# CMPUT 428: 3D Modelling

# Roderick Lan

# Contents

| 1 | Lect | ture - Feb 29                  | 2 |
|---|------|--------------------------------|---|
|   | 1.1  | Prelims; Macro Geometry        | 2 |
|   | 1.2  | Fundamental Problems           | 2 |
|   |      | 1.2.1 Resection                | 2 |
|   |      | 1.2.2 Intersection             | 2 |
|   |      | 1.2.3 SFM                      | 3 |
|   | 1.3  | Seq. 3D Structure From Motion  | 3 |
|   | 1.4  | 2 View Geometry                | 3 |
|   |      | 1.4.1 Epipolar Geometry        | 3 |
|   | 1.5  | Fundamental Matrix             | 4 |
|   |      | 1.5.1 Algebraic Derivation     | 4 |
|   |      | 1.5.2 Geometric Derivation     | 4 |
|   |      | 1.5.3 Correspondence Condition | 5 |
|   |      | 1.5.4 Summary                  | 5 |
|   |      | 1.5.5 Computing F              | 5 |
| 2 | Lect | ture - Mar 5                   | 5 |
|   | 2.1  | Fundamental Matrix (Summary)   | 5 |
|   | 2.2  | 3D geom and 2D images w/ F     | 6 |
|   | 2.3  | Compute F                      | 6 |
|   | 2.4  | Canonical Cameras given F      | 6 |
|   | 2.5  | Struct from imgs               | 7 |
|   | 2.6  | Linear Triangulation           | 7 |

# 1 Lecture - Feb 29

lec07modeling18EmbMedia.pdf

3D from video is:

- inexpensive
- quick and convenient for the user
- integrates with existing software (ie. maya, blender, c4d, ue4, etc.)

# 1.1 Prelims; Macro Geometry

Shape from silhouettes:

more = better

provides good starting approx. for object

Structure from motion:

uses triangulations to get 3d points

can be done with 'unstructured' imgs/scene (ie. from phone camera)

#### 1.2 Fundamental Problems

- 1. Resection of 3D camera matrices
- 2. Intersection
- 3. Structure From Motion (SFM)

#### 1.2.1 Resection

Projection Equation:

$$x_i = P_i X$$

Resection:

$$x_i, X \to P$$

Imagine you have x (ie. 3d model) and image  $x_i$  (projection of points on img). Finding camera = finding projection of rays that map 3d point to image point. Can have many potential camera planes that all map (?)

# 1.2.2 Intersection

Projection Equation:

$$x_i = P_i X$$

Intersection:

$$x_i, P_i \to X$$

Have  $\geq 2$  cameras; projections in  $\geq 2$  images. Intersect rays to get 3d points. Need to 'know' the camera properties.

#### 1.2.3 SFM

Projection Equation:

$$x_i = P_i X$$

Structure From Motion (SFM):

$$x_i \to P_i, X$$

Get image predictions  $(x_i)$  from point tracking.

Get image points in  $\geq 2$  views, calculate 3d points (structure) and camera projection matrices (motion)

Estimate projective structure

Rectify the reconstruction to metric (autocalibration)

(dont know the cameras; figure out constraints)

# 1.3 Seq. 3D Structure From Motion

Use 2 and 3 view geometry

- 1. Initialize structure and motion from 2 views
- 2. for each additional view:
  - (a) determine pose
  - (b) refine and extend structure
- 3. determine correspondences robustly by jointly estimating matchies and epipolar constraints

# 1.4 2 View Geometry

2 points in views  $x_i$ , comes from 3d point X. If you have camera center, know that ray from center to point extends to infinity; X lies somewhere on ray.

line connecting camera centers

epipole - intersecting point b/w line and image plane

epipolar line - line b/w imaged  $x_i$  and epipole

#### 1.4.1 Epipolar Geometry

C, C' x, x' and X are coplanar

Epipolar geometry exists independent of 3d point, only related to camera and 2d point projections.

There is a family of epipolar planes

Epipolar lines go towards parallel lines

Family of planes and lines intersect infinitely far apart.

Epipoles (e, e') can be finite or infinite

intersection of baseline with img plane

projection of projection center in other img

vanishing point of camera motion direction

Epipolar plane - plane containing baseline (1D family) Epipolar line - intersection of epipolar plane with image

# Example 1.4.1: Parallel Motion with img plane

Epipoles at infinity

#### 1.5 Fundamental Matrix

Algebraic representation of epipolar geometry.

$$\mathbf{x} \mapsto \mathbf{l}'$$

This mapping is a singular correlation; represented by fundamental matrix F  $3 \times 3$  matrix with 7 dof (8 independent ratios)

#### 1.5.1 Algebraic Derivation

Let x be PX

$$P^+x = P^+PX$$

Say that pseudoinverse represents line from center to point

$$\mathbf{X}(\lambda) = \mathbf{P}^{+}\mathbf{x} + \lambda \mathbf{C}$$
$$\mathbf{l}' = \mathbf{P}'\mathbf{C} \times \mathbf{P}'\mathbf{P}^{+}\mathbf{x}$$
$$F = [e']_{\times}P'P^{+}$$

 $\lambda$  is a scalar

 $[e']_{\times}$  skew symmetric cross product matrix (rank 2)

doesn't work for  $C = C' \Rightarrow F = 0$  (must have distinct camera centers)

Alternatively can write:

$$F = [e']_{\times} H_{\infty}$$
$$H_{\infty} = K^{-1} R K$$

#### 1.5.2 Geometric Derivation

Step 1: X on a plane  $\pi$ 

$$x' = H_{\pi}x$$

Step 2: Epipolar line l'

$$l' = e' \times x' = [e']_{\times} H_{\pi} x = Fx$$

Map from 2D to 1D family (rank 2)

(plane  $\pi$  can be different for each point, **unrelated** to epipolar plane)

# 1.5.3 Correspondence Condition

Exists 2D matrix that ouputs epipolar line.

