix} h11 & h12 & h13 \\ h21 & h22 & h23 \\ h31 & h32 & h33 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

•
$$\widetilde{x}' = h11x + h12y + h13$$

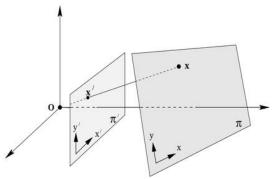
•
$$\widetilde{y}' = h21x + h22y + h23$$

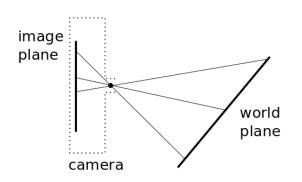
•
$$\widetilde{w}' = h31x + h32y + h33$$

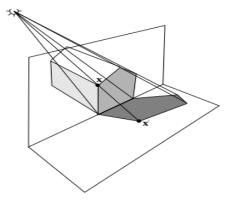
• U nehomogenim koordinatama:

•
$$x' = \frac{h11x + h12y + h13}{h31x + h32y + h33}$$

• $y' = \frac{h21x + h22y + h23}{h31x + h32y + h33}$







Projekcijska transformacija (homografija) u 2D

$$\begin{bmatrix} \widetilde{x'} \\ \widetilde{y'} \\ \widetilde{w'} \end{bmatrix} = \begin{bmatrix} h11 & h12 & h13 \\ h21 & h22 & h23 \\ h31 & h32 & h33 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$



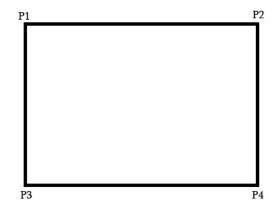
- Pravci ostaju pravci
- Nije sačuvana paralelnost pravaca
- Nisu sačuvani kutovi, orijentacija, duljina

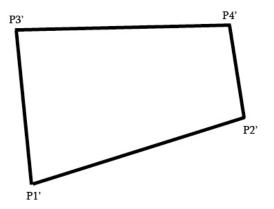
Inverzna projekcijska transformacija u 2D

$$\bullet \begin{bmatrix} x \\ y \\ w \end{bmatrix} = H^{-1} \begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix}$$

• H je matrica izvorne projekcijske transformacije

- 8 nepoznanica -> potrebno min. 8 jednadžbi
- Potrebno ustanoviti korespodencije četiriju parova točaka (pri čemu nikoje 3 nisu kolinearne)





Za 1 par korespodentnih točaka vrijedi:

$$\begin{bmatrix} x' \\ y' \\ w' \end{bmatrix} = \begin{bmatrix} h11 & h12 & h13 \\ h21 & h22 & h23 \\ h31 & h32 & h33 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

$$x' = \frac{h11x + h12y + h13}{h31x + h32y + h33}$$

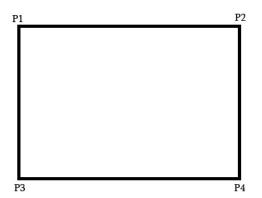
$$y' = \frac{h21x + h22y + h23}{h31x + h32y + h33}$$

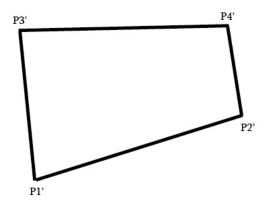
$$(h31x + h32y + h33)x' = h11x + h12y + h13$$

