

# Algorithms for Image-Based Rendering with an Application to Driving Simulation

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# Graphics for Driving Simulators

- Requirements for Computer Graphics (CG) in driving simulators
  - Realism
  - Large environments
  - Ease of Creation
  - Variety
- Current practice
  - Computer Graphics with Synthetic Content

# Current Graphics for Simulators

- Getting better but:
  - Hard to create environments
  - Realism not quite there yet



CARLA – Intel



Gazebo

# Computer Graphics (CG) with Synthetic Content

Can provide realistic content, but...

- Requires huge amount of manual labor, high cost
- Rendering quality can be good, but expensive



CG is about *creating* images

- Ultimately a *forward* process
- Often involves simulation or procedural methods

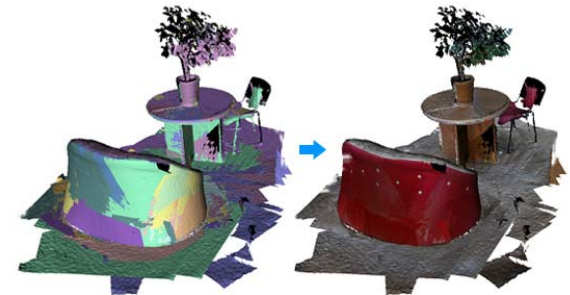


# Captured Content

- Multi-view stereo, game changer



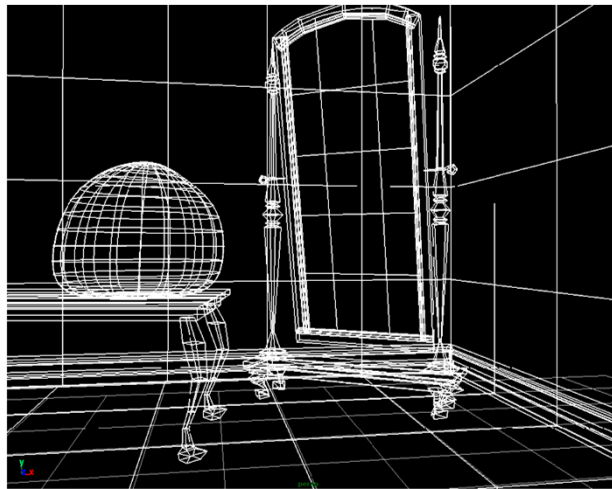
- Multiplication of sensors
  - Traditional expensive: LIDAR etc.
  - Cheaper, accessible: Kinect etc



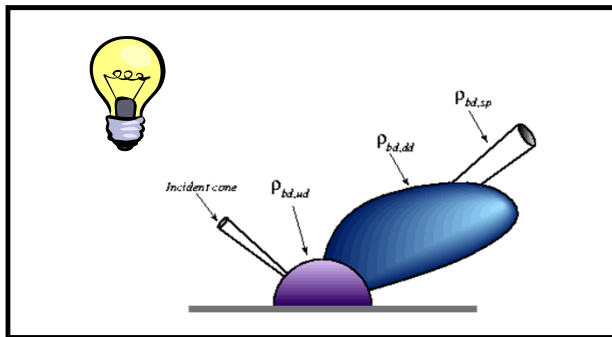
Capture methods seen as *inverse* problem

- Frequently use optimization methods
- Image synthesis is often the ultimate goal

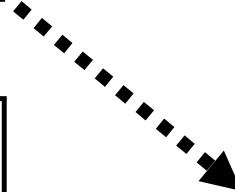
# Traditional Computer Graphics



3D geometry



physics



projection



# The richness of our everyday world



Photo by Svetlana Lazebnik

# Creating Realistic Imagery

## Computer Graphics



- + great creative possibilities
- + easy to manipulate  
objects / viewpoint / light
- Tremendous expertise and work  
for realism

## Photography



- + instantly realistic
- + easy to acquire
- very hard to manipulate  
objects / viewpoint / light



# Creating Realistic Imagery

Computer Graphics



- + great creative possibilities
- + easy to manipulate objects / viewpoint / light
- Tremendous expertise and work for realism

Image-Based  
Render (IBR)