If  $\mathbf{x}'$  lies on  $\mathbf{l}'$ ,  $\mathbf{x}'\mathbf{l}' = 0$ 

$$\mathbf{x}' \cdot \mathbf{F} \mathbf{x} = 0$$

**F** is the unique  $3 \times 3$  rank 2 matrix that satisfies

$$\mathbf{x}'^{\top} \mathbf{F} \mathbf{x} = 0 \quad \forall \mathbf{x} \leftrightarrow \mathbf{x}'$$

- 1. **Transpose**: if  $\mathbf{F}$  is a fundamental matrix for (P, P'),  $\mathbf{F}^{\top}$  is fundamental matrix for (P', P)
- 2. Epipolar Lines:  $\mathbf{l}' = \mathbf{F}\mathbf{x}$  and  $\mathbf{l} = \mathbf{F}^{\top}\mathbf{x}'$
- 3. Epipoles: on all epipolar lines,  $\mathbf{e}'^{\top} \mathbf{F} \mathbf{x} = \mathbf{0} \ \forall \mathbf{x}, \Rightarrow e'^{\top} F = 0$ , similarly  $\mathbf{F} \mathbf{e} = 0$
- 4. **F** has  $7\text{dof}(3 \times 3 1 \text{ (homog)}, -1 \text{ (rank 2)})$
- 5. **F** is a correlation, projective mapping from a point  $\mathbf{x}$  to a line  $\mathbf{l'} = \mathbf{F}\mathbf{x}$  (not a proper corr., ie. not invertible)

#### 1.5.4 Summary

Algebraic rep. of epipolar geom.

Step 1: **X** on plane  $\pi$ 

$$\mathbf{x}' = \mathbf{H}\mathbf{x}$$

Step 2: epipolar line l'

$$\begin{aligned} \mathbf{l}' &= \mathbf{e}' \times \mathbf{x}' = [\mathbf{e}']_{\times} \mathbf{x}' \\ &= [\mathbf{e}']_{\times} \mathbf{H} \mathbf{x} = \mathbf{F} \mathbf{x} \\ &\mathbf{x}'^{\top} \mathbf{F} \mathbf{x} = \mathbf{0} \end{aligned}$$

#### 1.5.5 Computing F

Use 8 points

$$\mathbf{x}'^{\top} \mathbf{F} \mathbf{x} = 0$$

(SLIDE 43-44)

# 2 Lecture - Mar 5

# 2.1 Fundamental Matrix (Summary)

get ray from point, real point could be any point that lies on ray, take multiple imgs and get intersection of rays to find point.

find mathematical nature of point b/w 2 views (?)

#### Definition 2.1.1: F

 $3 \times 3$  Rank 2, det(F) = 0

Linear solution - 8 corr. points (unique)

Nonlinear sol - 7 corr. points (3 sol)

Very sensitive to **noise** and **outliers** (need to know x and x' very precisely)

Epipolar Lines:

$$\mathbf{l}' = F\mathbf{x}, \ \mathbf{l} = F^{\top}\mathbf{x}'$$

Epipoles:

$$F\mathbf{e} = 0, F^{\mathsf{T}}\mathbf{e}' = 0$$

**Projection Matrices:** 

$$\begin{split} P &= \begin{bmatrix} I & | & \mathbf{0} \end{bmatrix} \\ P' &= \begin{bmatrix} [\mathbf{e}']_\times F + \mathbf{e}' \mathbf{v}^\top & | & \lambda \mathbf{e}' \end{bmatrix} \end{split}$$

# 2.2 3D geom and 2D images w/F

F relates to 3 questions:

- 1. Correspondence geometry given img point x in first view, how does this constrain the position of the corresponding point x' in the second image?
- 2. Camera geometry (motion) given a set of corresponding img points  $\{x_i \leftrightarrow x_i'\}, i = 1, ..., n$  what are the cameras P and P' for the two views
- 3. Scene geometry (structure) given corresponding image points  $x_i \leftrightarrow x_i'$  and cameras P, P', what is the position of (their pre-image) X in space

# 2.3 Compute F

(slide 43-44)

should normalize pixel values  $[0, \sqrt{2}]$ 

Trifocal tensor - 3 view geom

Quadrifocal tensor - 4 view geom

Multiview tensors

(no additional constraint b/w > 4 imgs, all constraints can be expressed using F, triliear tensor or quadrifocal tensor)

### 2.4 Canonical Cameras given F

F matrix corresponds to P, P' iff  $P'^{\top}FP$  is skew symmetric

$$X^{\top}P'^{\top}FPX = 0, \forall X$$

 ${\cal F}$ matrix,  ${\cal S}$ skew symmetric matrix

$$P = \begin{bmatrix} I & | & 0 \end{bmatrix}, P' = \begin{bmatrix} SF & | & e' \end{bmatrix}$$

Possible Choice:

$$P = \begin{bmatrix} I & | & 0 \end{bmatrix} \quad P' = \begin{bmatrix} [e']_{\times} F & | & e' \end{bmatrix}$$

Canonical Rep:

$$P = \begin{bmatrix} I & | & 0 \end{bmatrix} \quad P' = \begin{bmatrix} [e']_\times F + e'v^\top & | & \lambda e' \end{bmatrix}$$

# 2.5 Struct from imgs

compute points, triangulate position.

# 2.6 Linear Triangulation

(slide 49-51)

multiplicative and additive relationships in A not best for geometric error, good for algebraic error; sufficient to show theres a computational solution for computing 3d