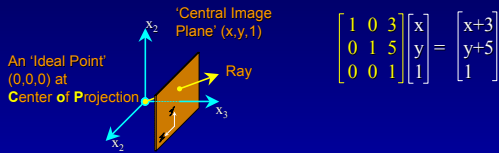


IBMR: Week 2 B 2-D Projective Geometry

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Useful 3D Graphics Ideas

- Every xy point describes a 3D ray in (x_1, x_2, x_3)
- 'Phantom' dimension x_3 is the 'z-buffer' value
- Homogeneous coords allows translation matrix:



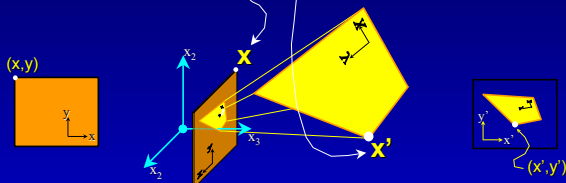
- (BUT a 3x3 transform in \mathbb{R}^3 Euclidean Space (x, y, z) can't translate—only rotate, scale, skew!)
$$\begin{bmatrix} 1 & 0 & 3 \\ 0 & 1 & 5 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \end{bmatrix} = \begin{bmatrix} x+z \\ y+z \\ z \end{bmatrix}$$

Projective Transform H

2D image (x, y)
 \rightarrow
Homog. coords
 $[x, y, 1]^T = \mathbf{x}$

Apply the
3x3 matrix H
 $H\mathbf{x} = \mathbf{x}'$

Homog. coords
 $\mathbf{x}' = [x', y', 1]^T$
 \rightarrow
2D image (x', y')



Projective Transform: $Hx = x'$

Finding H from point pairs (correspondences)

$$\begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = \begin{bmatrix} x'_1 \\ x'_2 \\ x'_3 \end{bmatrix} \quad \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} \quad \begin{array}{l} \text{Input (or output)} \\ \text{image is on} \\ \text{central plane} \end{array}$$

$$x' = \frac{x'_1}{x'_3} = \frac{h_{11}x + h_{12}y + h_{13}}{h_{31}x + h_{32}y + h_{33}}$$

$$y' = \frac{x'_2}{x'_3} = \frac{h_{21}x + h_{22}y + h_{23}}{h_{31}x + h_{32}y + h_{33}}$$

Write R^2 expressions;

$$x' (h_{31}x + h_{32}y + h_{33}) = (h_{11}x + h_{12}y + h_{13}) \quad \text{Rearrange, solve as}$$

$$y' (h_{31}x + h_{32}y + h_{33}) = (h_{21}x + h_{22}y + h_{23}) \quad \text{a matrix problem...}$$

Projective Transform: $Hx = x'$

Finding H from point pairs (correspondences)

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$$x' = \frac{x'_1}{x'_3} = \frac{h_{11}x + h_{12}y + h_{13}}{h_{31}x}$$

$$y' = \frac{x'_2}{x'_3} = \frac{h_{21}x}{h_{31}x}$$

But don't do this—you'll get better results using l_∞ or conics methods... expressions;

$$x' (h_{31}x + h_{32}y + h_{33}) = (h_{11}x + h_{12}y + h_{13}) \quad \text{Rearrange, solve as}$$

$$y' (h_{31}x + h_{32}y + h_{33}) = (h_{21}x + h_{22}y + h_{23}) \quad \text{a matrix problem...}$$

Projective Transform: H

- Can also transform Lines:

- Recall point x is on line l iff $x^T l = 0 = \begin{bmatrix} x_1 & x_2 & x_3 \end{bmatrix} \begin{bmatrix} a \\ b \\ c \end{bmatrix}$
- Lines transform 'covariantly' (points: 'contravariantly': $x' = Hx$)

$$l' = H^{-T} l$$

- And transform Conics:

- Recall point x is on a conic curve defined by C iff $x^T C x = 0$

$$C' = H^{-T} C H^{-1}$$

Projective Transform: H

- Comp. Graphics 'View interpolation' notion
 - Fixed, rigid 2D viewing point, viewing plane
 - Rigid 2D world plane positioned in 3D (x_1, x_2, x_3)
 - **only 6 DOF**: world plane rotate & position.
- Comp. Vision 'Projective Transform' notion
 - Fixed, rigid 2D viewing point, viewing plane
 - 'Stretchy' 2D world plane: allow affine changes
 - result: (up to) **8 DOF**

The bits and pieces of H

H has 8 independent variables (DOF)

- Computer Graphics method (3x3 matrix):
 - 2D Translation (t_x, t_y)
 - 3D Scale (s_x, s_y, s_z)
 - 3D Rotation ($\theta_x, \theta_y, \theta_z$)
- Computer Vision method (2D projective):
 - Isometry--3DOF (2D translate t_x, t_y ; 2D rotate θ_z)
 - Similarity--4DOF (add uniform scale s ;))
 - Affine --6DOF (add orientable scale $s_{\theta_x}/s, s_{\theta_y}/s$)
 - Projective--8DOF (changes x_3 ; 3D-rotation-like)

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Affects only x_1, x_2

The bits and pieces of H

H has 8 independent variables (DOF)

- Decomposable into 3 useful parts: (pg 22)

$$\mathbf{H} = \mathbf{H}_S \mathbf{H}_A \mathbf{H}_P = \begin{bmatrix} s\mathbf{R} & \mathbf{t} \\ \mathbf{0}^T & 1 \end{bmatrix} \begin{bmatrix} \mathbf{K} & \mathbf{0} \\ \mathbf{0}^T & 1 \end{bmatrix} \begin{bmatrix} \mathbf{I} & \mathbf{0} \\ \mathbf{v}^T & v \end{bmatrix}$$

- Similarity \mathbf{H}_S :
 - 2D translate, rotate, uniform scale only (4DOF)
- Affine \mathbf{H}_A :
 - non-uniform scale (2DOF)
- Similarity \mathbf{H}_P :
 - Projective coupling for x_3 (2DOF)

The bits and pieces of H

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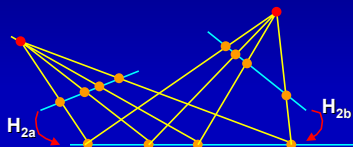
$$\mathbf{H} = \mathbf{H}_S \mathbf{H}_A \mathbf{H}_P = \begin{bmatrix} s \epsilon \cos \theta & -s \sin \theta & t_x & k_1 & k_3 & 0 \\ s \epsilon \sin \theta & s \cos \theta & t_y & k_2 & k_3 & 0 \\ 0 & 0 & 1 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} v_1 & v_2 & v_3 \end{bmatrix}$$

- Similarity \mathbf{H}_S :
 - 2D translate, rotate, uniform scale only (4DOF)
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- Similarity \mathbf{H}_P :
 - Projective coupling for x_3 (2DOF)

1-D Projective Geometry

(?Why? we use it later)

- A 'side' view of 2D projective geometry
- Convert \mathbf{R}^1 scalar \mathbf{b} to a 2-vector $\begin{bmatrix} b \\ 1 \end{bmatrix}$ in \mathbf{P}^1
- As with \mathbf{P}^2 , we can transform points:
 - (use various $\mathbf{H}_{2 \times 2}$'s to change white lines below)



1-D Projective Geometry

What is invariant here?

all the positions, lengths and ratios change with each transform...

Answer: 'Cross Ratio': $\text{cross}(a,b,c,d)$

• let $a = \begin{bmatrix} a_1 \\ a_2 \end{bmatrix}$, $b = \begin{bmatrix} b_1 \\ b_2 \end{bmatrix}$...

