

# 3D Models in Motion Compensation

Hossein Golestani  
Institut für Nachrichtentechnik  
RWTH Aachen University

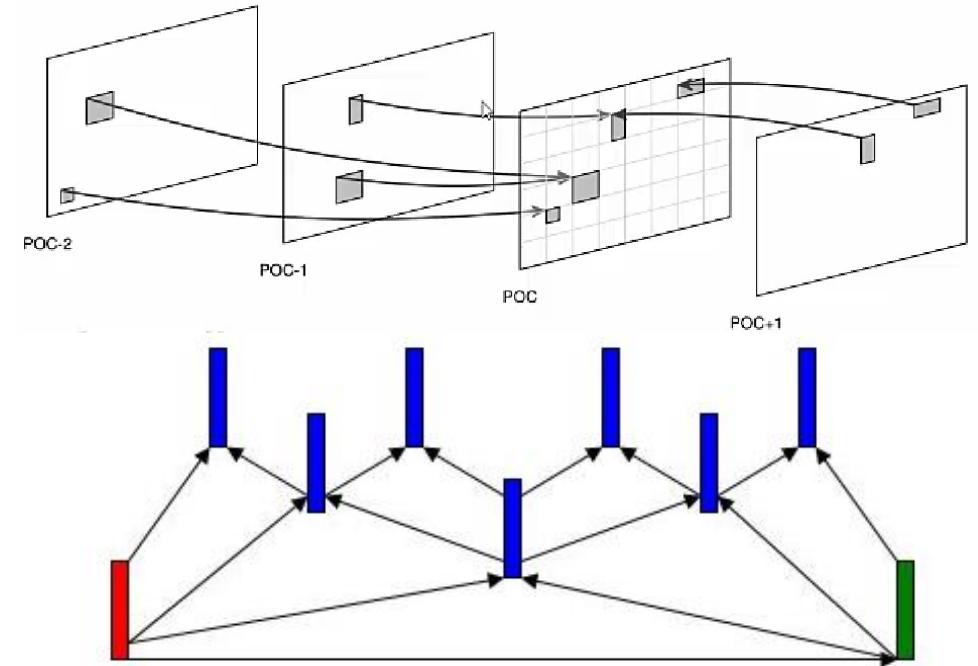
# Outline

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- Introduction to the main idea
- Structure from Motion (SfM)
- Multi-View Reconstruction (MVR)
- Virtual view synthesis for 2D frame prediction
- Coding results
- Conclusion

## Introduction to the main idea

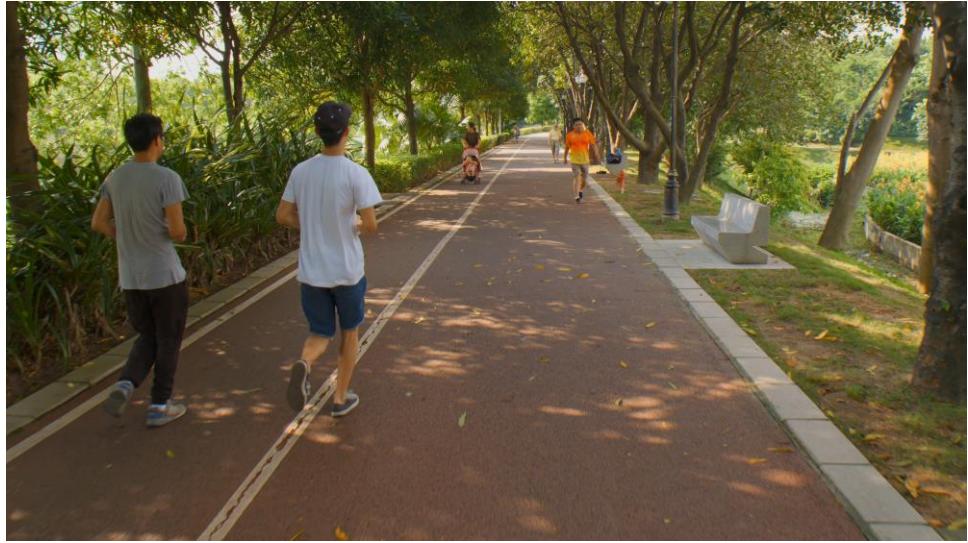
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# Introduction to the main idea

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- Target Sequences (moving camera)