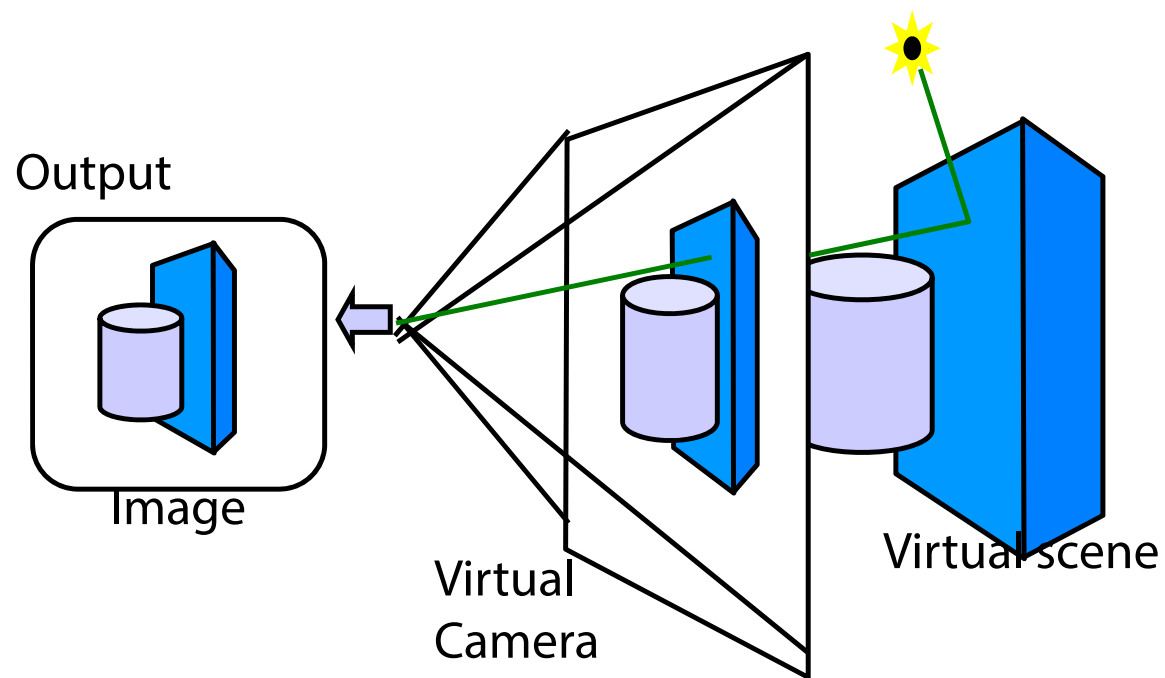
Realism  
Ease of creation  
Manipulation

