# Photogrammetric Computer Vision

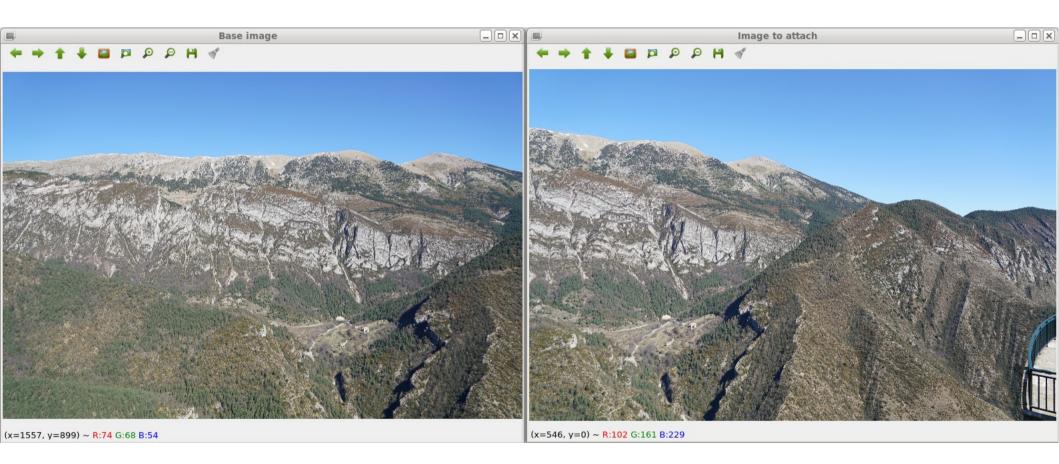
Berlin University of Technology (TUB), Computer Vision and Remote Sensing Group Berlin, Germany

