Image-Based Rendering and View Synthesis summary

A. Kouzelis, Prof. Ioannis Pitas Aristotle University of Thessaloniki pitas@csd.auth.gr www.aiia.csd.auth.gr Version 1.0.1



Image-Based Rendering and View Synthesis



- Introduction
- Rendering with no geometry
 - Plenoptic function
 - Light field and Lumigraph
 - Concentric mosaic rendering
 - Panoramic mosaic rendering
- Rendering with implicit geometry
 - View interpolation
 - View morphing
 - Transfer methods
- Rendering with explicit geometry
 - 3D warping

Artificial INEIBEnce &

nformation Analysis Lab

- Layered Depth Images
- View-dependent texture mapping
- Surface rendering
- Volume rendering
- Learning-based view synthesis
 - Free View Synthesis



- Image rendering is the process of generating 2D images (2D views) from 3D object or scene representations.
- View synthesis is the process of generating novel views of a 3D object or scene from one or multiple other views of the same scene, with or without full 3D model reconstruction.





- Geometry based rendering: creation of synthetic images from a 3D scene model by simulating the interaction of light with objects in the scene.
- Besides a geometric model of the scene, material properties of the objects, description of light sources and viewing parameters are also needed.
- Used in traditional computer graphics.
- Examples: rasterization, ray tracing, radiosity.







Geometry-based image rendering used in Computer graphics [Cohen1999].







Image-based rendering with model reconstruction [Cohen1999].





Image-based rendering can be categorized by the amount of geometry information it uses [Shum00]:

- Rendering with no geometry
- Rendering with explicit geometry
- Rendering with implicit geometry





Less geometry		More geometry>		
Rendering with no geometry	Rendering with implicit geometry	y	Rendering with explicit geometry	
Light field	Lumigraph	LDIs	Texture-mapped models	
Concentric mosaics	Transfer method	ds 3	3D warping	
Mosaicking	View morphing	View	View-dependent geometry	
View interpolation		v	View-dependent texture	

Rendering categories based on the amount of geometry information used [Shum00].





Rendering with no geometry

- In rendering with no geometry, or *image-based rendering* (*IBR*), new views are generated using existing images of the 3D scene from different viewpoints.
- Explicit 3D model of the scene is not used.
- IBR can be viewed as a set of techniques to reconstruct a continuous representation of the *plenoptic function* [Adelson91] from observed discrete samples.





The original 7D *plenoptic function* is defined as the radiance of light rays passing through every location in space (V_x, V_y, V_z) where the camera center is located, at every possible angle (θ, ϕ) , for every wavelength λ , and for every point in time *t*:

 $P_7 = P(V_x, V_y, V_z, \theta, \phi, \lambda, t)$

The radiance is measured in Watts per meter squared per steradian, $W/m^2/sr$.







Radiance L along a ray [WIKI1].



 Considering a static environment and fixed wavelength, the plenoptic function reduces to a 5D function:

 $P_5 = P(V_x, V_y, V_z, \theta, \phi)$

This approach to image-based rendering is known as *plenoptic modeling* [McMillan95].







Plenoptic functions: (a) P_7 , (b) P_5 and (c) P_2 [Shum07].





- Light field rendering [Levoy96] does not use any form of 3D scene geometry, but instead uses many images.
- It generates a new view of a scene by appropriately filtering and interpolating an existing set of samples.
- Lumigraph [Gortler96] is similar to light field rendering, but it uses approximate 3D scene geometry to counterbalance any lack of uniformity in image sampling.
- The difference lies in uniform vs. non-uniform image sampling.







(left) Stanford's multi-camera array, (right) Adobe's "magic lens".







Commercial light field cameras: (left) Lytro, (right) Raypix.







Representation of a light field (light slab) [Shum03]





The convex boundary *S* defines the "inside" region which contains the scene of interest and the "outside" empty space where the cameras are located. The radiance of light rays exiting through the boundary S defines the light field. The figure shows only one spatial dimension *u* and one directional dimension s [lhrke16].



physical space







Light field can be viewed from the camera plane (a) or the focal plane (b) [Levoy96].







