

CS 395/495-26: Spring 2002

IBMR: Week 9A

The Camera Matrix and World Geometry

Chapters 5, 6, 7 (partial)

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Reminders

[CTEC Online](#) – please add your comments...

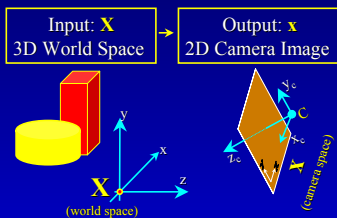
- Proj3 Due Thurs May 23
HW2 posted on website.
- HW2 due Thurs May 30
Proj4 posted on website.
HW 3 Assign Thu May 30
- Proj4 Due Tues June 11
- HW3 Due Tues June 11

Camera Matrix P links $P^3 \rightarrow P^2$

- K matrix: “internal camera calib. matrix”
- $R \cdot T$ matrix: “external camera calib. matrix”
 - T matrix: Translate world to cam. origin
 - R matrix: 3D rotate world to fit cam. axes
 - 11 DOF total

Combine: write
 $(P_0 \cdot R \cdot T) \cdot X = x$
as

$$P \cdot X = x$$



Uses for Camera Matrix P

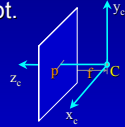
$$\mathbf{P} \cdot \mathbf{X} = \mathbf{x}, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad \mathbf{P} = \begin{bmatrix} \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} \mathbf{M} \\ \mathbf{p}_4 \end{bmatrix}$$

- P's Null Space: camera center **C** in world space
 $\mathbf{P} \cdot \mathbf{C} = \mathbf{0}$ (solve for C, get) $\mathbf{C} = \begin{bmatrix} -\mathbf{M}^T \cdot \mathbf{p}_4 \\ 1 \end{bmatrix}$
- P's **Columns**: $\mathbf{p}_1, \mathbf{p}_2, \mathbf{p}_3$, (and \mathbf{p}_4)
 world's x_w, y_w, z_w axis vanishing pts.
 (and origin) in image space
- P's **Rows**: $\mathbf{p}^{1T}, \mathbf{p}^{2T}, \mathbf{p}^{3T}$
 camera planes in world-space...

Uses for Camera Matrix P

$$\mathbf{P} \cdot \mathbf{X} = \mathbf{x}, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad \mathbf{P} = \begin{bmatrix} \mathbf{p}^1 & \mathbf{p}^2 & \mathbf{p}^3 & \mathbf{p}^4 \end{bmatrix}$$

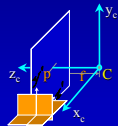
- Columns** of P matrix: Points in image-space:
- $\mathbf{p}^1, \mathbf{p}^2, \mathbf{p}^3$ == image of x, y, z axis vanishing points
 - Proof: let $\mathbf{D} = [1 \ 0 \ 0 \ 0]^T$ = point on x axis, at infinity
 - $\mathbf{P}\mathbf{D}$ = 1st column of P. Repeat for y and z axes
 - \mathbf{p}^4 == image of the world-space origin pt.
 - Proof: let $\mathbf{D} = [0 \ 0 \ 0 \ 1]^T$ = world origin
 - $\mathbf{P}\mathbf{D}$ = 4th column of **P** = image of origin pt.



Uses for Camera Matrix P

$$\mathbf{P} \cdot \mathbf{X} = \mathbf{x}, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad \mathbf{P} = \begin{bmatrix} \mathbf{p}^{1T} & \cdot & \cdot & \cdot \\ \mathbf{p}^{2T} & \cdot & \cdot & \cdot \\ \mathbf{p}^{3T} & \cdot & \cdot & \cdot \end{bmatrix}$$

- Rows** of P matrix: planes in world space
- row 1 = \mathbf{p}^1 = image x-axis plane
 - row 2 = \mathbf{p}^2 = image y-axis plane
 - **Careful!** Shifting image origin shifts the x,y axis planes!



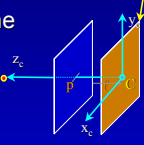
Uses for Camera Matrix P

$$P \cdot X = x, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad P = \begin{bmatrix} \cdot p^1T & \cdot \\ \cdot p^2T & \cdot \\ \cdot p^3T & \cdot \end{bmatrix}$$

Rows of P matrix: planes in world space

- row 1 = p^1 = image x-axis plane
- row 2 = p^2 = image y-axis plane
- row 3 = p^3 = camera's principal plane
 - princip. plane $p^3 = [p_{31} \ p_{32} \ p_{33} \ p_{34}]^T$
 - its normal vector: $[p_{31} \ p_{32} \ p_{33} \ 0]^T$
 - Why is it normal? It's the world-space endpoint of z_c axis (at infinity)