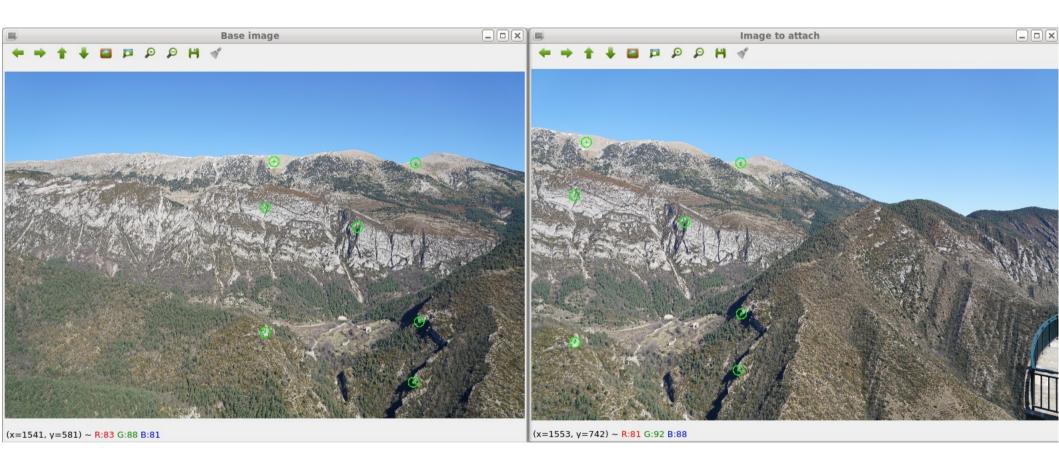


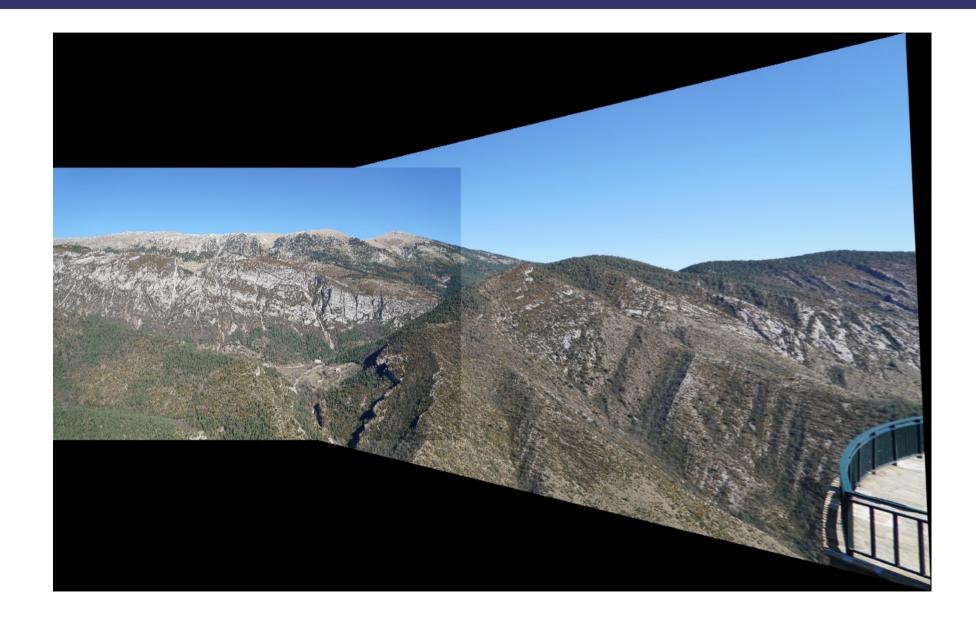
#### **Projective Transformation (Homography)**



In this exercise a fundamental projective transformation should be realized. The task consists of rectifying images geometrically and stitching them together, so that a panorama mosaic is generated.







#### 1. Image Acquisition:

Take pictures with a digital camera, which overlap horizontal at least 30 percent.

Produce three images without disparities (e.g. turn around the projection centre or choose a planar object).

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Take pictures with a digital camera, which overlap horizontal at least 30 percent.

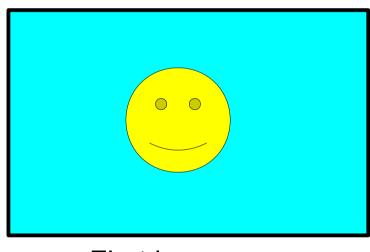
Produce three images without disparities (e.g. turn around the projection centre or choose a planar object).

#### 2. Correspondence Analysis:

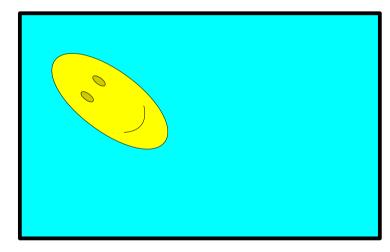
Transfer the three images into the computer and measure interactively at least four corresponding image points  $x \leftrightarrow x'$  between two neighbouring images.

#### 3. Homography Computation:

Implement C++-function to estimate a 2D homography using singular value decomposition. Compute the two necessary homography matrices.



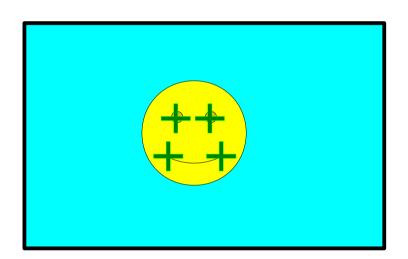
First image

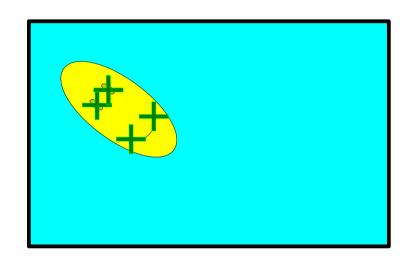


Second image

#### 3. Homography Computation:

Implement C++-function to estimate a 2D homography using singular value decomposition. Compute the two necessary homography matrices.