 $(h31x + h32y + h33)y' = h21x + h22y + h23$

$$h31xx' + h32yx' + h33x' = h11x + h12y + h13$$

 $h31xy' + h32yy' + h33y' = h21x + h22y + h23$

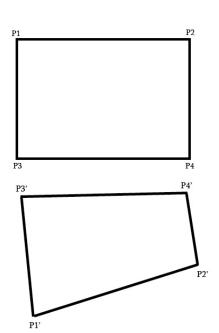




$$h31xx' + h32yx' + h33x' = h11x + h12y + h13$$

 $h31xy' + h32yy' + h33y' = h21x + h22y + h23$

 Sve korespodencije mogu se napisati u matričnom obliku (homogeni sustav):



$$\begin{bmatrix} -x1 & -y1 & -1 & 0 & 0 & 0 & x1x1' & y1x1' & x1' \\ 0 & 0 & 0 & -x1 & -y1 & -1 & x1y1' & y1y1' & y1' \\ -x2 & -y2 & -1 & 0 & 0 & 0 & x2x2' & y2x2' & x2' \\ 0 & 0 & 0 & -x2 & -y2 & -1 & x2y2' & y2y2' & y2' \\ -x3 & -y3 & -1 & 0 & 0 & 0 & x3x3' & y3x3' & x3' \\ 0 & 0 & 0 & -x3 & -y3 & -1 & x3y3' & y3y3' & y3' \\ -x4 & -y4 & -1 & 0 & 0 & 0 & x4x4' & y4x4' & x4' \\ 0 & 0 & 0 & -x4 & -y4 & -1 & x4y4' & y4y4' & y4' \end{bmatrix} \begin{bmatrix} h11 \\ h12 \\ h13 \\ h21 \\ h22 \\ h23 \\ h31 \\ h32 \\ h33 \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}$$

$$\begin{bmatrix} -x1 & -y1 & -1 & 0 & 0 & 0 & x1x1' & y1x1' & x1' \\ 0 & 0 & 0 & -x1 & -y1 & -1 & x1y1' & y1y1' & y1' \\ -x2 & -y2 & -1 & 0 & 0 & 0 & x2x2' & y2x2' & x2' \\ 0 & 0 & 0 & -x2 & -y2 & -1 & x2y2' & y2y2' & y2' \\ -x3 & -y3 & -1 & 0 & 0 & 0 & x3x3' & y3x3' & x3' \\ 0 & 0 & 0 & -x3 & -y3 & -1 & x3y3' & y3y3' & y3' \\ -x4 & -y4 & -1 & 0 & 0 & 0 & x4x4' & y4x4' & x4' \\ 0 & 0 & 0 & -x4 & -y4 & -1 & x4y4' & y4y4' & y4' \end{bmatrix} \begin{bmatrix} h11 \\ h12 \\ h13 \\ h22 \\ h23 \\ h31 \\ h32 \\ h31 \\ h32 \\ h33 \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}$$

- Zanima nas netrivijalno rješenje (trivijalno rješenje je svi hij=0)
- Netrivijalno rješenje nije jedinstveno (8 jednadžbi, 9 nepoznanica)
 no sva se razlikuju samo za faktor skale te su ekvivalentna
 (homogene koordinate koje se razlikuju za faktor skale predstavljaju
 jednake nehomogene koordinate)

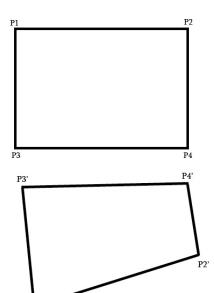
Drugi način formulacije – fiksirajmo jedan parametar (npr. h33) => nehomogeni sustav jednadžbi 8x8

$$\begin{bmatrix} x' \\ y' \\ w' \end{bmatrix} = \begin{bmatrix} h11 & h12 & h13 \\ h21 & h22 & h23 \\ h31 & h32 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$
$$h31xx' + h32yx' + x' = h11x + h12y + h13$$