Photography

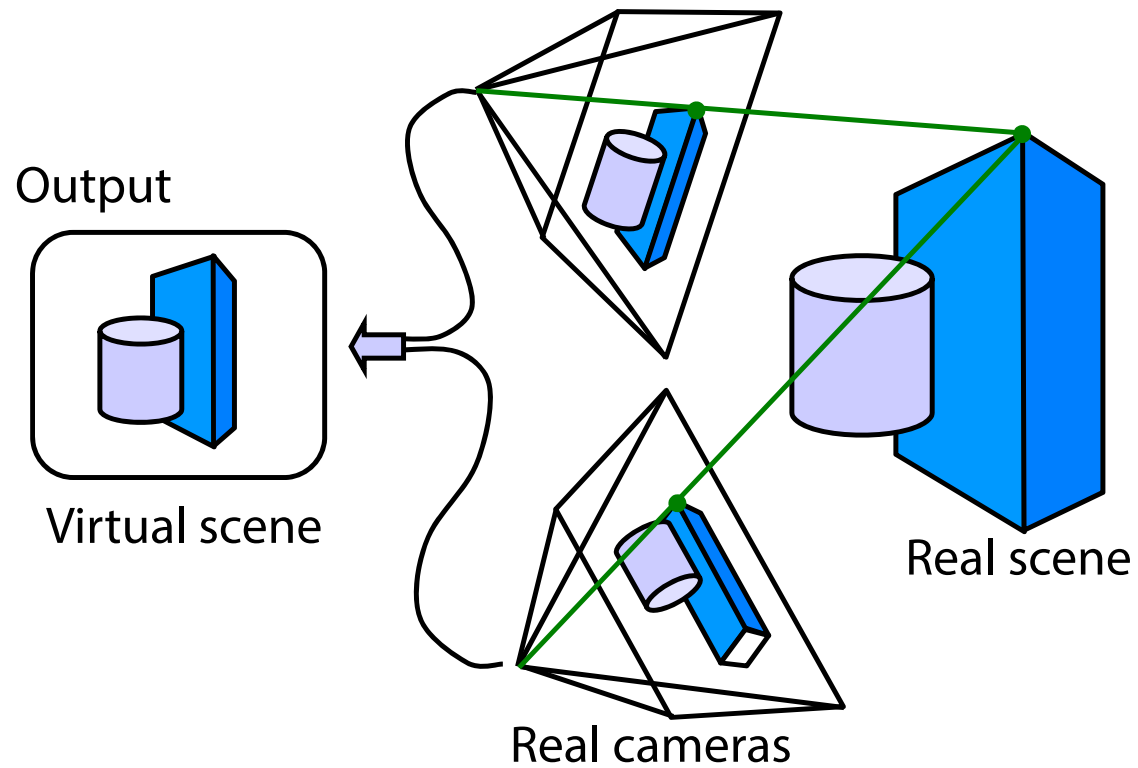


- + instantly realistic
- + easy to acquire
- very hard to manipulate objects / viewpoint / light