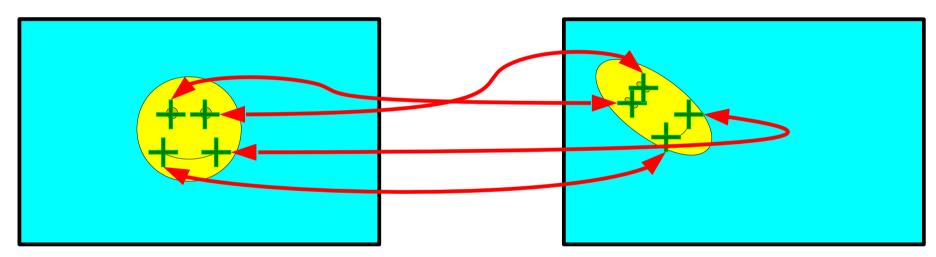




Measure image point pairs

#### 3. Homography Computation:

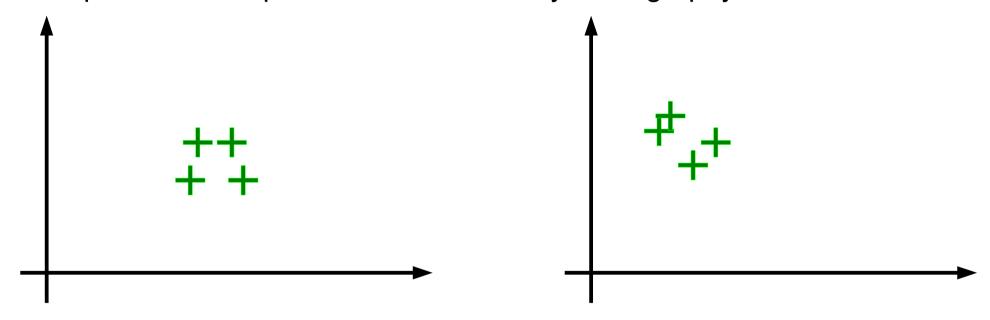
Implement C++-function to estimate a 2D homography using singular value decomposition. Compute the two necessary homography matrices.



Measure image point pairs

#### 3. Homography Computation:

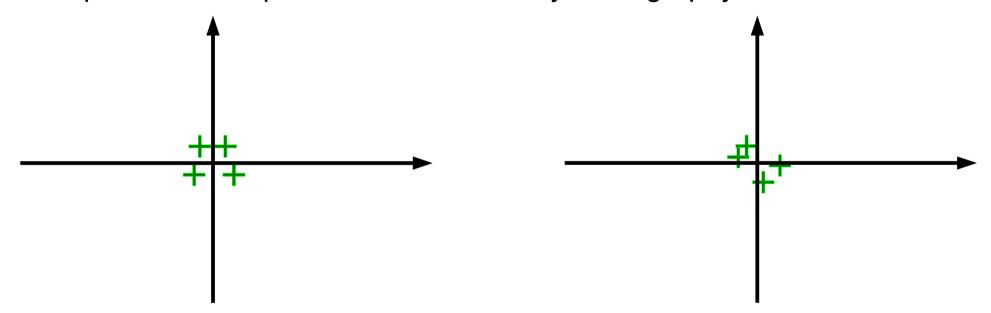
Implement C++-function to estimate a 2D homography using singular value decomposition. Compute the two necessary homography matrices.



Consider them as vectors

#### 3. Homography Computation:

Implement C++-function to estimate a 2D homography using singular value decomposition. Compute the two necessary homography matrices.



#### 1. Conditioning

- Translate the centroid of all points to the origin
- Scale mean distance to origin to one

$$T = \begin{bmatrix} \frac{1}{s_x} & 0 & \frac{-t_x}{s_x} \\ 0 & \frac{1}{s_y} & \frac{-t_y}{s_y} \\ 0 & 0 & 1 \end{bmatrix}$$



#### 3. Homography Computation:

Implement C++-function to estimate a 2D homography using singular value decomposition. Compute the two necessary homography matrices.

#### 2. Create design matrix

$$A_i = egin{bmatrix} - ilde{w}^{'} ilde{oldsymbol{x}}_i^T & extbf{0} & ilde{u}_i^{'} ilde{oldsymbol{x}}_i^T \ extbf{0} & - ilde{w}^{'} ilde{oldsymbol{x}}_i^T & ilde{v}_i^{'} ilde{oldsymbol{x}}_i^T \end{bmatrix}$$

$$x' = Hx$$

Homography equation for points (Note: for simplicity uncond. points are used)

$$x' = H x$$

$$\begin{bmatrix} u' \\ v' \\ w' \end{bmatrix} = \begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} u \\ v \\ w \end{bmatrix}$$

Homography equation for points (Note: for simplicity uncond. points are used)