$$h31xx' + h32yx' + x' = h11x + h12y + h13$$

$$h31xy' + h32yy' + y' = h21x + h22y + h23$$

$$\begin{bmatrix} -x1 & -y1 & -1 & 0 & 0 & 0 & x1x1' & y1x1' \\ 0 & 0 & 0 & -x1 & -y1 & -1 & x1y1' & y1y1' \\ -x2 & -y2 & -1 & 0 & 0 & 0 & x2x2' & y2x2' \\ 0 & 0 & 0 & -x2 & -y2 & -1 & x2y2' & y2y2' \\ -x3 & -y3 & -1 & 0 & 0 & 0 & x3x3' & y3x3' \\ 0 & 0 & 0 & -x3 & -y3 & -1 & x3y3' & y3y3' \\ -x4 & -y4 & -1 & 0 & 0 & 0 & x4x4' & y4x4' \\ 0 & 0 & 0 & -x4 & -y4 & -1 & x4y4' & y4y4' \end{bmatrix} \begin{bmatrix} h11 \\ h12 \\ h13 \\ h21 \\ h22 \\ h23 \\ h31 \\ h32 \end{bmatrix} = \begin{bmatrix} -x1' \\ -y1' \\ -x2' \\ -y2' \\ -x3' \\ -y3' \\ -x4' \\ -y4' \end{bmatrix}$$



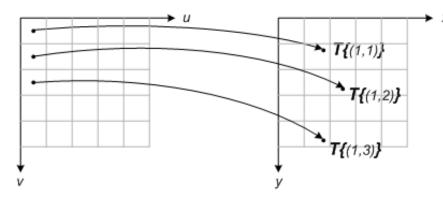
Primjena geometrijskih transformacija

• Unaprijedna transformacija (engl. forward warp)

procedure $forwardWarp(f, \mathbf{h}, \mathbf{out} g)$:

For every pixel x in f(x)

- 1. Compute the destination location $\mathbf{x}' = \mathbf{h}(\mathbf{x})$.
- 2. Copy the pixel $f(\mathbf{x})$ to $g(\mathbf{x}')$.



^x Problemi:

- transformirani piksel upada "između piksela" odredišne slike (necjelobrojne koordinate)
- (2) Susjedni pikseli izvorišne slike preslikavaju se u ne-susjedne piksele u odredišnoj slici (ostaju **praznine** u odredišnoj slici)

Input space

Output space

(https://blogs.mathworks.com/steve/2006/04/28/spatial-transforms-forward-mapping/)

Unaprijedna transformacija - primjer







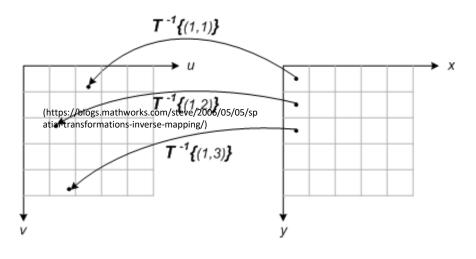
Primjena geometrijskih transformacija

• Unatražna transformacija (engl. backward warp)

 $\mathbf{procedure}\ inverseWarp(f,\mathbf{h},\mathbf{out}\ g) :$

For every pixel \mathbf{x}' in $g(\mathbf{x}')$

- 1. Compute the source location $\mathbf{x} = \hat{\mathbf{h}}(\mathbf{x}')$
- 2. Resample $f(\mathbf{x})$ at location \mathbf{x} and copy to $g(\mathbf{x}')$



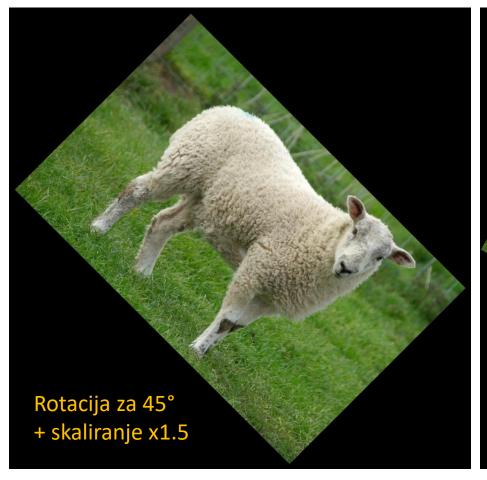
- I dalje moguć problem necjelobrojnih koordinata – lako se rješava interpolacijom
- Nema praznina među pikselima odredišne slike