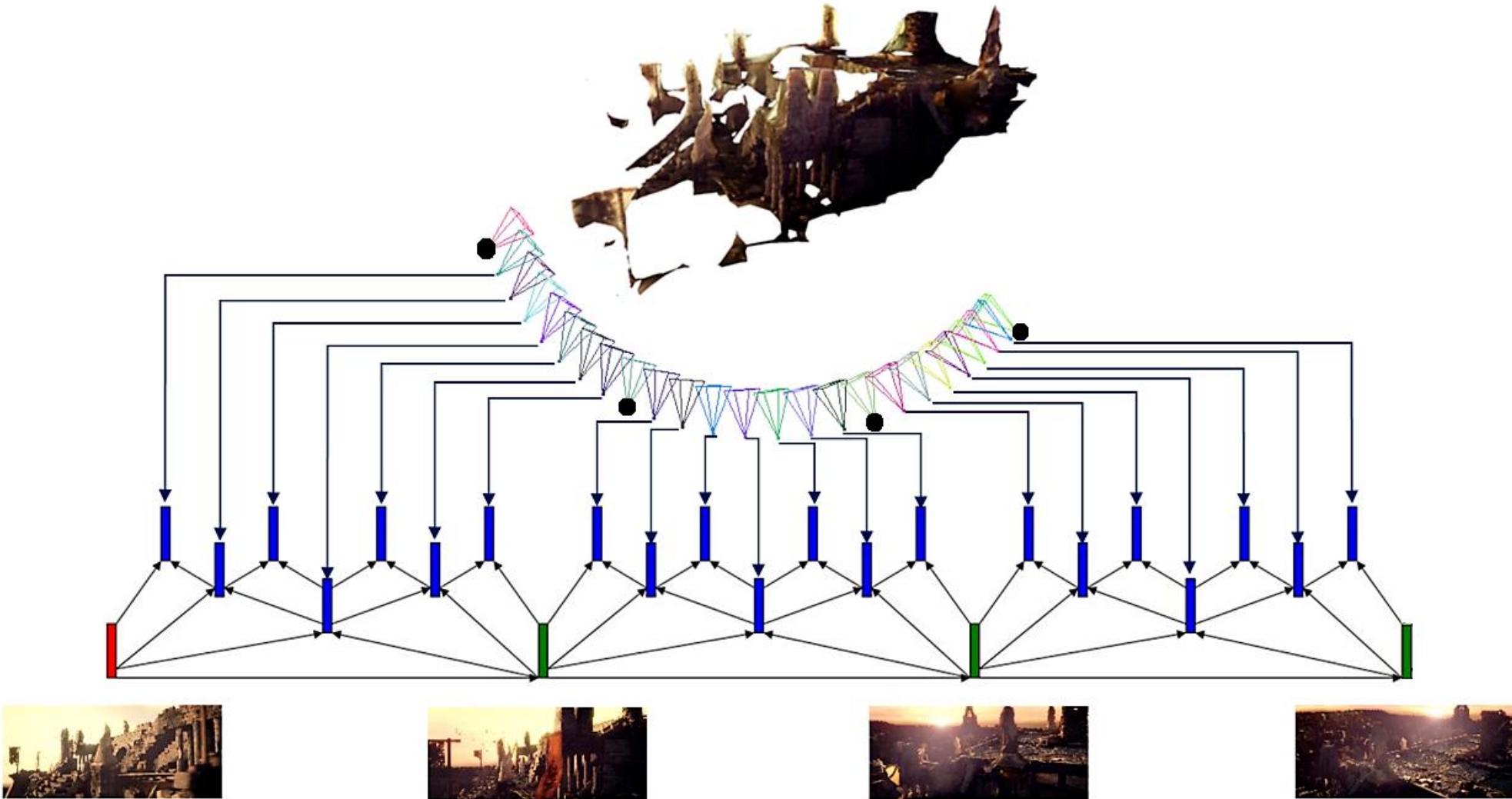


## Introduction to the main idea

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- 3D model based frame prediction
  - **B-Frame Prediction**
  - Key-Frame Prediction

## Introduction to the main idea



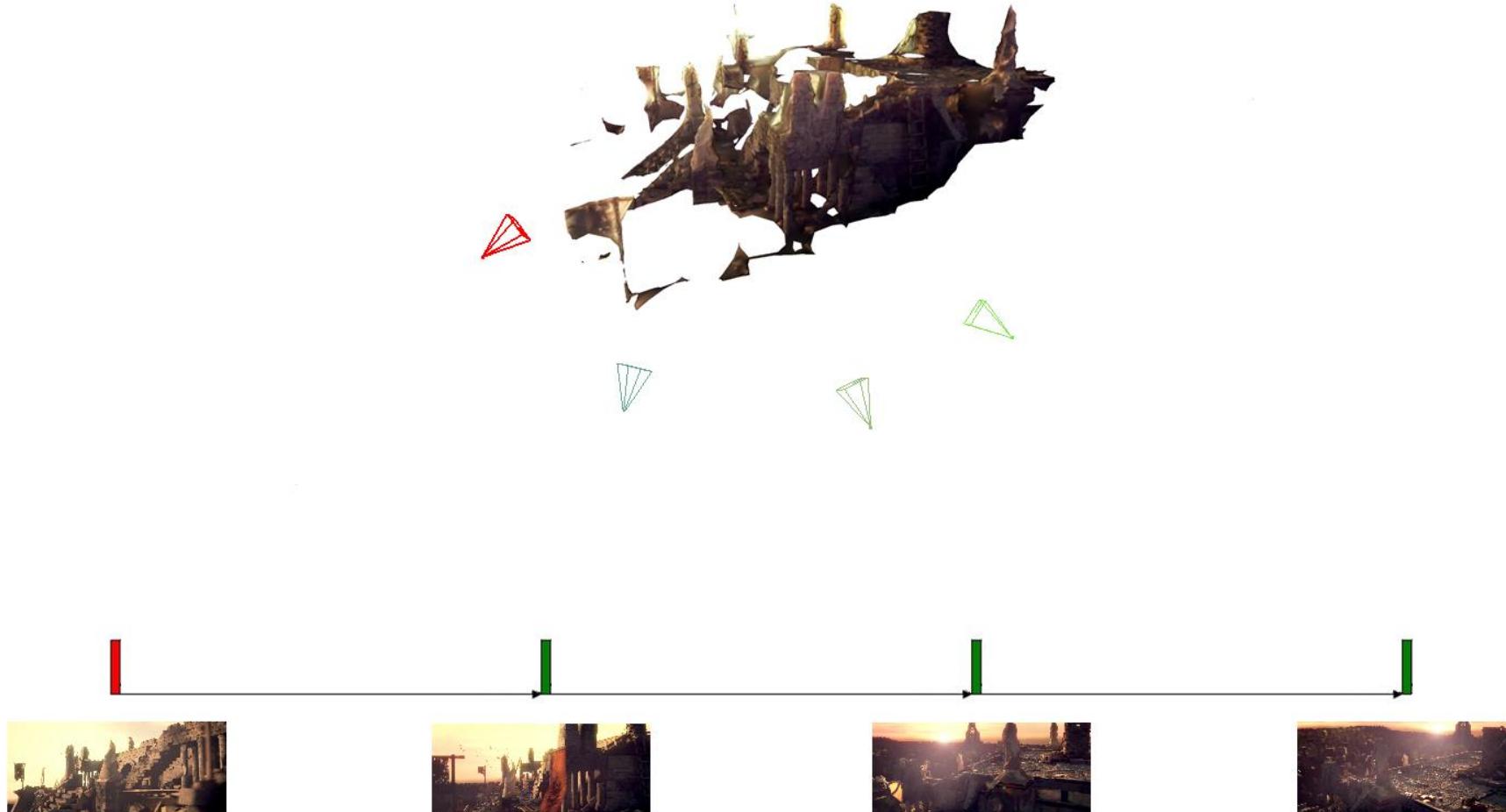
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- 3D model based frame prediction
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  - **Key-Frame Prediction**