• THEN:

• $\text{cross} = \frac{|ab||cd|}{|ac||bd|}$

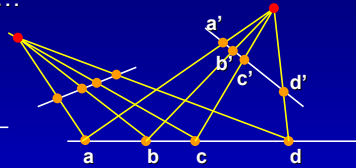


Image Rectifying: Undo parts of H

$$x' = H x \quad \text{where } H = H_S H_A H_P$$

GOAL: Put world plane x' into view plane

- Affine Rect.; (find only H_P (2DOF));
- Similarity Rect.; (find only $H_A H_P$ (6DOF));
- Full Rect.; (find all of H (8DOF));

METHODS: (mix & match?)

1. Full: 4-point correspondence
2. 'Vanishing Point', Infinity line methods
3. Conics and circular points

Image Rectifying: Undo parts of H

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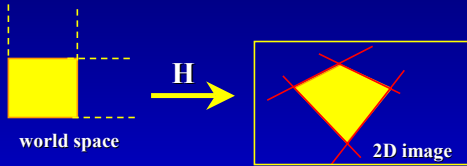
METHODS: (mix & match?)

1. Full: 4-point correspondence
2. 'Vanishing Point', Infinity
3. Conics and circular points

Other DOF? make assumptions, or ignore

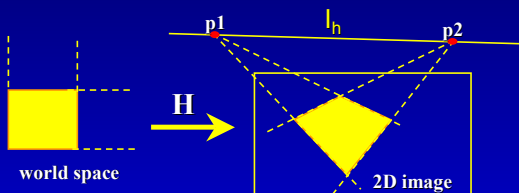
Vanishing-Point Methods: 1

- In 2D image, find two pairs of lines that are parallel in 'world' space.



Vanishing-Point Methods: 1

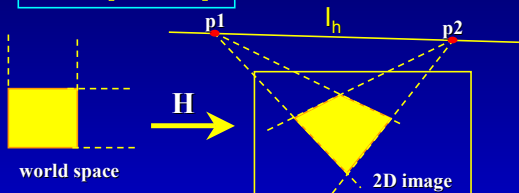
- Find intersection (vanishing points) p_1, p_2
(compute line intersections with 3D cross-products (see last lecture))
- Horizon line l_h connects p_1, p_2 .



Vanishing-Point Methods: 1

- H^{-T} transforms world infinity line $l_\infty \equiv (0,0,1)^T$ to l_h
- Answer (see book) copy the l_h coordinates!

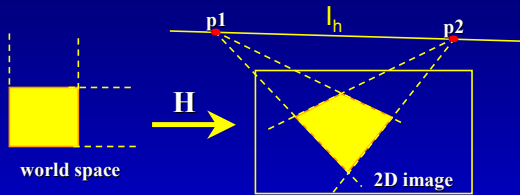
$$H_p = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ l_{h1} & l_{h2} & l_{h3} \end{bmatrix}$$



Vanishing-Point Methods: 1

Limitations:

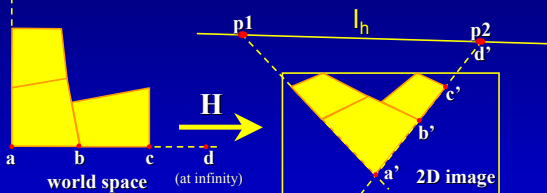
- Accurate point, line-finding can be tricky
- Can have high error sensitivity: 'twitchy'
- Only rectifies H_p - what if H_A , H_S needed?



Vanishing-Point Methods: 2

No parallel lines?

- find 2D image line with a known distance ratio
- Use Cross-Ratio (in P^1 along that line) to
- Find vanishing point distance at point d'



Conic Methods

- Better-behaved, easier to use(?)
- Determines $H_A H_P$ (4DOF) (all but 2D trans, rot, scale)

Go back and review conics first (pg.8)

- 'Conics' == intersection of cone & plane:
- Many possible shapes:
circles, ellipses, parabola, hyperbola,
degenerates (lines & points)

Conic Methods

– Equation of any/all conics solve a 2D quadratic:
 $ax^2 + bxy + cy^2 + dx + ey + f = 0$