Input space

Output space

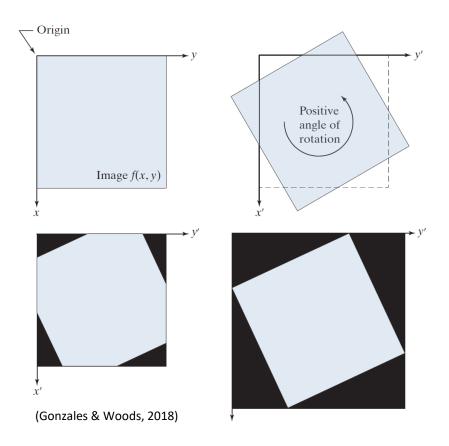
Unatražna transformacija - primjer







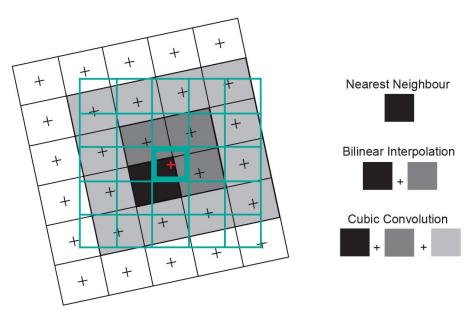
Primjena geometrijskih transformacija



Dimenzije transformirane slike:

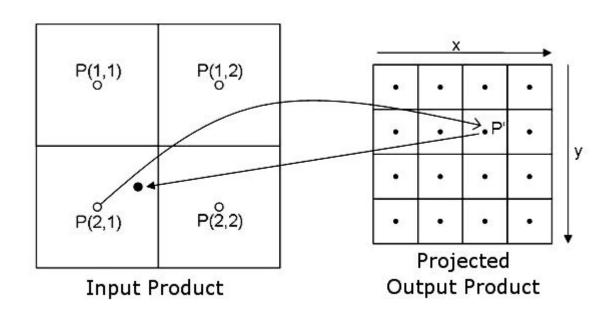
- a) Zadržavanje izvornih dimenzija uz odsijecanje "viška"
- b) Proširenje dimenzija tako da cijela transformirana slika stane
- Nedefinirani pikseli odredišne slike (oni kojih nema u izvorišnoj) ostaju crni

- Procjena nepoznatih vrijednosti korištenjem poznatih vrijednosti u susjedstvu
 - a) Interpolacija najbližim susjedom
 - b) Bilinearna interpolacija
 - c) Bikubična interpolacija



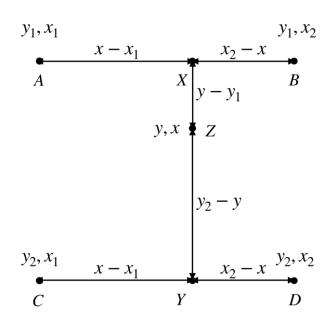
https://ltb.itc.utwente.nl/498/concept/81586

 Interpolacija najbližim susjedom (engl. nearest neighbour interpolation)



$$I(x + \Delta x, y + \Delta y) = I(round(x + \Delta x), round(y + \Delta y))$$

Bilinearna interpolacija (engl. bilinear interpolation)



•
$$I(x,y1) = \frac{x^{2-x}}{x^{2-x_1}}I(x1,y1) + \frac{x^{-x_1}}{x^{2-x_1}}I(x2,y1)$$

•
$$I(x,y1) = \frac{x^{2-x}}{x^{2-x1}}I(x1,y1) + \frac{x-x1}{x^{2-x1}}I(x2,y1)$$

• $I(x,y2) = \frac{x^{2-x}}{x^{2-x1}}I(x1,y2) + \frac{x-x1}{x^{2-x1}}I(x2,y2)$

•
$$I(x,y) = \frac{y^{2-y}}{y^{2-y_1}}I(x,y_1) + \frac{y^{-y_1}}{y^{2-y_1}}I(x,y_2)$$