## Introduction to the main idea

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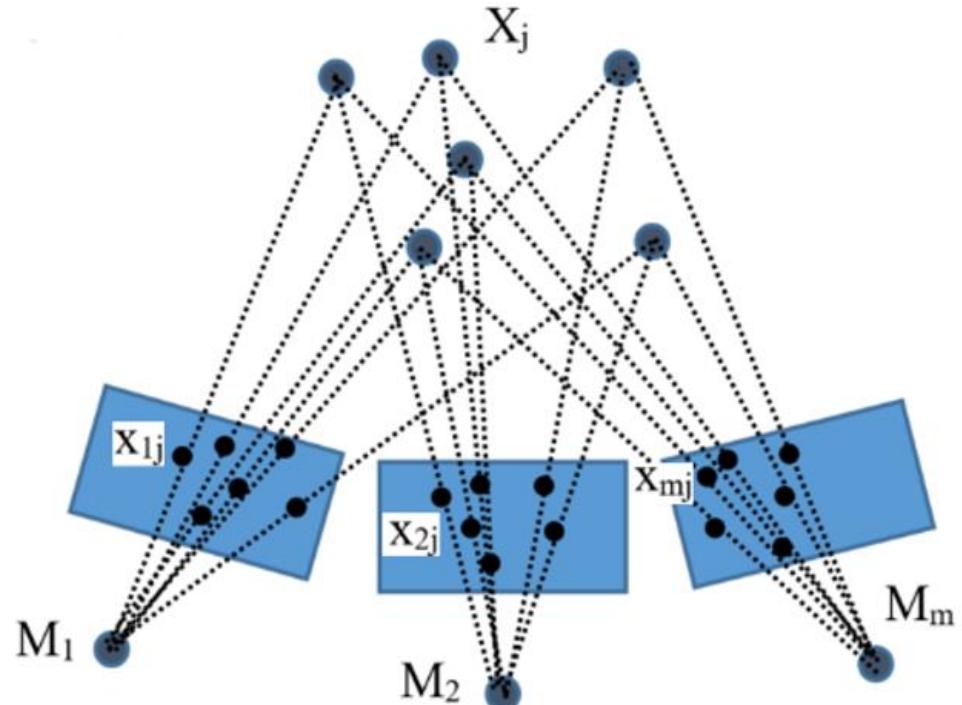
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# Structure from Motion (SfM)

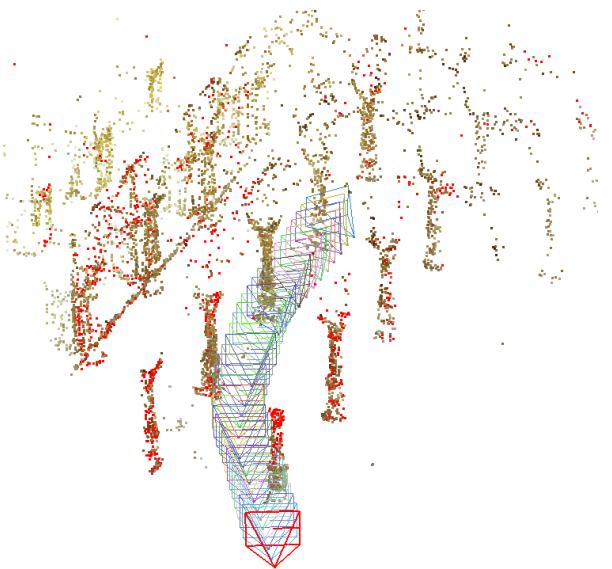
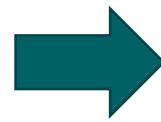
- Structure from Motion (SfM) [1]

$$x_{ij} = M_i X_j, \quad i = 1, \dots, m \quad j = 1, \dots, n$$

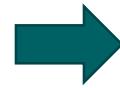
- How to solve SfM?
  - Feature extraction & Finding corresponding points
  - Finding Fundamental matrix  $F$  ( $x'^T F x = 0$ )
  - Estimating projective cameras
  - Triangulating
  - Bundle Adjustment