Principal plane p^3



Uses for Camera Matrix P

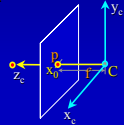
$$P \cdot X = x, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad P = \begin{bmatrix} m^1T & \cdot & \cdot & p^4 \\ m^2T & \cdot & \cdot & \cdot \\ m^3T & \cdot & \cdot & \cdot \end{bmatrix} \quad M$$

Principal Axis Vector in world space:

- Normal of principal plane: $m^3 = [p_{31} \ p_{32} \ p_{33} \ 0]^T$
- Scaling \rightarrow Ambiguous direction!! +/- m^3 ?
- Solution: use $\det(M) \cdot m^3$ as front of camera

Principal Point p in image space:

- image of (infinity point on z_c axis = m^3)
- $M \cdot m^3 = p = x_0$ (look renames p as x_0)



Uses for Camera Matrix P

$$P \cdot X = x, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad P = \begin{bmatrix} \cdot & \cdot & \cdot & p^4 \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} \quad M$$

Given image point x_0 and camera matrix P ,
Find ray $X(\mu)$ in world space through both:

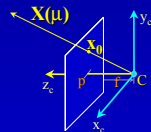
Slow, Obvious way: 'Pseudo-invert' P:

- Define pseudo-inverse P^+ as $P^+ = P^T(P P^T)^{-1}$ (note $P \cdot P^+ = I$)
- Find a world-space point on ray: $X_0 = P^+ x_0$
- LIRP with camera: $X(\mu) = C + (X_0 - C)\mu$

Better way:

- Find where ray from x hits infinity in world space:

$$X(\mu) = \mu M^{-1} x - C = \begin{bmatrix} M^{-1} (\mu x - p^4) \\ 1 \end{bmatrix}$$



Uses for Camera Matrix P

$$\mathbf{P} \cdot \mathbf{X} = \mathbf{x}, \text{ or } \begin{bmatrix} \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} \begin{bmatrix} x_w \\ y_w \\ z_w \\ t_w \end{bmatrix} = \begin{bmatrix} x_c \\ y_c \\ z_c \end{bmatrix} \quad \mathbf{P} = \begin{bmatrix} \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot \end{bmatrix} = \begin{bmatrix} \mathbf{M} & \mathbf{P}^d \end{bmatrix}$$

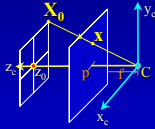
Given world-space point \mathbf{X}_0 , camera matrix \mathbf{P} ,
Find camera depth z_0 :

– $\mathbf{X}_0 = [x_w, y_w, z_w, t_w]^T$ seen thru camera is

$$\mathbf{X}_0 \cdot \mathbf{P} = \mathbf{x}_0 = [x_c, y_c, 1]^T \cdot w_c$$

– Then signed depth z_0 is:

$$z_0 = \frac{w_c \cdot \text{sign}(\det \mathbf{M})}{t_w \cdot \| \mathbf{m}^3 \|^2}$$



Skipped:

- $\mathbf{P} = [\mathbf{K}|\mathbf{0}]\cdot\mathbf{R}\cdot\mathbf{T}$ How can we separate K, R, T?
– Answer: K is triangular; use QR decomposition
- Cameras at Infinity:
 - Orthographic or 'Parallel Projection' Cameras
 - Transition to Orthographic:
 - Weak Perspective projection cameras
 - the 'zoom' lens (variable f)
 - Moving line-scan or 'pushbroom' cameras
 - Translation Scan: aerial/satellite cameras
 - Cylindrical Scan: panoramic cameras
 - UNC 'HiBall Tracker': 6 tiny self-locating line-scan cameras

Chapter 6 In Just One Slide:

Given point correspondence sets ($x_i \leftrightarrow X_i$), How do you find camera matrix \mathbf{P} ? (full 11 DOF)

Surprise! You already know how !

- DLT method:
 - rewrite $\mathbf{H} \mathbf{x} = \mathbf{x}'$ as $\mathbf{H} \mathbf{x} \times \mathbf{x}' = 0$
 - rewrite $\mathbf{P} \mathbf{X} = \mathbf{x}$ as $\mathbf{P} \mathbf{X} \times \mathbf{x} = 0$
 - vectorize, stack, solve $\mathbf{A} \mathbf{h} = 0$ for \mathbf{h} vector
 - vectorize, stack, solve $\mathbf{A} \mathbf{p} = 0$ for \mathbf{p} vector
 - Normalizing step removes origin dependence
- More data \rightarrow better results (at least 28 point pairs)
- Algebraic & Geometric Error, Sampson Error...

Chapter 7: More One-Camera Fun

Full 3x4 camera matrix \mathbf{P} maps $\mathbb{P}^3_{\text{world}}$ to $\mathbb{P}^2_{\text{image}}$
 ? What does it do to basic 3D world shapes?