Demonstration of how the choice of focal plane affects the reconstruction of a desired ray r. Image taken from [Isaksen00] with slight modifications.







Light field rendering for the novel view represented by virtual camera K [Mantiuk18].



VML

Concentric mosaic rendering

- Concentric mosaics (CMs) is a 3D parametrization of the plenoptic function proposed by Shum and He [Shum99].
- The camera is constrained to move only along concentric circles on a plan: it rotates at constant angular speed and captures images at regular intervals.





CMs define a **3D** plenoptic function:

 $P_3 = P(\theta, r, Z)$

where θ is the rotation angle, r is the radius and Z is the vertical elevation.





C₀ C_k C_n ▶ ... ▶ ... ▶ C_n

A system setup for obtaining concentric mosaics [Shum99].







Construction of a concentric mosaic [Shum99].







Rendered novel view at P

Rendering a new view with CMs [Shum99].





Panoramic mosaic rendering

- Image mosaicing is the process of aligning and compositing multiple images into a larger image that represent portion of a 3D scene.
- The output mosaic is a **2D plenoptic function**.
 - Usually mosaics are composed to increase the field of view of the camera.





Panoramic mosaic rendering



Example of a cylindrical panorama [WIKI2].





Rendering with implicit geometry

- In *rendering with implicit geometry* the geometric information is not directly available, but is deduces after appropriate calculations on the images.
- It relies on information extracted from images, such as feature correspondences between images, depth maps etc.
- The most characteristic techniques of this class are: view interpolation, view morphing and transfer methods.



View interpolation



- View interpolation uses existing images to create new inbetween views by interpolation.
- The method proposed by Chen and Williams [Chen93] uses dense optical flow between two input images.

Optical flow is the apparent motion of objects, surfaces and edges in a visual scene caused by the relative motion between the camera and the scene [Pitas00].



View morphing



- Image morphing is a technique used to generate transitions between two images, without ensuring the preservation of shapes of the objects.
- View morphing [Seitz96] is an extension of image morphing, which ensures object shape preservation in the new views and results in very realistic transitions.





View morphing



View morphing between two different views of an object [Seitz96].





View morphing

î 0 Ι C°, î Cs C₁

View morphing [Seitz96]: Original images I_0 and I_1 are pre-warped to form parallel views \hat{I}_0 and \hat{I}_1 . The image \hat{I}_s is formed by interpolating the \hat{I}_0 and \hat{I}_1 . Finally, I_s is formed by post-warping \hat{I}_s .

Artificial Intelligence & Information Analysis Lab

Transfer methods



- Transfer methods use a relatively small number of images and apply geometric constraints to appropriately reproject image pixels at a virtual camera viewpoint.
- The geometric constraints can be of the form of pixel depth values, epipolar constraints between pair of images, or trifocal tensors that link correspondences between triplets of images [Shum07].





Transfer methods



Corresponding points in two source views that are projections of a point \mathbf{m}_3 in the virtual view 3 [Shum07].

Artificial Intelligence & Information Analysis Lab



Transfer methods





Top: front images of a mannequin. Bottom: predicted side view of the mannequin [Laveau94]. The unseen areas in the reference views such as the right breast are not visible in the transferred.



VML

Rendering with explicit geometry

- In *rendering with explicit geometry*, the representations of a scene have direct 3D information encoded in them, in form of depth along known lines of sight, or 3D coordinates.
- Traditional rendering with a 3D model and single texture map is a special case in this category used in conventional computer graphics.
 - Here we are going to review rendering methods that use depth maps, such as 3D warping and layered-depth images, and the view-dependent texture mapping which uses explicit 3D models of objects or scenes.



3D warping



- In 3D image warping, a given 2D reference image and a depth map (for every point in this image) can be used to render nearby views of the 3D scene [McMillan97].
- The pixels of the reference image are projected to their proper 3D locations.
- Then the 3D points are re-projected onto a new image plane pixels.





3D warping



Visibility gap [Pitas].



Layered Depth Images



- To deal with the disocclusion problem in 3D warping, Shade et al. proposed *Layered Depth Images (LDI)* [Shade98] to store not only what is visible in the reference image, but also what is behind the visible surface.
- LDI stores multiple pixels and their depths along each line of sight, forming the *LDI multiple layers*.
- LDIs can be constructed either by using multiple images for which depth information is available at each pixel or directly from synthetic environments with known geometries [Baker98].