– Write in homogeneous coordinates:

$$\begin{bmatrix} x_1 & x_2 & x_3 \end{bmatrix} \begin{bmatrix} a & b/2 & d/2 \\ b/2 & c & e/2 \\ d/2 & e/2 & f \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = 0$$

$$\mathbf{x}^T \mathbf{C} \mathbf{x} = 0$$

– C is symmetric, 5DOF (because x_3 scaling)

– Find any **C** from 5 homogeneous points

a 'Point Conic'

credit for rich space—see book pg 8

Conic Methods

– Matrix C makes conics from points:

$$\mathbf{x}^T \mathbf{C} \mathbf{x} = 0 \quad \mathbf{C} \text{ is a 'point conic'}$$

– Given a point **x** on a conic curve, the
homog. tangent line **l** is given by $\mathbf{l} = \mathbf{C} \mathbf{x}$

– Matrix C* makes conics from lines:

$$\mathbf{l}^T \mathbf{C}^* \mathbf{l} = 0 \quad \mathbf{C}^* \text{ is a 'Dual Conic'}$$

defined by tangent lines **l** instead of points.

Conic Methods

– If **C** is non-singular (rank 3), then $\mathbf{C}^* = \mathbf{C}^{-1}$

– If **C** (or **C***) has...

Rank 3: it is an ellipse, circle, parab., hyperb.

Rank 2: it is a pair of lines (forms an 'x')

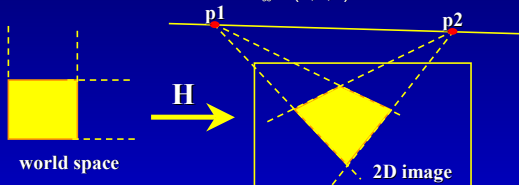
– Projective transform of a conic **C** is conic **C'**:

$$\mathbf{C}' = \mathbf{H}^T \mathbf{C} \mathbf{H}^{-1}$$

END

Vanishing-Point Methods: 1

- In 2D image, find two pairs of lines that are parallel in 'world' space.
- Find intersection (vanishing points) $p1, p2$
- Horizon line connects $p1', p2'$
- H^{-T} transforms world $l_{\infty} \equiv (0,0,1)^T$ to horizon



The bits and pieces of H

H has 8 independent variables (DOF)

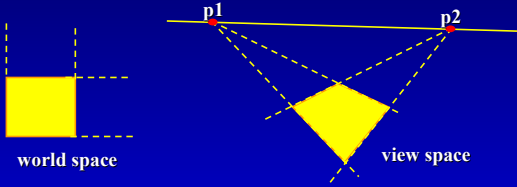
- Decomposable into 3 useful parts: (pg 22)

$$H_S H_A H_P = \begin{bmatrix} s \varepsilon \cos \theta & -s \sin \theta & t_x & k1 & k2 & 0 & 1 & 0 & 0 \\ s \varepsilon \sin \theta & s \cos \theta & t_y & k2 & k3 & 0 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 0 & 1 & v1 & v2 & v \end{bmatrix}$$

- Similarity H_S :
 - 2D translate, rotate, uniform scale only (4DOF)
- Affine H_A :
 - non-uniform scale (2DOF)
- Similarity H_P :
 - Projective coupling for x_3 (2DOF)

Vanishing-point Methods

- In 2D image, find two pairs of parallel lines.
- Find intersection (vanishing points) p_1, p_2
- H transforms them to 'ideal' points p_1', p_2'
 $p_1' = H p_1 = (x_1, x_2, 0)^T, p_2' = H p_2 = (x_2, x_2, 0)^T$
- Horizon line connects p_1', p_2'



Projective Transform H

Finding H from point pairs (correspondences)

- We know that $Hx' = x$, and
- we know at least 4 point pairs x' and x that satisfy it:
- **ATTEMPT 1:** 'plug & chug' make a matrix of x and x' values...

$$H x' = x$$

$$\begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} x'_1 \\ x'_2 \\ x'_3 \end{bmatrix} = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$$

$$H \begin{bmatrix} x'_1 & x'_2 & x'_3 & x'_4 \end{bmatrix} = \begin{bmatrix} x_1 & x_2 & x_3 & x_4 \end{bmatrix}$$