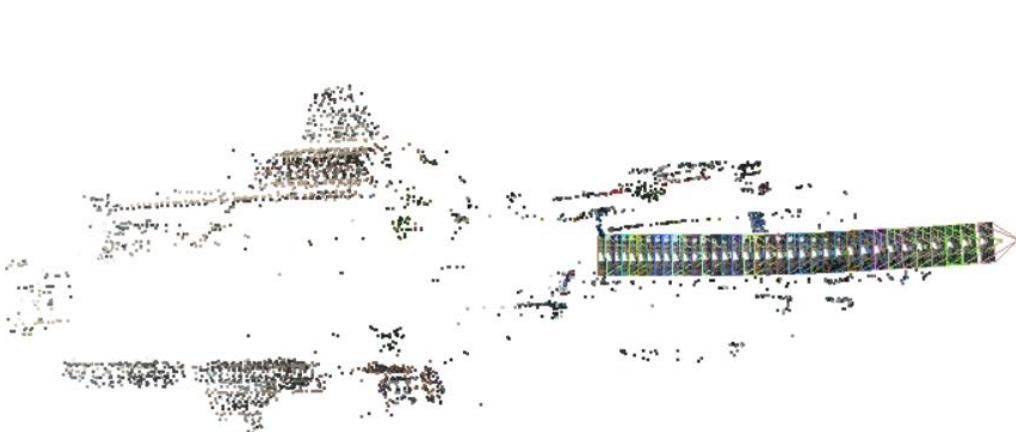
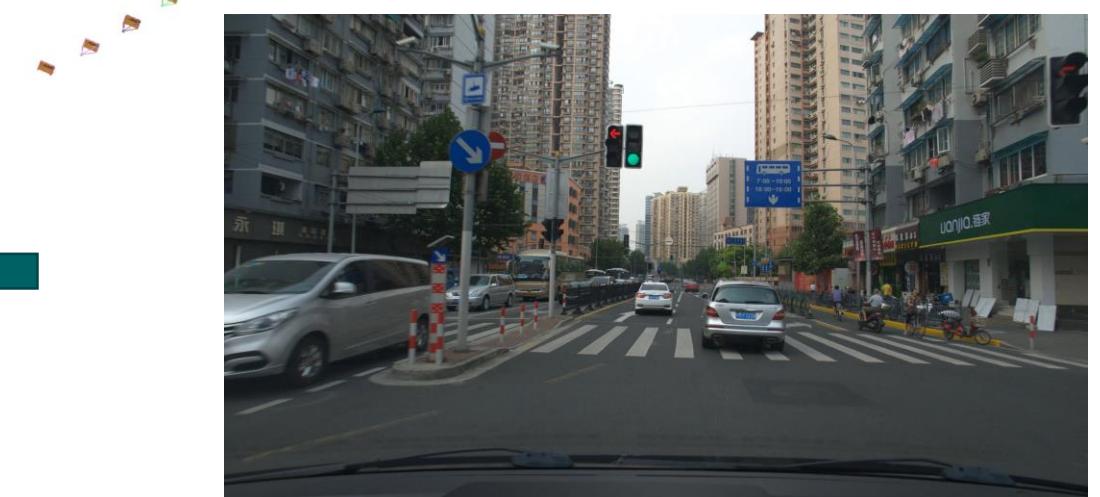
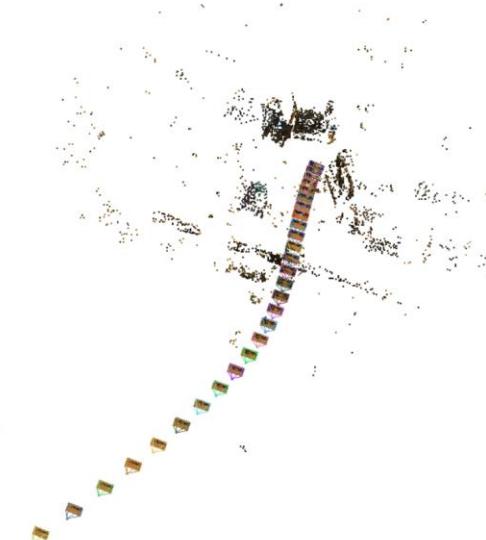
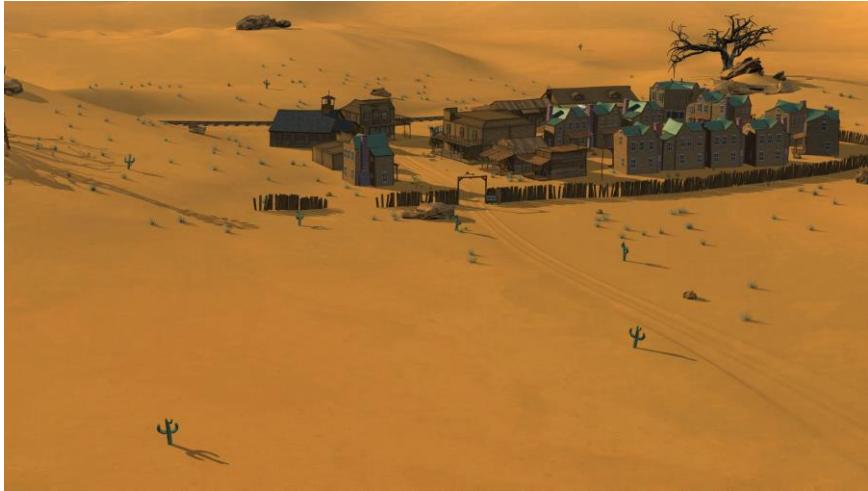
[1] R. Hartley and A. Zisserman, "Multiple view geometry in computer vision", second edition, Cambridge press, 2013.



## SfM Results



## SfM Results



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## Multi-View Reconstruction (MVR)

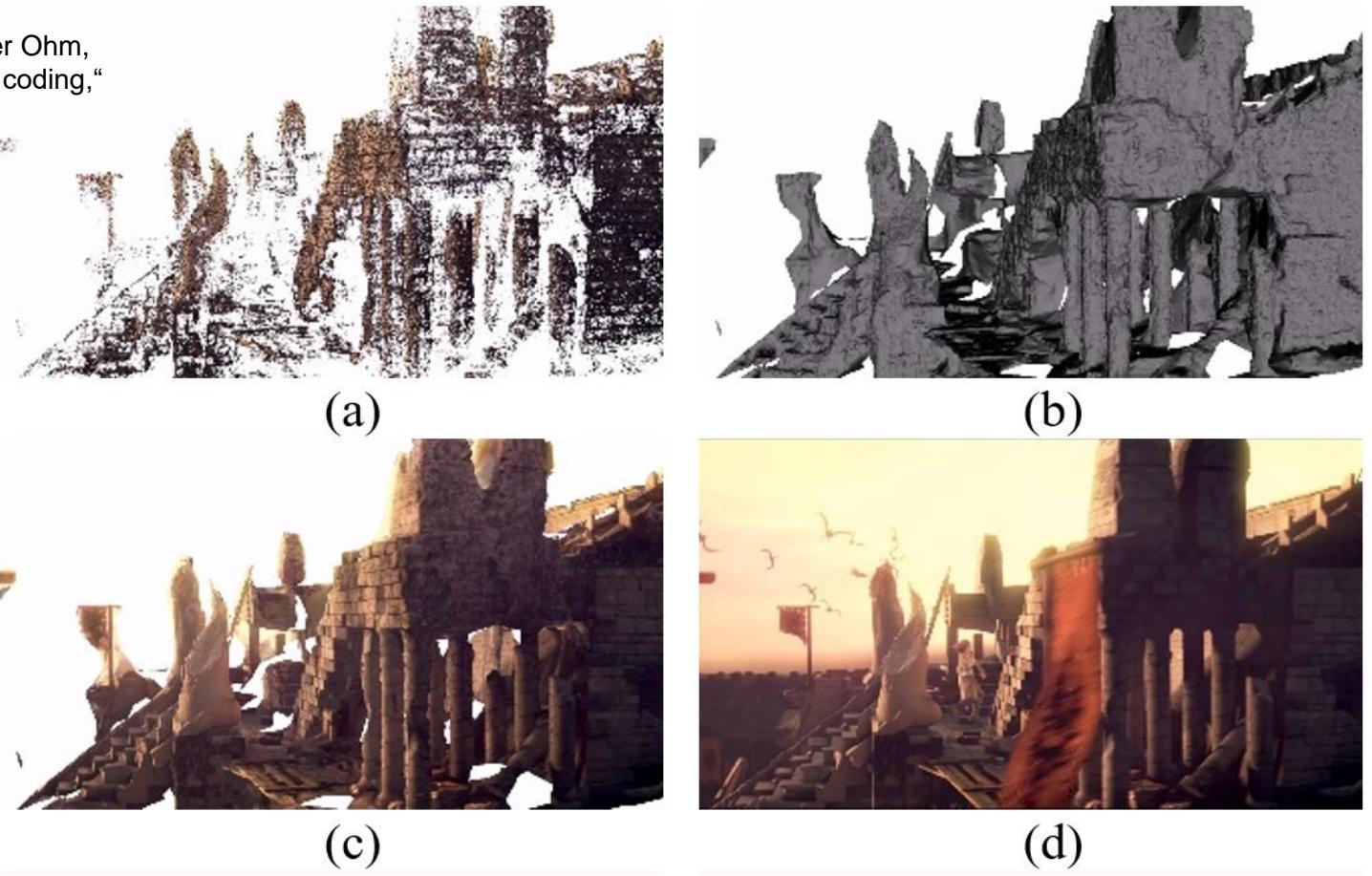
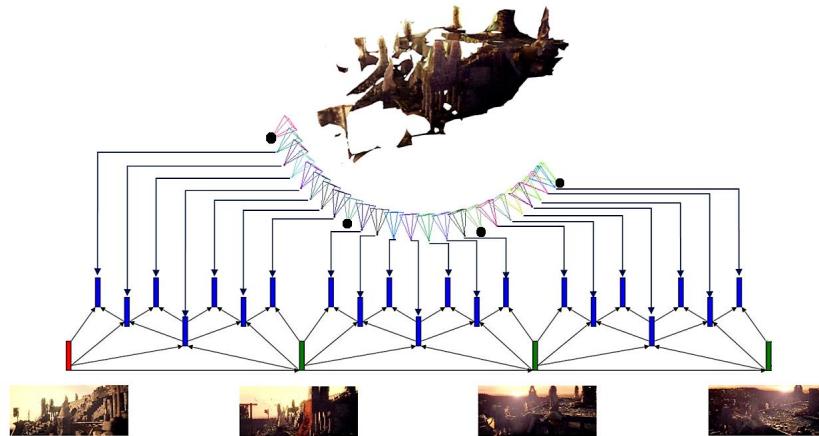
- Generating a quasi-dense point cloud
- Visibility based surface reconstruction
  - Delaunay tetrahedralization
  - Surface optimization with minimum s-t cut [2])
- The variational refinement of mesh to optimize its photo-consistency (Minimizing reprojection error)