Layered Depth Images



Layered Depth Image [Pitas]





View-dependent texture mapping



Weighting used in view-dependent texture mapping [Debevec96]. The pixel in the virtual view is a weighted sum of pixels in sampled viewpoints. The weights are inversely proportional to the magnitude of angles a_1 and a_2 .

Artificial Intelligence & Information Analysis Lab



View-dependent texture mapping

Results of view-dependent texture mapping (VDTM) [Debevec96]. (a) 3D model of a building, (b) A rendering of the model using VDTM, (c) Rendering from a other view using a single texture map. Because the texture is from a different viewpoint, the windows look not natural, (d) A better result obtained by using VDTM.





(c)



(d)

Learning-based view synthesis

- In the recent years, there have been many successful attempts in applying deep learning techniques to view synthesis, exploring different deep learning architectures, 3D scene representations and application scenarios.
- View synthesis can be naturally formulated as a learning problem: Given a large set of images of a 3D scene from different viewpoints, keep some of them as ground truth, train a model to predict the missing views and compare them to the ground truth images as the objective that the model seeks to optimize.



Free View Synthesis



- In the paper "Free View Synthesis" [Riegler20] authors propose a deep learning based method for novel view synthesis from unstructured input images, i.e. images that are freely distributed around a scene.
- Their method works for general scenes with unconstrained geometric layouts.
 - After training on a dataset, the method works on previously unseen environments without the need for fine-tuning or per-scene optimization.





Free View Synthesis



(a) Point cloud

(b) Mesh

Proxy geometry used for view synthesis [Riegler20].



Free View Synthesis





Structure of the recurrent mapping and blending network [Riegler20].

Artificial Intelligence & Information Analysis Lab

47



- Neural Radiance Field (NeRF) is a state-of-the-art method for generating novel views of complex scenes [MIL2020].
- A static scene is represent as a continuous 5D function that outputs:
 - the emitted color c = (r, g, b) at each point x = (x, y, z) in space in each direction (θ, φ) (represented as a 3D unit vector d),
 - a **volume density** σ at each point **x** which acts like a differentiable opacity controlling how much radiance is





• This continuous 5D function is approximated with a Multilayer Perceptron (MLP): $F_{\Theta}: (\mathbf{x}, \mathbf{d}) \rightarrow (\mathbf{c}, \sigma)$

by optimizing its weights Θ .

$$(x, y, z, \theta, \phi) \rightarrow \square \rightarrow (RGB\sigma)$$
$$F_{\Theta}$$







NeRF scene representation and differentiable rendering procedure [MIL2020].





 The feature vector is then concatenated with camera's viewing direction and passed to one additional FC layer (with ReLU activation and 128 channel) that outputs the view-dependent RGB color.











Results on a synthetic dataset [MIL2020]..











Results on a real world photo dataset [MIL2020]. (Press on each video to play)





[PIT2021] I. Pitas, "Computer vision", Createspace/Amazon, in press.

[PIT2017] I. Pitas, "Digital video processing and analysis", China Machine Press, 2017 (in Chinese).

[PIT2013] I. Pitas, "Digital Video and Television", Createspace/Amazon, 2013.
[NIK2000] N. Nikolaidis and I. Pitas, "3D Image Processing Algorithms", J. Wiley, 2000.
[PIT2000] I. Pitas, "Digital Image Processing Algorithms and Applications", J. Wiley, 2000.





[Adelson91] Adelson E. H., Bergen J., **"The plenoptic function and the elements of early vision"**, In Computational Models of Visual Processing, MIT Press, Cambridge, MA, (1991).

[Chen93] Chen S.E., Williams L., "View Interpolation for Image Synthesis", ACM Transactions on Graphics (SIGGRAPH) (1993).

[McMillan95] McMillan L., Bishop G. "Plenoptic modeling: an image-based rendering system", SIGGRAPH (1995).