Use definitions of x, x' and H

$$x' = H x$$

$$\begin{bmatrix} u' \\ v' \\ w' \end{bmatrix} = \begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} u \\ v \\ w \end{bmatrix}$$

$$u' = h_{11}u + h_{12}v + h_{13}w$$

$$v' = h_{21}u + h_{22}v + h_{23}w$$

$$w' = h_{31}u + h_{32}v + h_{33}w$$

Homography equation for points (Note: for simplicity uncond. points are used)

Use definitions of x, x' and H

Write as linear equation system

$$x' = H x$$

$$\begin{bmatrix} u' \\ v' \\ w' \end{bmatrix} = \begin{bmatrix} h_{11} & h_{12} & h_{13} \\ h_{21} & h_{22} & h_{23} \\ h_{31} & h_{32} & h_{33} \end{bmatrix} \begin{bmatrix} u \\ v \\ w \end{bmatrix}$$

$$u' = h_{11}u + h_{12}v + h_{13}w$$
  
 $v' = h_{21}u + h_{22}v + h_{23}w$   
 $w' = h_{31}u + h_{32}v + h_{33}w$ 

$$\frac{u'}{w'} = \frac{h_{11} u + h_{12} v + h_{13} w}{h_{31} u + h_{32} v + h_{33} w}$$

$$\frac{v'}{w'} = \frac{h_{21} u + h_{22} v + h_{23} w}{h_{31} u + h_{32} v + h_{33} w}$$

Homography equation for points (Note: for simplicity uncond. points are used)

Use definitions of x, x' and H

Write as linear equation system

Use transformation from homogeneous to Euclidean coordinates

$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) = w' \cdot (h_{11}u + h_{12}v + h_{13}w)$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) = w' \cdot (h_{21}u + h_{22}v + h_{23}w)$$
Rewrite

$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) = w' \cdot (h_{11}u + h_{12}v + h_{13}w)$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) = w' \cdot (h_{21}u + h_{22}v + h_{23}w)$$

$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{11}u + h_{12}v + h_{13}w) = 0$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{21}u + h_{22}v + h_{23}w) = 0$$
Rewrite

$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) = w' \cdot (h_{11}u + h_{12}v + h_{13}w)$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) = w' \cdot (h_{21}u + h_{22}v + h_{23}w)$$
Rewrite
$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{11}u + h_{12}v + h_{13}w) = 0$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{21}u + h_{22}v + h_{23}w) = 0$$

$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{21}u + h_{22}v + h_{23}w) = 0$$
Rewrite
$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{21}u + h_{22}v + h_{23}w) = 0$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{21}u + h_{22}v + h_{23}w) = 0$$

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Rewrite

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$$u' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{11}u + h_{12}v + h_{13}w) = 0$$

$$v' \cdot (h_{31}u + h_{32}v + h_{33}w) - w' \cdot (h_{21}u + h_{22}v + h_{23}w) = 0$$

$$u' \cdot h_{31}u + u' \cdot h_{32}v + u' \cdot h_{33}w - w' \cdot h_{11}u - w' \cdot h_{12}v - w' \cdot h_{13}w = 0$$

$$v' \cdot h_{31}u + v' \cdot h_{32}v + v' \cdot h_{33}w - w' \cdot h_{21}u - w' \cdot h_{22}v - w' \cdot h_{23}w = 0$$

$$-w' \cdot h_{11}u - w' \cdot h_{12}v - w' \cdot h_{13}w + u' \cdot h_{31}u + u' \cdot h_{32}v + u' \cdot h_{33}w = 0$$
Sort  $h_{ij}$ 

$$-w' \cdot h_{21}u - w' \cdot h_{22}v - w' \cdot h_{23}w + v' \cdot h_{31}u + v' \cdot h_{32}v + v' \cdot h_{33}w = 0$$