[2] H. Vu, P. Labatut, J. Pons and R. Keriven, "High accuracy and visibility-consistent dense multiview stereo", IEEE Transaction on pattern analysis and machine intelligence, vol. 34, no. 5, 2012.

## Application in Video Coding?

[3] Hossein B. Golestani, Jens Schneider, Mathias Wien and JensRainer Ohm,  
„Point cloud estimation for 3D structure based frame prediction in video coding,”  
ICME 2017, Hong Kong.



(a) quasi-dense point cloud, (b) shaded surface, (c) textured surface and (d) ground truth

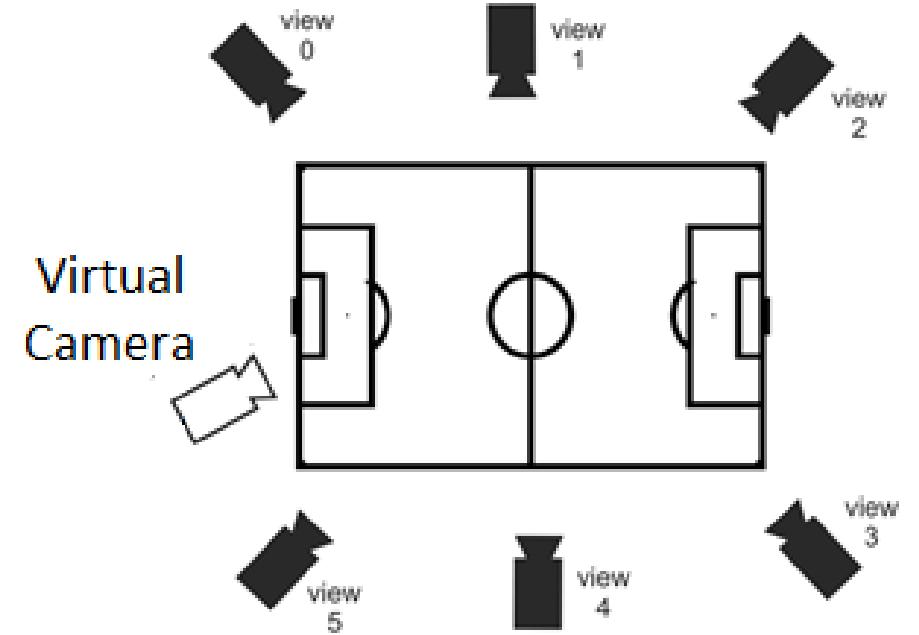
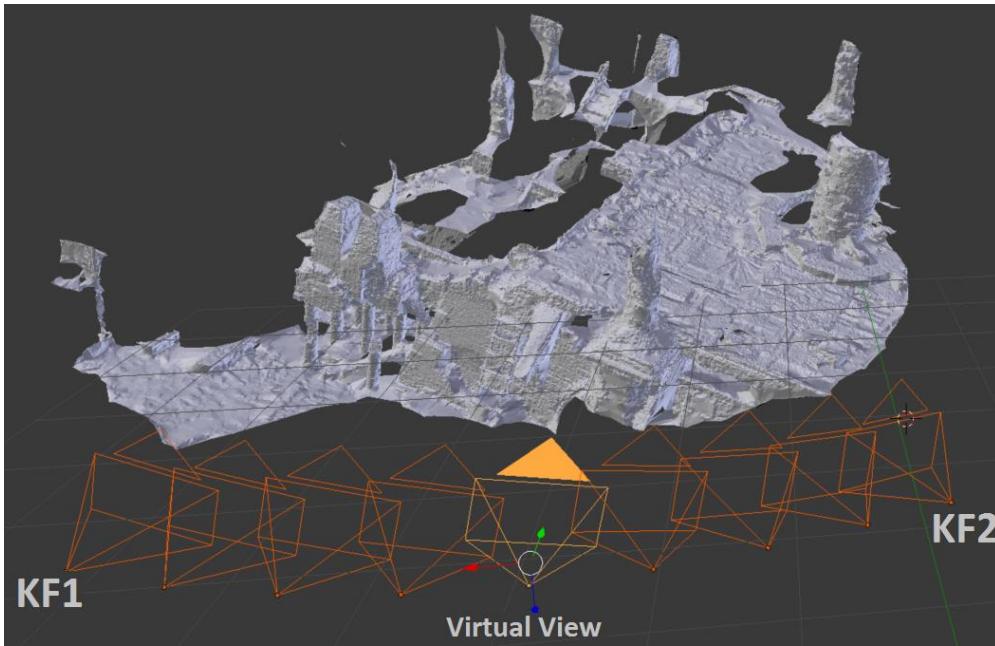
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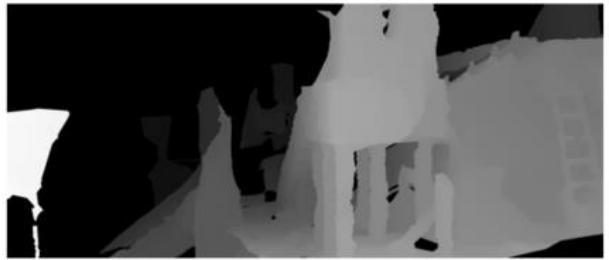
## New method for frame prediction: Virtual View Synthesis