# Image synthesis

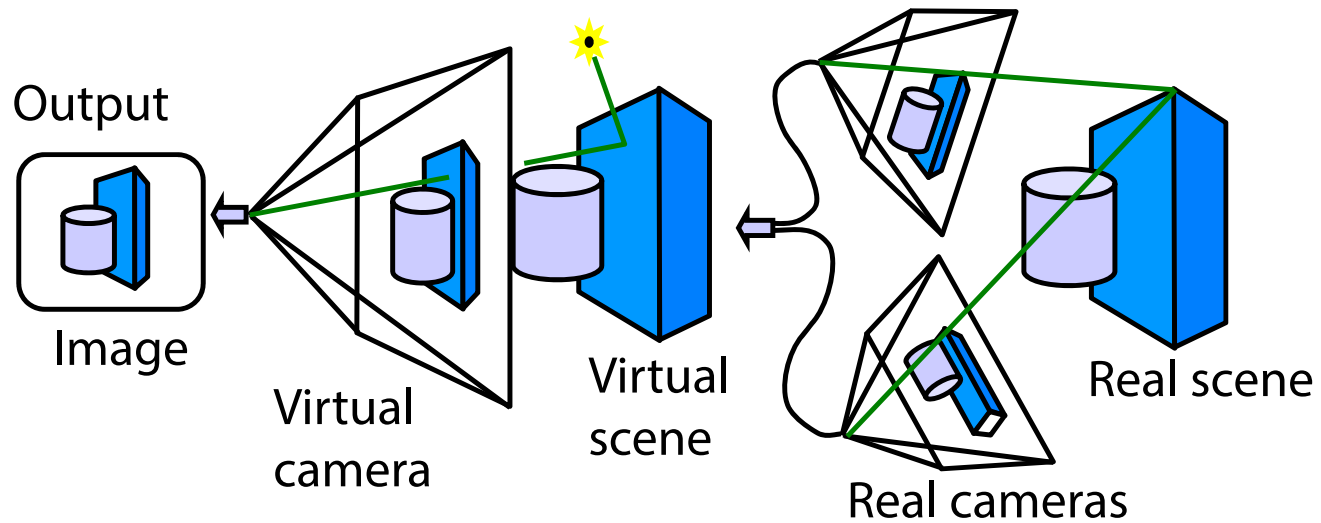


# Computer vision

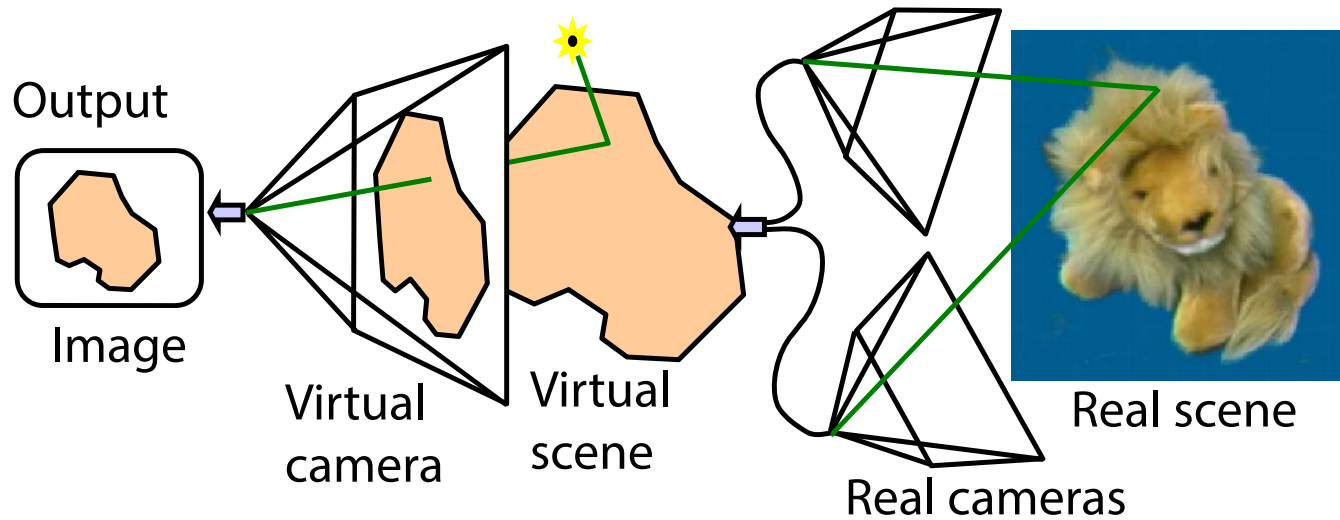




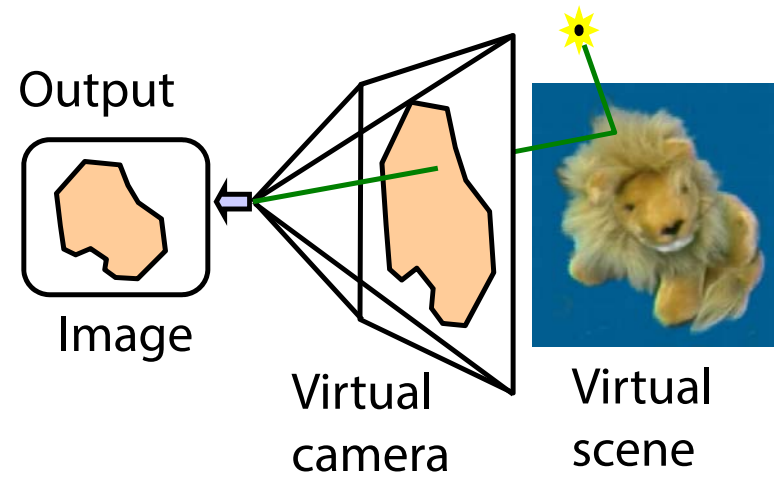
# Computer vision and graphics



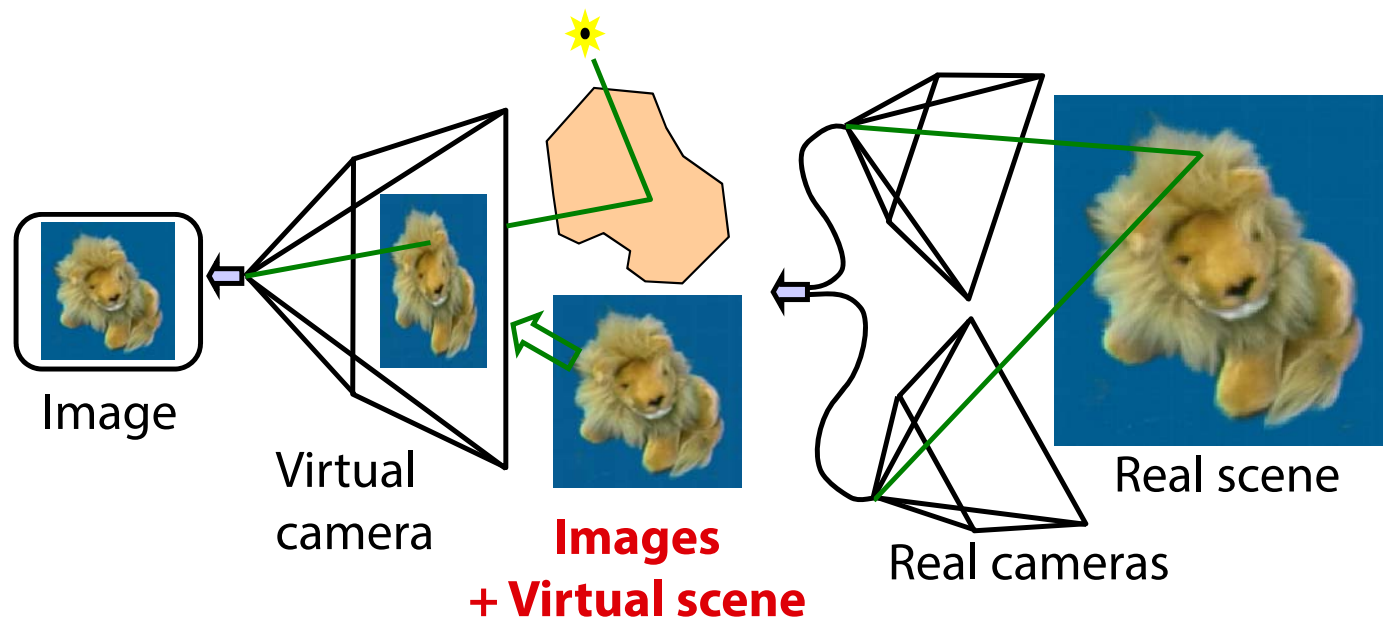