$$\begin{array}{c} u'\cdot(h_{31}u+h_{32}v+h_{33}w)=w'\cdot(h_{11}u+h_{12}v+h_{13}w)\\ v'\cdot(h_{31}u+h_{32}v+h_{33}w)=w'\cdot(h_{21}u+h_{22}v+h_{23}w)\\ u'\cdot(h_{31}u+h_{32}v+h_{33}w)-w'\cdot(h_{11}u+h_{12}v+h_{13}w)=0\\ v'\cdot(h_{31}u+h_{32}v+h_{33}w)-w'\cdot(h_{21}u+h_{22}v+h_{23}w)=0\\ \\ u'h_{31}u+u'h_{32}v+u'h_{33}w-w'h_{11}u-w'h_{12}v-w'h_{13}w=0\\ v'h_{31}u+v'h_{32}v+v'h_{33}w-w'h_{21}u-w'h_{22}v-w'h_{23}w=0\\ \\ -w'h_{11}u-w'h_{12}v-w'h_{13}w+u'h_{31}u+u'h_{32}v+u'h_{33}w=0\\ \\ -w'h_{21}u-w'h_{22}v-w'h_{23}w+v'h_{31}u+v'h_{32}v+v'h_{33}w=0\\ \\ -w'h_{11}u-w'h_{12}v-w'h_{13}w+0\cdot h_{21}+0\cdot h_{22}+0\cdot h_{23}\\ \\ +u'h_{31}u+u'h_{32}v+u'h_{33}w=0\\ \\ \hline 0\cdot h_{11}+0\cdot h_{12}+0\cdot h_{13}-w'h_{21}u-w'h_{22}v-w'h_{23}w\\ \\ +v'h_{31}u+v'h_{32}v+v'h_{33}w=0\\ \\ \hline \end{array} \qquad \begin{array}{c} \text{Rewrite}\\ \\ \text{Rewrite}\\ \\ \text{Rewrite}\\ \\ \text{North}\\ \\ \text{Sort}\\ \\ h_{ij}\\ \\ \text{O-coefficients}\\ \end{array}$$

$$\begin{bmatrix}
-w'u & -w'v & -w'w & 0 & 0 & 0 & u'u & u'v & u'w \\
\cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0 \\
\begin{bmatrix} 0 & 0 & -w'u & -w'v & -w'w & v'u & v'v & v'w \end{bmatrix} \\
\cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0$$

Write as vector

$$\begin{bmatrix} -w'u & -w'v & -w'w & 0 & 0 & 0 & u'u & u'v & u'w \end{bmatrix}$$

$$\cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0$$

$$\begin{bmatrix} 0 & 0 & -w'u & -w'v & -w'w & v'u & v'v & v'w \end{bmatrix}$$

$$\cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0$$

$$\begin{bmatrix} -w'x^{T} & \mathbf{0} & u'x^{T} \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0$$

$$\begin{bmatrix} \mathbf{0} & -w'x^{T} & v'x^{T} \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0$$

$$\begin{bmatrix} -w'u & -w'v & -w'w & 0 & 0 & 0 & u'u & u'v & u'w \\ \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \begin{bmatrix} 0 & 0 & 0 & -w'u & -w'v & -w'w & v'u & v'v & v'w \end{bmatrix} \\ \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \begin{bmatrix} -w'x^T & \mathbf{0} & u'x^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \begin{bmatrix} \mathbf{0} & -w'x^T & v'x^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \begin{bmatrix} -w'x^T & \mathbf{0} & u'x^T \\ \mathbf{0} & -w'x^T & v'x^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \end{bmatrix}$$

$$\begin{bmatrix} -w'x^T & \mathbf{0} & u'x^T \\ \mathbf{0} & -w'x^T & v'x^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \end{bmatrix}$$

$$\begin{bmatrix} -w'x^T & \mathbf{0} & u'x^T \\ \mathbf{0} & -w'x^T & v'x^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0 \\ \end{bmatrix}$$

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$$\begin{bmatrix} -w'u & -w'v & -w'w & 0 & 0 & 0 & u'u & u'v & u'w \end{bmatrix}$$
 Write as vector 
$$\begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0$$
 Use definition 
$$\begin{bmatrix} 0 & 0 & 0 & -w'u & -w'v & -w'w & v'u & v'v & v'w \end{bmatrix}$$
 
$$\cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0$$

Write as vector

$$\begin{bmatrix} -w' \mathbf{x}^T & \mathbf{0} & u' \mathbf{x}^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0$$

$$\begin{bmatrix} \mathbf{0} & -w' \mathbf{x}^T & v' \mathbf{x}^T \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^T = 0$$

$$\begin{bmatrix} -w' \mathbf{x}^{T} & \mathbf{0} & u' \mathbf{x}^{T} \\ \mathbf{0} & -w' \mathbf{x}^{T} & v' \mathbf{x}^{T} \end{bmatrix} \cdot \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{21} & h_{22} & h_{23} & h_{31} & h_{32} & h_{33} \end{bmatrix}^{T} = 0$$

Write as matrix

Ah=0

Homogeneous equation system



A corresponding homogeneous equation system  $A_i h = 0$  can be derived for every point pair  $(\mathbf{x}_i \leftrightarrow \mathbf{x}_i')$ .

