Four-view geometry with unknown radial distortion

Petr Hruby, Viktor Korotynskiy, Timothy Duff, Luke Oeding, Marc Pollefeys, Tomas Pajdla, Viktor Larsson

WED-AM-073

3D reconstruction without modelling intrinsics



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- Practical **minimal solver** for the problem

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• Models many real cameras (fisheye, catadioptric, ...)













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$$\begin{bmatrix} R_{11} & R_{12} & R_{13} \\ R_{21} & R_{22} & R_{23} \\ R_{31} & R_{32} & R_{33} \end{bmatrix} \cdot \begin{bmatrix} X_1 \\ X_2 \\ X_3 \end{bmatrix} + \begin{bmatrix} t_1 \\ t_2 \\ t_3 \end{bmatrix} = \begin{bmatrix} t_1 \\ t_2 \\ t_3 \end{bmatrix}$$

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• This is written in matrix form as $\mathbf{I^{T}(R'X+t')=0}$

C,

• 2 cameras $\rightarrow \mathbf{R}_{\mathbf{i}}, \mathbf{t}_{\mathbf{i}}$

C,



• Constraint:

 $\exists \mathbf{X}: \mathbf{l'_1}^{\mathrm{T}}(\mathrm{R'_1}\mathbf{X} + \mathrm{t'_1}) = \mathbf{l'_2}^{\mathrm{T}}(\mathrm{R'_2}\mathbf{X} + \mathrm{t'_2}) = 0$

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2 planes always intersect!
 NO CONSTRAINT!

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- 3 cameras $\ \rightarrow \ R_{\rm i}\text{, }t_{\rm i}$
- Constraint:

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Constraint from radial distortion

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• Constraint:

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• 4 planes generically don't intersect.

[1] SriRam Thirthala and Marc Pollefeys: Radial Multi-focal Tensors

Constraint from radial distortion

 \mathbf{C}_{a}



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• After eliminating **X**, we get [1]: $\sum_{i,j,k,l \in \{1,2\}} l'_{1,i} l'_{2,j} l'_{3,k} l'_{4,l} T_{i,j,k,l} = 0$

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- Radial quadrifocal tensor [1]: $\mathbf{T} \in \mathbb{R}^{2 \times 2 \times 2 \times 2}$

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- Constraint in form $\sum_{i,j,k,l \in \{1,2\}} \mathbf{l'}_{1,i} \mathbf{l'}_{2,j} \mathbf{l'}_{3,k} \mathbf{l'}_{4,l} \mathbf{T}_{i,j,k,l} = 0$
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- The minimal problem has 3584 complex solutions.

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 - Globally defined by 718 constraints of degree 12



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- Effective reduction of the number of solutions.
 significant simplification of the problem



2 Pinhole Cameras, 5 Points





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4 Radial Cameras, 13 Points

• 40 solutions in terms of \mathbf{R}, \mathbf{t}





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5.

- 3584 solutions in terms of $\mathbf{R}_{i}, \mathbf{t}_{i}$
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- Every instance has 10 solutions in terms of essential matrices ${\bf E}$
- Every E has 4 decompositions to R, t

5. 52

- 3584 solutions in terms of $\mathbf{R}_{i}, \mathbf{t}_{i}$
- Subproblems of 28, 2, 4, 2⁴ solutions
- Every instance has 28 solutions in terms of ${\bf T}$
- Every ${\bf T}$ has 128 decompositions to ${\bf R}_{\rm i}, {\bf t}_{\rm i}$



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- The minimal problem has 50 complex solutions.
 - It has subproblems with 25 and 2 solutions.



Solved by Homotopy Continuation

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- 25 homotopy paths
- Runtime: 18 ms
Results

Comparison with Larsson et al. [1] *Left:* general quadruplets



[1] Calibration-free Structure-from-Motion with Calibrated Radial Trifocal Tensors, V. Larsson, N. Zobernig, K. Taskin, M. Pollefeys

Results

- Comparison with Larsson et al. [1]
- Left: general quadruplets
- Right: quadruplets selected by an expensive heuristic [1]



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Result Kirchenge



Results (Eglise)



Results (Door)



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