- Plane
 - Given any point \mathbf{x}_π on a plane in \mathbb{P}^3 ,
 - Change world's coord. system: let plane be $z=0$:
 - Matrix \mathbf{P} reduces to 3x3 matrix \mathbf{H} in \mathbb{P}^2 :

$$\mathbf{x}_\pi = \mathbf{P} \cdot \mathbf{x}_\pi = \begin{bmatrix} p_{11} & p_{12} & p_{13} & p_{14} \\ p_{21} & p_{22} & p_{23} & p_{24} \\ p_{31} & p_{32} & p_{33} & p_{34} \end{bmatrix} \begin{bmatrix} x_\pi \\ y_\pi \\ 0 \\ t_\pi \end{bmatrix} = \begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} x_\pi \\ y_\pi \\ t_\pi \end{bmatrix}$$

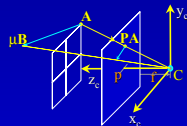
- THUS \mathbb{P}^2 can do all 3D plane transforms

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Forward Projection:

- Line / Ray in world \rightarrow Line/Ray in image:
 - Ray in \mathbb{P}^3 is $\mathbf{X}(\mu) = \mathbf{A} + \mu\mathbf{B}$
 - Camera changes to \mathbb{P}^2 : $\mathbf{x}(\mu) = \mathbf{P}\mathbf{A} + \mu\mathbf{P}\mathbf{B}$



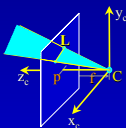
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Back Projection:

- Line L in image \rightarrow Plane π_L in world:
 - Recall: Line L in \mathbb{P}^2 (a 3-vector): $L = [x_1 \ x_2 \ x_3]^T$
 - Plane π_L in \mathbb{P}^3 (a 4-vector):

$$\pi_L = \mathbf{P}^T \cdot L = \begin{bmatrix} p_{11} & p_{21} & p_{31} \\ p_{12} & p_{22} & p_{32} \\ p_{13} & p_{23} & p_{33} \\ p_{14} & p_{24} & p_{34} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$$



- (SKIP Plücker Matrix lines...)

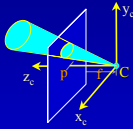
Chapter 7: More One-Camera Fun

Full 3x4 camera matrix \mathbf{P} maps $\mathbb{P}^3_{\text{world}}$ to $\mathbb{P}^2_{\text{image}}$
 ? What does it do to basic 3D world shapes?

- Conic \mathbf{C} in image \rightarrow Cone Quadric \mathbf{Q}_{co} in world

$$\mathbf{Q}_{\text{co}} = \mathbf{P}^T \cdot \mathbf{C} \cdot \mathbf{P}$$

- Tip of cone is camera center \mathbf{C}



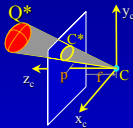
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Full 3x4 camera matrix \mathbf{P} maps $\mathbb{P}^3_{\text{world}}$ to $\mathbb{P}^2_{\text{image}}$
 ? What does it do to basic 3D world shapes?

- Dual Quadric \mathbf{Q}^* in world \rightarrow
 Dual Conic \mathbf{C}^* silhouette in image

$$\mathbf{C}^* = \mathbf{P}^T \cdot \mathbf{Q}^* \cdot \mathbf{P}$$

- **Works for ANY quadric!**
 sphere, cylinder, ellipsoid,
 paraboloid, hyperboloid, line, disk ...

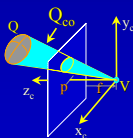


Chapter 7: More One-Camera Fun

Full 3x4 camera matrix \mathbf{P} maps $\mathbb{P}^3_{\text{world}}$ to $\mathbb{P}^2_{\text{image}}$
 ? What does it do to basic 3D world shapes?

- World -space cone from camera center \mathbf{V} to quadric \mathbf{Q} is the degenerate quadric \mathbf{Q}_{co} :

$$\mathbf{Q}_{\text{co}} = (\mathbf{V}^T \mathbf{Q} \mathbf{V}) \mathbf{Q} - (\mathbf{Q} \mathbf{V})(\mathbf{Q} \mathbf{V})^T$$



Chapter 7: More One-Camera Fun

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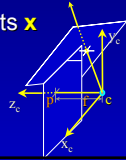
'Pure' Rotation:

- Given internal camera calibration \mathbf{K}
- 3D rotate camera \mathbf{P} about its center \mathbf{C} using 3D rotation matrix \mathbf{R} (3x3)

$$\begin{bmatrix} \alpha_x f & s & p_x & 0 \\ 0 & \alpha_y f & p_y & 0 \\ 0 & 0 & f & 0 \end{bmatrix}$$

- Get new points \mathbf{x}' from old image points \mathbf{x}

$$\mathbf{K} \cdot \mathbf{R} \cdot \mathbf{K}^{-1} \mathbf{x} = \mathbf{x}'$$



- aka 'conjugate rotation'
- use this to construct planar panoramas

END