For numerical reasons conditioned points  $(\tilde{x}_i \leftrightarrow \tilde{x}_i')$  are used.

Therefore:

$$A_{i} = \begin{bmatrix} -\tilde{w}_{i}^{'} \tilde{\boldsymbol{x}}_{i}^{T} & \mathbf{0} & \tilde{u}_{i}^{'} \tilde{\boldsymbol{x}}_{i}^{T} \\ \mathbf{0} & -\tilde{w}_{i}^{'} \tilde{\boldsymbol{x}}_{i}^{T} & \tilde{v}_{i}^{'} \tilde{\boldsymbol{x}}_{i}^{T} \end{bmatrix} \in \mathbb{R}^{2,9}$$

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And for N point pairs:

$$A = \begin{bmatrix} A_1 \\ \vdots \\ A_N \end{bmatrix} \in \mathbb{R}^{2N,9}$$

#### 3. Homography Computation:

Implement C++-function to estimate a 2D homography using the singular value decomposition. Compute the two necessary homography matrices.

2. Create design matrix

$$A_{i} = \begin{bmatrix} -\tilde{w}^{'} \tilde{\boldsymbol{x}}_{i}^{T} & \boldsymbol{0} & \tilde{u}_{i}^{'} \tilde{\boldsymbol{x}}_{i}^{T} \\ \boldsymbol{0} & -\tilde{w}^{'} \tilde{\boldsymbol{x}}_{i}^{T} & \tilde{v}_{i}^{'} \tilde{\boldsymbol{x}}_{i}^{T} \end{bmatrix}$$

3. Solve equation system with SVD

$$\mathbf{A}h = 0$$
  $\mathbf{h} = (a, b, c, d, e, f, g, h, j)^{T}$ 

#### 3. Homography Computation:

Implement C++-function to estimate a 2D homography using the singular value decomposition. Compute the two necessary homography matrices.

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3. Solve equation system with SVD

$$\mathbf{A}h = 0$$
  $\mathbf{h} = (a, b, c, d, e, f, g, h, j)^T$ 

4. Reshape and deconditioning

$$\mathbf{\tilde{H}} = \begin{bmatrix} a & b & c \\ d & e & f \\ g & h & j \end{bmatrix} \qquad \mathbf{H} = \mathbf{T}^{'-1} \mathbf{\tilde{H}} \mathbf{T}$$

#### 4. Projective Rectification:

Use the estimated homographies to adapt the first and the third image to the second one.

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#### 5. Visualization

Show the produced panorama image on the screen and save it to disk.

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Show the produced panorama image on the screen and save it to disk.

#### **Optional:**

Change code in order to

- 1) Process arbitrary number of images.
- 2) Find corresponding point pairs automatically.



# 2. Exercise - Part I: Theory

#### 2D Homography

- 1. Which conditions on the image acquisition have to be fulfilled in order to model the image transformation successfully as a 2D homography?
- 2. How many corresponding point pairs do you need to reconstruct a 2D homography?
- 3. Why should the homogeneous points be normalized before creating the design matrix?
- 4. What are possible reasons why the images don't align perfectly align?

## 2. Exercise - Part II: Practical

#### **2D Homography**

#### Given:

- Main function
  - Variable declaration
  - Call of necessary functions
- Header of individual functions
- Point selection
- Stitching function

#### Todo:

- Individual functions
  - Fill in the necessary function body parts
- Take three pictures
- Process them to a panorama
  - Include input pictures and output pictures in the submission

## 2. Exercise - Given

baseImg: Image data of first (base) image

attachImg: Image data of second image

p base: Output, points in first image (homogeneous coordinates)

p attach: Output, points in second image (homogeneous coordinates)

- Displays the two images in two individual windows.
- Catches left mouse clicks, stores position in corresponding array.
- Marks points in images by green circles.