- How to improve the quality of predicted frame? Virtual View synthesis
- What does it need?
  - Left and right views
  - Camera parameters for left, right and virtual cameras
  - Depth information of left and right views (depthmaps, Z-min & Z-max)

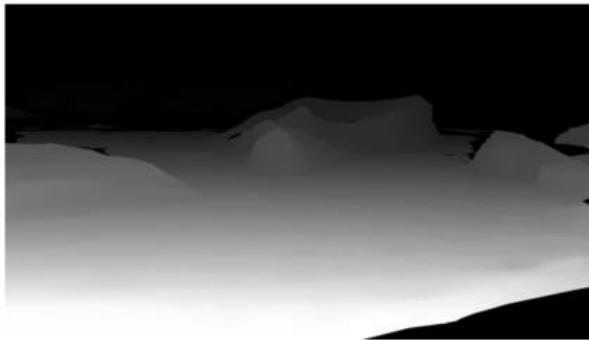


## Estimated Depthmaps

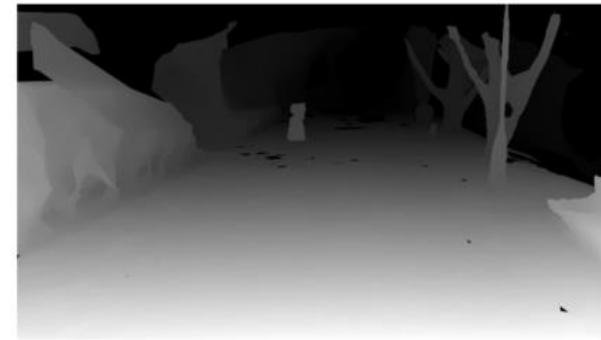
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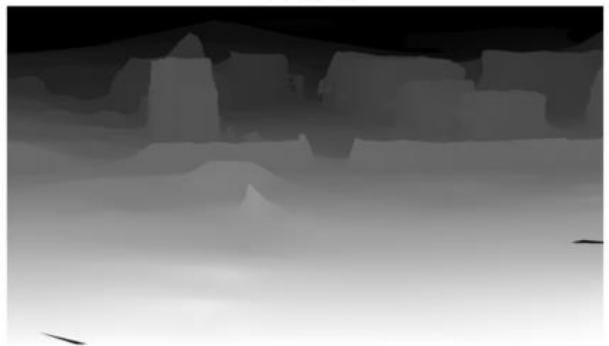
Sintel



IceRock2



ParkRunning2



GTFly



IB1



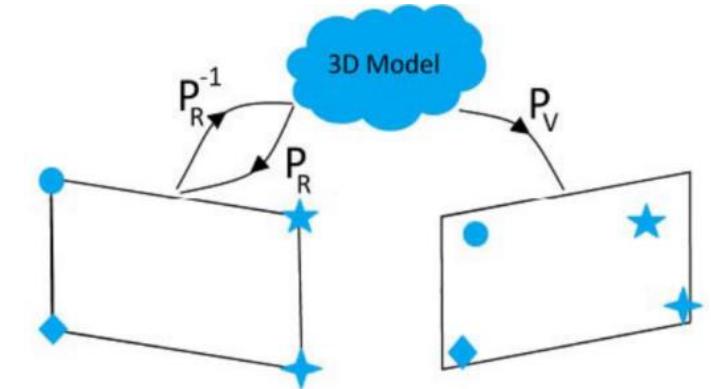
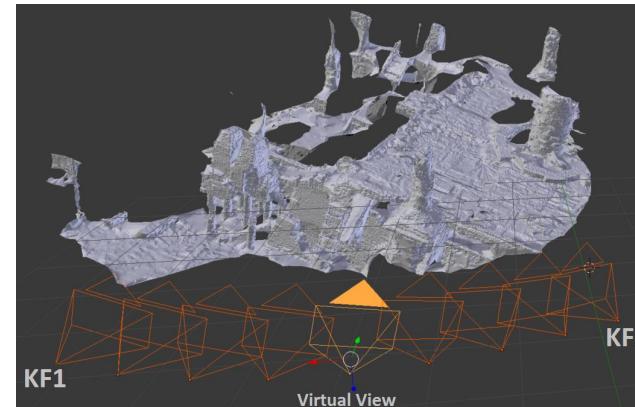
DayLightRoad

# Virtual View Synthesis

- Steps:
  - Estimating the depthmaps of the virtual view from KFs' depthmaps
  - Finding a homography transformation between real and virtual views for each depth level

$$X_V[i] = P_V P_R^{-1} X_R[i], \quad i = \text{depth levels}$$

- Synthesizing the virtual view by warping textures from left and right key-frames
  - $[h, w, 1]^T = H^{-1}[i] \times [u, v, 1]^T, \quad [u, v]: \text{virtual view}, \quad [h, w]: \text{real view}$
- Blending the synthesized view from left and right