# Imperfect computer vision



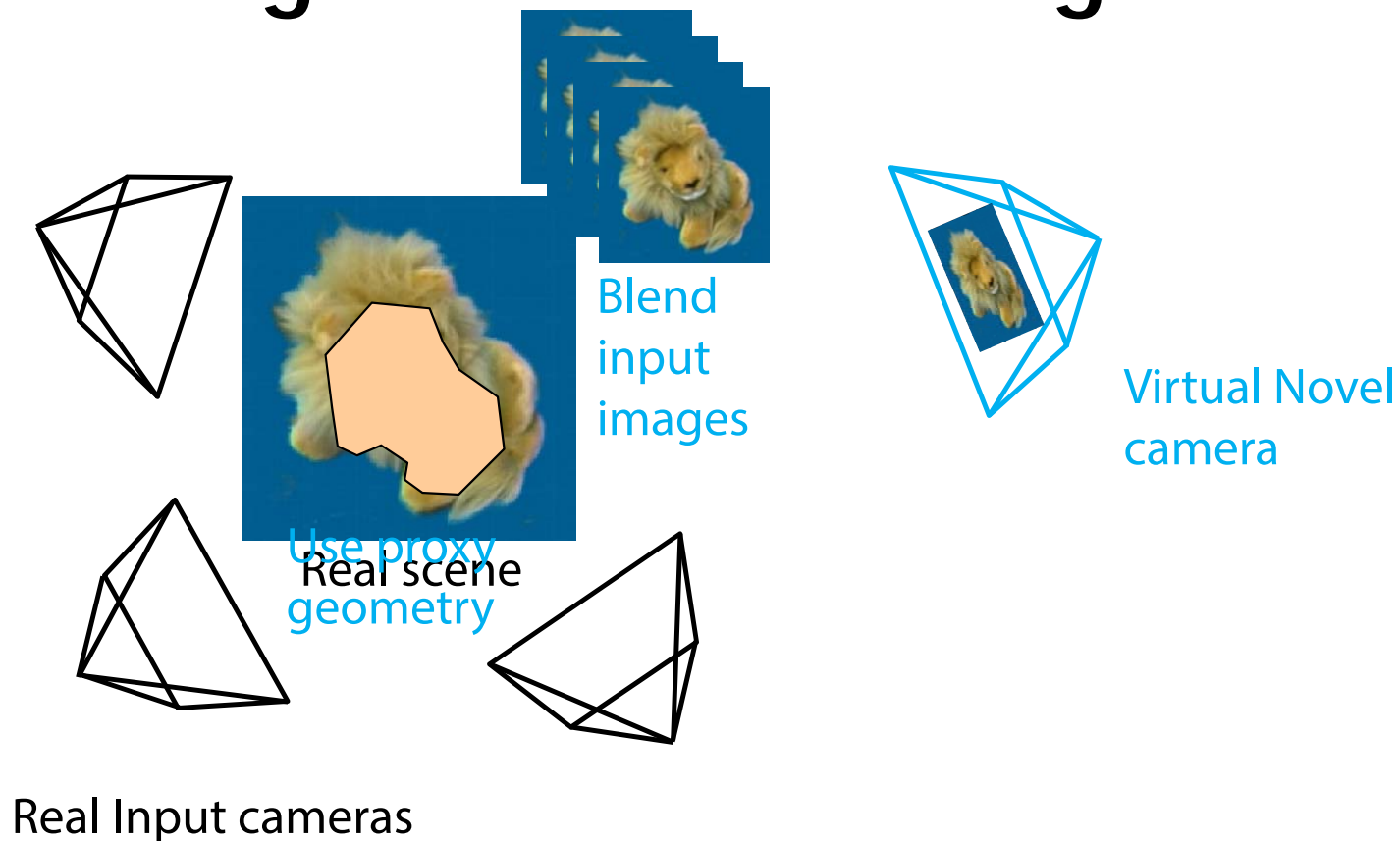
# Imperfect computer graphics



# Image-based rendering (IBR)



# Image-based rendering

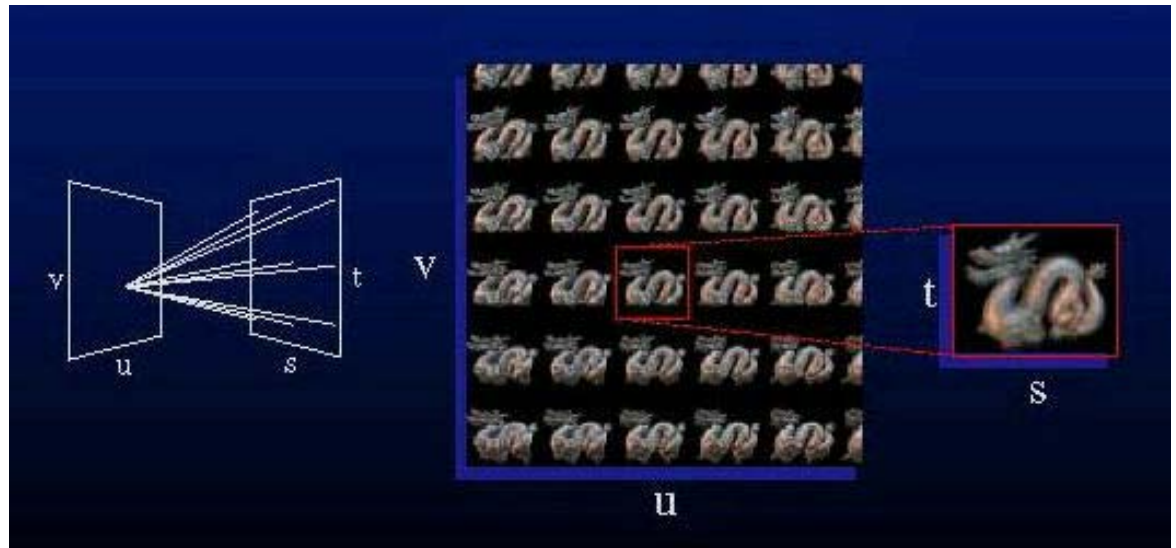


# **Background on IBR**

# Capturing multiple