- Bilinearna interpolacija (engl. bilinear interpolation)
- Kombiniranjem prethodnih triju jednadžbi dobivamo:

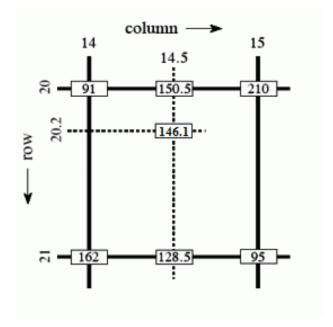
$$I(x,y) = \frac{y^{2-y}}{y^{2-y1}} \frac{x^{2-x}}{x^{2-x1}} I(x1,y1)$$

$$+ \frac{y^{2-y}}{y^{2-y1}} \frac{x^{-x1}}{x^{2-x1}} I(x2,y1)$$

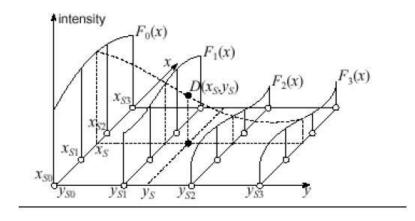
$$+ \frac{y^{-y1}}{y^{2-y1}} \frac{x^{2-x}}{x^{2-x1}} I(x1,y2)$$

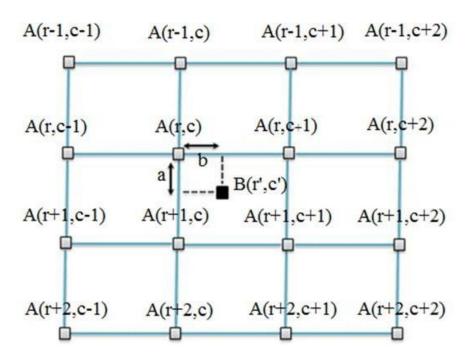
$$+ \frac{y^{-y1}}{y^{2-y1}} \frac{x^{-x1}}{x^{2-x1}} I(x2,y2)$$

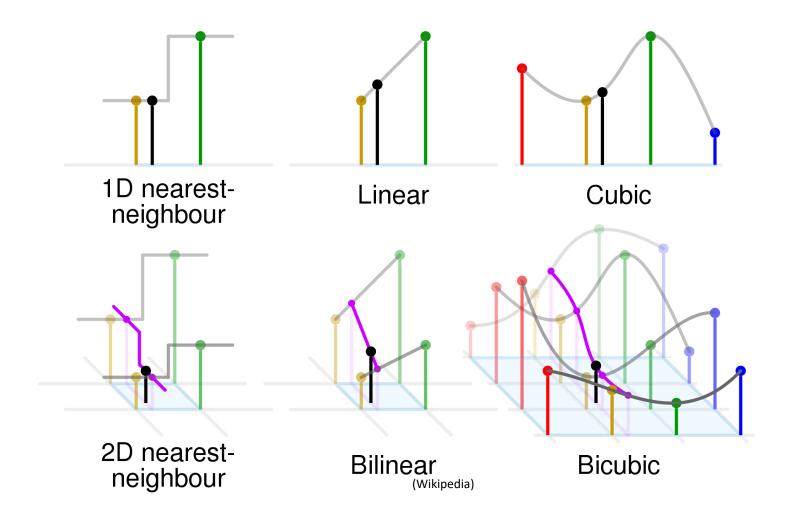
Primjer za sivu sliku:



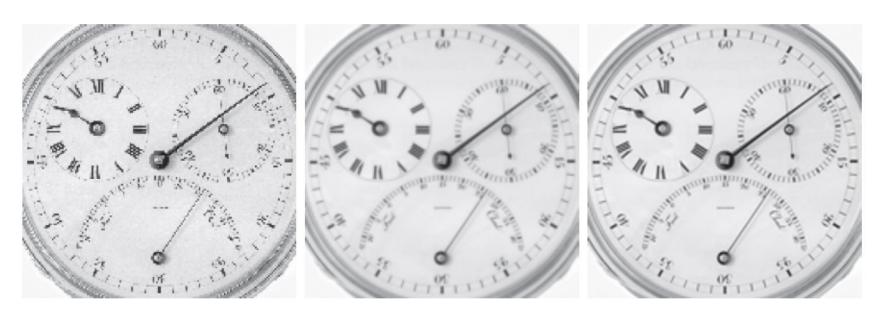
- Bikubična interpolacija (engl. bicubic interpolation)
- Koristi 16 (4x4) susjednih piksela
- Za svaki od 4 retka kubična krivulja kroz 4 točke: $I(x) = ax^3 + bx^2 + cx + d$
- Odredimo I(x, yi) za svaki stupac (yi) -> nove 4 točke -> kubična krivulja kroz njih
- Očitamo I(x, y) za tražene koordinate







Interpolacija – primjer 1

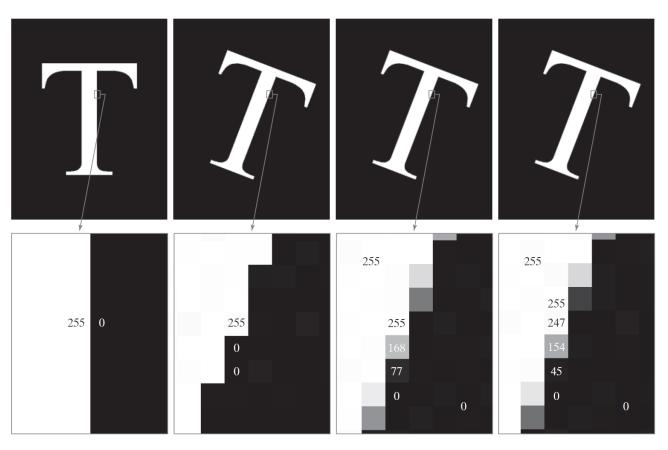


(Gonzales & Woods, 2018)

Redom, slijeva na desno:

- Interpolacija najbližim susjedom
- Bilinearna interpolacija
- Bikubična interpolacija

Interpolacija – primjer 2



Redom, slijeva na desno:

- Originalna slika
- Tri rotirane slike
 - Interpolacija najbližim susjedom
 - Bilinearna interpolacija
 - Bikubična interpolacija

(Gonzales & Woods, 2018)

Radijalna distorzija

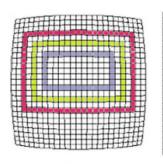
- Leće uzrokuju radijalnu distorziju slike
- Osobito vidljivo kod širokokutnih ("fish eye") leća
- Bačvasta (engl. barrel) ili jastučasta (engl. pincushion)

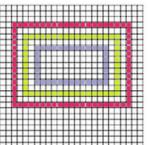


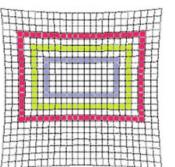














Radijalna distorzija - korekcija

Označimo nekorigiranu (distortiranu) točku:

$$p_d = (x_d, y_d)$$

• Korigirana točka:

$$p_u = (x_u, y_u)$$

$$x_u = c_x + (x_d - c_x)(1 + \kappa_1 r_d^2 + \kappa_2 r_d^4)$$

$$y_u = c_x + (y_d - c_y)(1 + \kappa_1 r_d^2 + \kappa_2 r_d^4)$$

gdje je:

$$(c_x, c_y)$$
 središte slike
$$r_d = \sqrt{(x_d - c_x)^2 + (y_d - c_y)^2}$$

Deformacijska polja

- Neparametarske transformacije
- Za svaki odredišni piksel zadan vektor pomaka prema izvorišnom pikselu