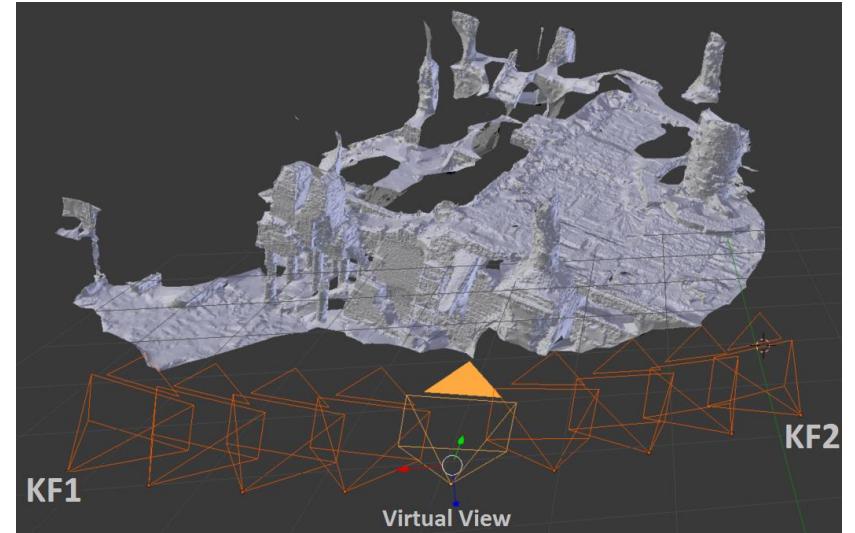
## Synthesized frames



(a) Ground Truth



(b) Synthesized (virtual view)



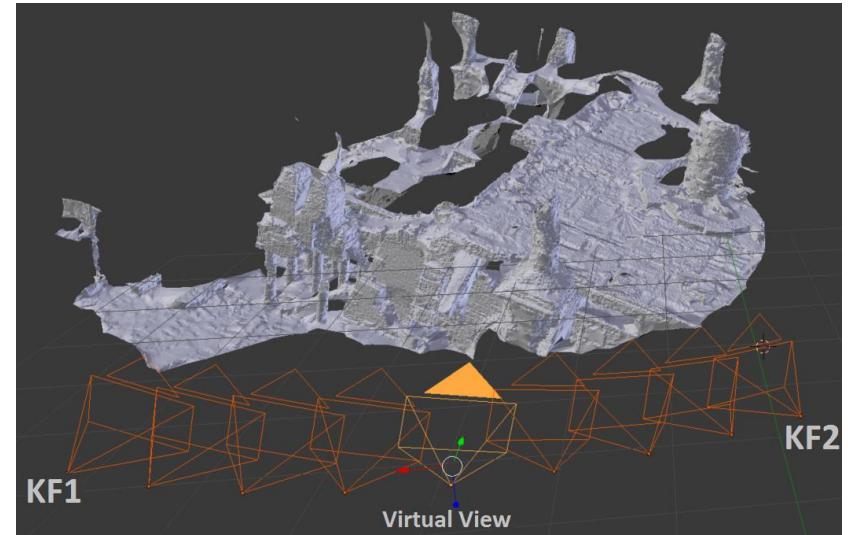
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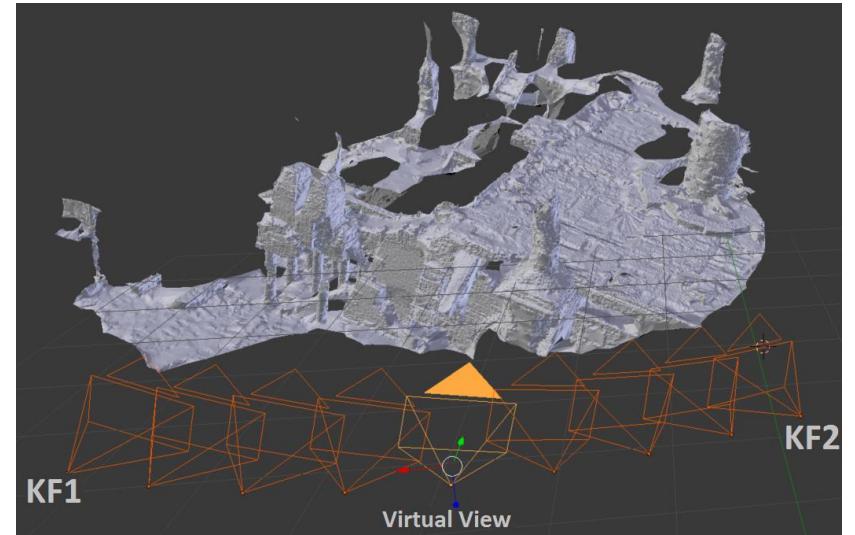
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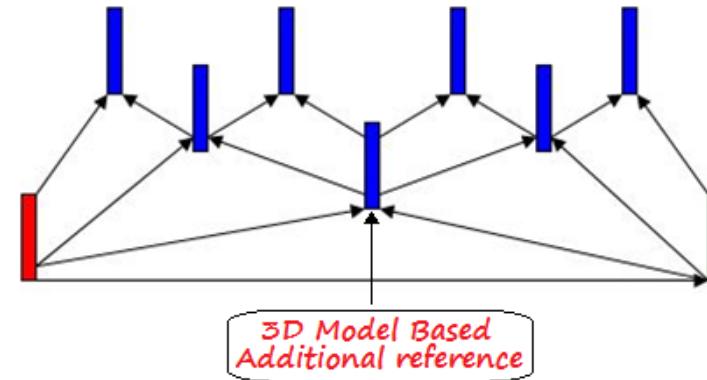
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# SfM based frame prediction in Video Coding

- HEVC test Model (HM 16.7)
  - SfM-based prediction is added to L0 and L1
  - The encoder can choose between
    - its built-in reference images
    - The offered SfM-based prediction
  - QP: 25, 29, 33 and 37, Random Acess main profile