Projective Transform: $Hx = x'$

Finding H from point pairs (correspondences)

$$\begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = \begin{bmatrix} x'_1 \\ x'_2 \\ x'_3 \end{bmatrix}$$

$$\begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} \quad \begin{array}{l} \text{Input (or output)} \\ \text{image is on} \\ \text{central plane} \end{array}$$

$$\frac{x_1 h_{21} \quad x_2 h_{22} \quad x_3 h_{21}}{x_1 h_{31} \quad x_2 h_{32} \quad x_3 h_{33}}$$

$$\begin{matrix} x_1 h_{11} & x_2 h_{12} & x_3 h_{13} \\ x_1 h_{31} & x_2 h_{32} & x_3 h_{33} \end{matrix}$$

$$H \begin{bmatrix} x'_1 & x'_2 & x'_3 & x'_4 \end{bmatrix} = \begin{bmatrix} x_1 h_{11} & x_2 h_{12} & x_3 h_{13} \\ x_1 h_{21} & x_2 h_{22} & x_3 h_{21} \\ x_1 h_{31} & x_2 h_{32} & x_3 h_{33} \end{bmatrix} \begin{bmatrix} x_4 \\ x_4 \\ x_4 \end{bmatrix}$$

y'

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UNKNOWN!

$$H \begin{bmatrix} x'_1 & x'_2 & x'_3 & x'_4 \end{bmatrix} = \begin{bmatrix} x_1 & x_2 & x_3 & x_4 \end{bmatrix}$$

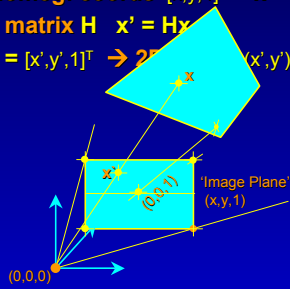
2D Projective Transform

View Interpolation ('Projective Transform')

- 2D image $(x,y) \rightarrow$ homog. coords $[x,y,1]^T = x$
- Transform by 3x3 matrix $H \quad x' = Hx$
- homog. coords $x' = [x',y',1]^T \rightarrow 2D$ image (x',y')

$$H x' = x$$

$$\begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} x'_1 \\ x'_2 \\ x'_3 \end{bmatrix} = \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$$



Projective Transform H

H matrix: Plane-to-Plane mapping

$$H x' = x$$

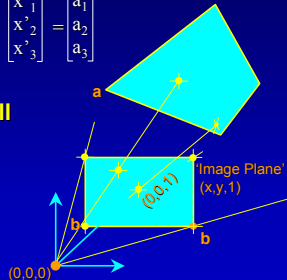
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$$x' = x_1/x_3$$

$$y' = x_2/x_3$$

Find H matrix that will move screen points from (x',y') to (x,y)

(CAREFUL! we don't know x_1, x_2, x_3 or x'_1, x'_2, x'_3 !)



Projective Transform H

H matrix: Plane-to-Plane mapping

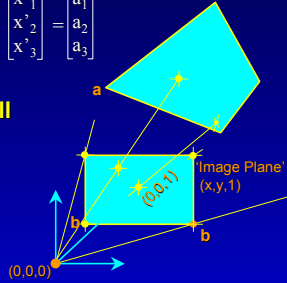
$$H \mathbf{x}' = \mathbf{x} \quad \begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} x'_1 \\ x'_2 \\ x'_3 \end{bmatrix} = \begin{bmatrix} a_1 \\ a_2 \\ a_3 \end{bmatrix}$$

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- Every xy point describes a 3D ray in (x_1, x_2, x_3)
- 'Phantom' dimension x_3 is the 'z-buffer' value
- Homogeneous coords allows translation matrix: BUT a 3×3 transform in (x,y,z) can't do translation

$$\begin{bmatrix} 0 & 0 & 3 \\ 0 & 0 & 5 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} x+3 \\ y+5 \\ 1 \end{bmatrix}$$

Projective Transform