[Debevec96] Debevec P.E., Taylor C.J., Malik J., "Modelling and rendering architecture from photographs: A hybrid geometry-and image-based approach", SIGGRAPH (1996).

[Gortler96] Gortler S.J., Grzeszczuk R., Szeliski R., Cohen M.F., "**The Lumigraph**", SIGGRAPH (1996).





[Levoy96] Levoy M., Hanrahan P., "Light field rendering", SIGGRAPH (1996)

[Cohen99] Cohen M., "Course on Image-based, Modeling, Rendering, and Lighting", Siggraph (1999)

[Scharstein99] Scharstein D., "View Synthesis Using Stereo Vision", Lecture Notes in Computer Science (1999).

[Shum00] Shum H., Kang S. B., "**Review of image-based rendering techniques**", Visual Communications and Image Processing (2000).

[Shum03] Shum H., Chan S. C., Kang S. B., **"Survey of image-based representations and compression techniques",** IEEE Transactions on Circuits and Systems for Video Technology (2003).





[Shum07] Shum H., Chan S. C., Kang S. B., "Image-Based Rendering", Springer US (2007).

[Pitas00] Pitas I., Nikolaidis N., "**3-D image processing algorithms**", Wiley (2000).

[McMillan97] McMillan L., **"An Image-Based Approach to Three Dimensional Computer Graphics"**, Ph.D. Thesis, Department of Computer Science, University of North Carolina at Chapel Hill, (1997).

[Ihrke16] Ihrke I., Restrepo J., Mignard-Debise L., "Principles of Light Field Imaging: Briefly revisiting 25 years of research", IEEE Signal Processing Magazine (2016)

[Isaksen00] Isaksen A., McMillan L., Gortler S. J., "Dynamically reparameterized light fields", SIGGRAPH (2000).





[Shum99] Shum H. Y., He L. W., "Rendering with Concentric Mosaics", SIGGRAPH (1999).

[Mantiuk18] Mantiuk R. I., "Advanced Graphics and Image Processing - Lecture notes".

[Neto02] Neto M., "Image-Based Modeling and Rendering Techniques: A Survey", RITA (2002).

[Zhang04] Zhang C., Chen T. "A survey on image-based rendering—representation, sampling and compression", Signal Processing: Image Communication (2004).

[Szeliski97] Szeliski R., Shum H. Y., "Creating full view panoramic image mosaics and environment maps", SIGGRAPH (1997).

[Seitz96] Seitz S. M., Dyer, C. R., "View morphing", SIGGRAPH (1996).





[Laveau94] Laveau S., Faugeras O. D., **"3-D scene representation as a collection of images"**, Proceedings of 12th International Conference on Pattern Recognition (1994).

[Shade98] Shade J., Gortler S., He L. W., Szeliski R., "Layered depth images", SIGGRAPH (1998).

[Baker98] Baker S., Szeliski R., Anandan P., **"A Layered Approach to Stereo Reconstruction"**, CVPR (1998).

[Gortler97] Gortler S., He L., Cohen, M., "Rendering Layered Depth Images" (1997).

[Porter84] Porter T., Duff T, "**Compositing digital images**", SIGGRAPH Computer Graphics (1984).





[McMillan95] McMillan L., **"A list-priority rendering algorithm for redisplaying projected surfaces"**, UNC Technical Report 95-005, University of North Carolina (1995).

[Debevec96] Debevec P. E., Taylor C. J., Malik J., **"Modeling and Rendering Architecture from photographs: A hybrid geometry- and image-based approach"**, SIGGRAPH (1996).

[Riegler20] Riegler G., Koltun V., "Free View Synthesis", ECCV (2020).

[Mildenhall2020] Mildenhall B., Pratul P. Srinivasan, Tancik M., Barron J. T., Ramamoorthi R., Ng R., "NeRF: Representing Scenes as Neural Radiance Fields for View Synthesis", ECCV (2020)

[WIKI1] <u>https://en.wikipedia.org/wiki/Light_field</u> [WIKI2] https://en.wikipedia.org/wiki/QuickTime_VR



Thank you very much for your attention!

More material in http://icarus.csd.auth.gr/cvml-web-lecture-series/

Contact: Prof. I. Pitas pitas@csd.auth.gr