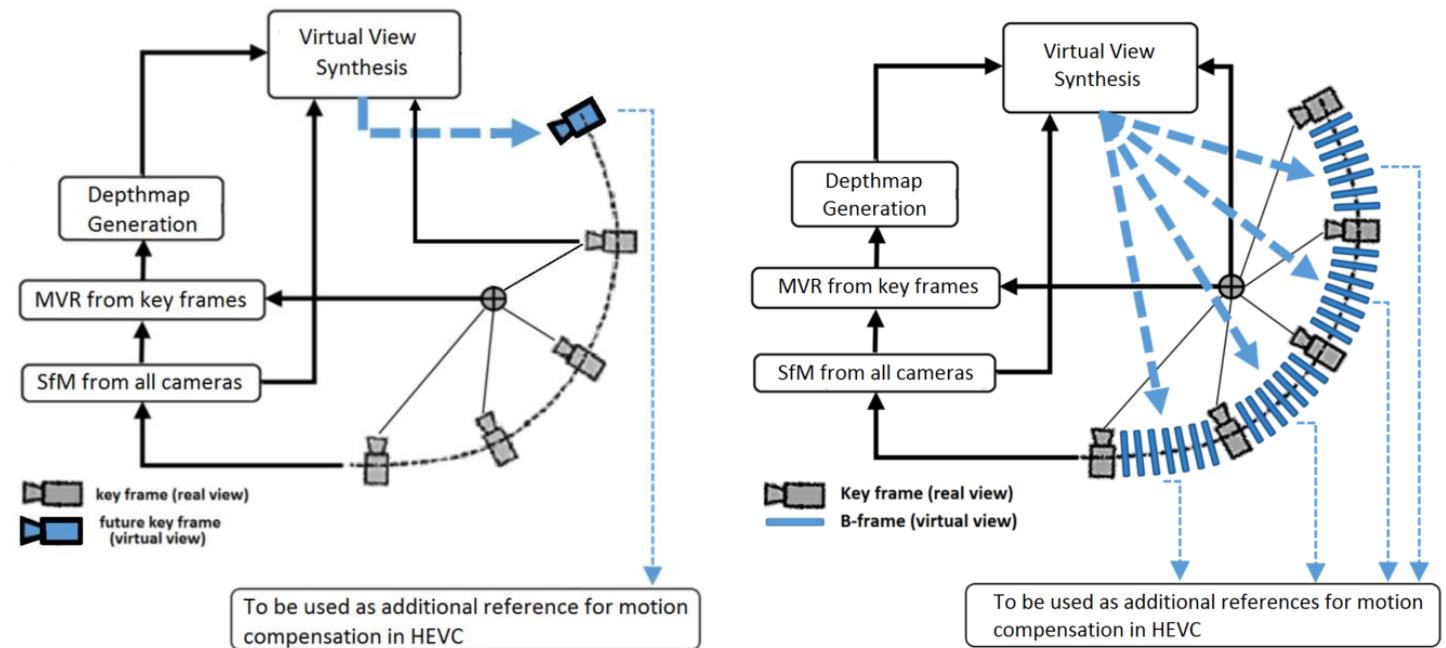


POC 24 TId: 0 ( B-SLICE, nQP 38 QP 38 )	48048 bits [Y 39.0652 dB U 46.8478 dB V 47.1814 dB] [ET 158 ]	[L0 16 8 24 (AddRef) ] [L1 16 8 24 (AddRef) ]
POC 20 TId: 1 ( B-SLICE, nQP 39 QP 39 )	6552 bits [Y 39.3872 dB U 46.9528 dB V 47.2622 dB] [ET 149 ]	[L0 16 12 20 (AddRef) ] [L1 24 16 20 (AddRef) ]
POC 18 TId: 2 ( B-SLICE, nQP 40 QP 40 )	3576 bits [Y 38.7807 dB U 46.8727 dB V 47.1718 dB] [ET 161 ]	[L0 16 12 18 (AddRef) ] [L1 20 24 18 (AddRef) ]
POC 17 TId: 3 ( B-SLICE, nQP 41 QP 41 )	992 bits [Y 38.8425 dB U 46.8946 dB V 47.2129 dB] [ET 144 ]	[L0 16 18 17 (AddRef) ] [L1 18 20 17 (AddRef) ]
POC 19 TId: 3 ( B-SLICE, nQP 41 QP 41 )	1464 bits [Y 38.5592 dB U 46.8896 dB V 47.1888 dB] [ET 158 ]	[L0 18 16 19 (AddRef) ] [L1 20 24 19 (AddRef) ]
POC 22 TId: 2 ( B-SLICE, nQP 40 QP 40 )	3232 bits [Y 39.1846 dB U 46.9233 dB V 47.1872 dB] [ET 145 ]	[L0 20 16 22 (AddRef) ] [L1 24 20 22 (AddRef) ]
POC 21 TId: 3 ( B-SLICE, nQP 41 QP 41 )	1576 bits [Y 38.8811 dB U 46.9153 dB V 47.1979 dB] [ET 158 ]	[L0 20 16 21 (AddRef) ] [L1 22 24 21 (AddRef) ]
POC 23 TId: 3 ( B-SLICE, nQP 41 QP 41 )	1656 bits [Y 38.7014 dB U 46.8517 dB V 47.1399 dB] [ET 144 ]	[L0 22 20 23 (AddRef) ] [L1 24 22 23 (AddRef) ]
POC 32 TId: 0 ( P-SLICE, nQP 37 QP 37 )	383656 bits [Y 38.9582 dB U 46.6173 dB V 46.8710 dB] [ET 226 ]	[L0 32 (AddRef) 32 (AddRef) 32 (AddRef) ] [L1 ]

Seq.	Sintel	IceRock2	GTFly	ParkRunning2	DayLightRoad	IB1
BD-Rate (%)	-2.21	-10.76	-6.64	-2.55	-2.80	-5.91
BD_PSNR (dB)	+0.08	+0.32	+0.19	+0.08	+0.04	+0.07

# Conclusion

- An SfM-based frame prediction scheme has been presented.
- SfM for camera calibration
- MVS for surface reconstruction.
- Virtual view synthesis for synthesizing novel views.
- SfM-based prediction is added to reference lists (L0 and L1)
- So far, 2% to 10% bitrate reduction is achieved.
- Estimating better depthmaps will improve results.



**Vielen Dank  
für Ihre Aufmerksamkeit**