## 2. Exercise - Given

Mat stitch(Mat& base, Mat& attach, Matx33f& H)

base: Image data and window title of first (base) image

attach: Image data and window title of second image

H: Computed homography that relates second to base image

return: The generated panorama image

- Takes two images and a corresponding homography
- Warps the second image according to the given transformation
- Copies both images into a single output image

## 2. Exercise - Reuse

Vec3f eucl2hom\_point\_2D(Vec2f& p)

p : point in Euclidean coordinates

return : same point in homogeneous coordinates

- Reuse your implementation from exercise 1

geomObj: the geometric objects, that have to be transformed

H: the homography of the transformation

type : determines the type of the geometric object (point/line)

return : the transformed objects

- Reuse your implementation from exercise 1

$$x' = H \cdot x$$



#### Matx33f getCondition2D(vector<Vec3f>& p)

p: N points as an array of 3D vectors

Homogeneous, but you may assume last component is 1

return: The 3x3 matrix for point conditioning

- Computes the transformation matrix to:
  - move centroid (mean) to origin
  - scale so mean absolute x-distance to origin is one
  - scale so mean absolute y-distance to origin is one

$$T = \begin{bmatrix} \frac{1}{s_x} & 0 & \frac{-t_x}{s_x} \\ 0 & \frac{1}{s_y} & \frac{-t_y}{s_y} \\ 0 & 0 & 1 \end{bmatrix}$$

Matx33f getCondition2D(vector<Vec3f>& p)

p: N points as an array of 3D vectors

Homogeneous, but you may assume last component is 1

return: The 3x3 matrix for point conditioning

geomObj: N geometric objects as 3 x N matrix (here: unconditioned points)

H: 3x3 transformation matrix

return: N geometric objects as 3 x N matrix (here: conditioned points)

- Reuse your implementation from exercise 1

 $x' = H \cdot x$ 

base: N conditioned points as array of 3D vectors from first image

attach: N conditioned points as array of 3D vectors from second image

return: Designmatrix to compute 2D homography

- Takes corresponding point pairs (already conditioned)
- Generates design matrix to compute 2D homography
- Make it work for arbitrary numbers of point pairs

$$A_i = egin{bmatrix} - ilde{w}^{'} ilde{oldsymbol{x}}_i^T & extbf{0} & ilde{u}_i^{'} ilde{oldsymbol{x}}_i^T \ extbf{0} & - ilde{w}^{'} ilde{oldsymbol{x}}_i^T & ilde{v}_i^{'} ilde{oldsymbol{x}}_i^T \end{bmatrix}$$

```
Matx33f solve_dlt_homography2D (Mat_<float>& A)
```

A: Design matrix representing homogeneous equation system Ah = 0

return: 2D homography

- Use SVD to solve homogeneous equation system

```
→ cv::SVD svd(A, SVD::FULL_UV)

→ svd.u Left singular vectors (not needed)

→ svd.w Singular values

→ svd.vt Transposed right singular values

→ Access: svd.vt.at<float>(row, col)

→ cv::SVD already sorts the singular values by size
```

- Reshape result into 3x3 matrix

Matx33f decondition\_homography2D(Matx33f& T\_base, Matx33f&
T\_attach, Matx33f& H)

T\_base: Condition matrix of first set of points (base)

T attach: Condition matrix of second set of points

H: 2D homography

returns: Deconditioned 2D homography

- Deconditions 2D homography

$$\mathbf{\tilde{H}} = \begin{bmatrix} a & b & c \\ d & e & f \\ g & h & j \end{bmatrix} \qquad \mathbf{H} = \mathbf{T}^{'-1} \mathbf{\tilde{H}} \mathbf{T}$$

base: N points as array of 3D vectors from first image

attach: N points as array of 3D vectors from second image

return: Output, 2D homography

- Computes 2D homography from given set of point pairs
- Calls:

```
2x getCondition2D(...)
2x applyH_2D(...)
getDesignMatrix_homography2D(...)
solve_dlt_homography2D(...)
decondition_homography2D(...)
```

# **Deadlines and Next Meeting**

Deadline: In 2 weeks 15.12.2020, 10:00