viewpoints

Capture the **Lightfield** [Levoy and Hanrahan, SIGGRAPH 1996]

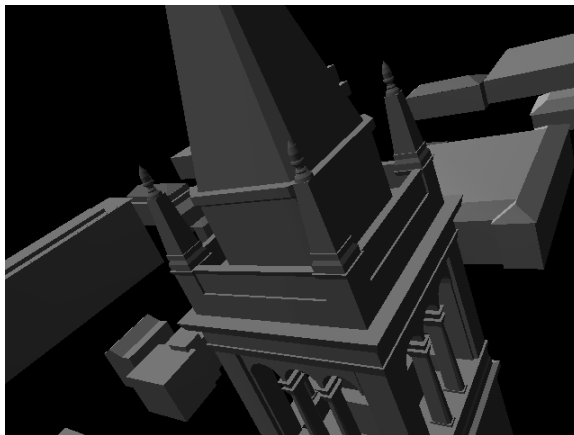
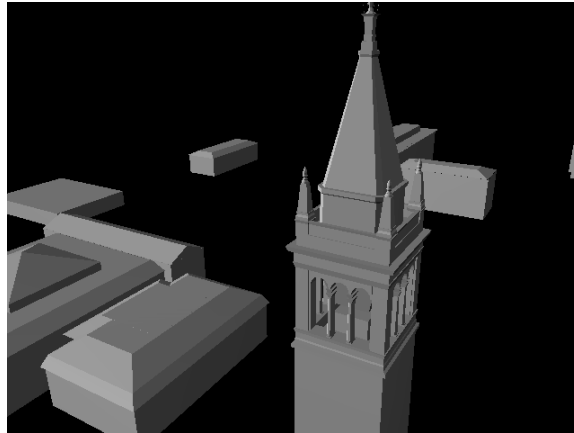
Every light ray from camera plane  $(u,v)$  in direction of the image plane  $(s,t)$



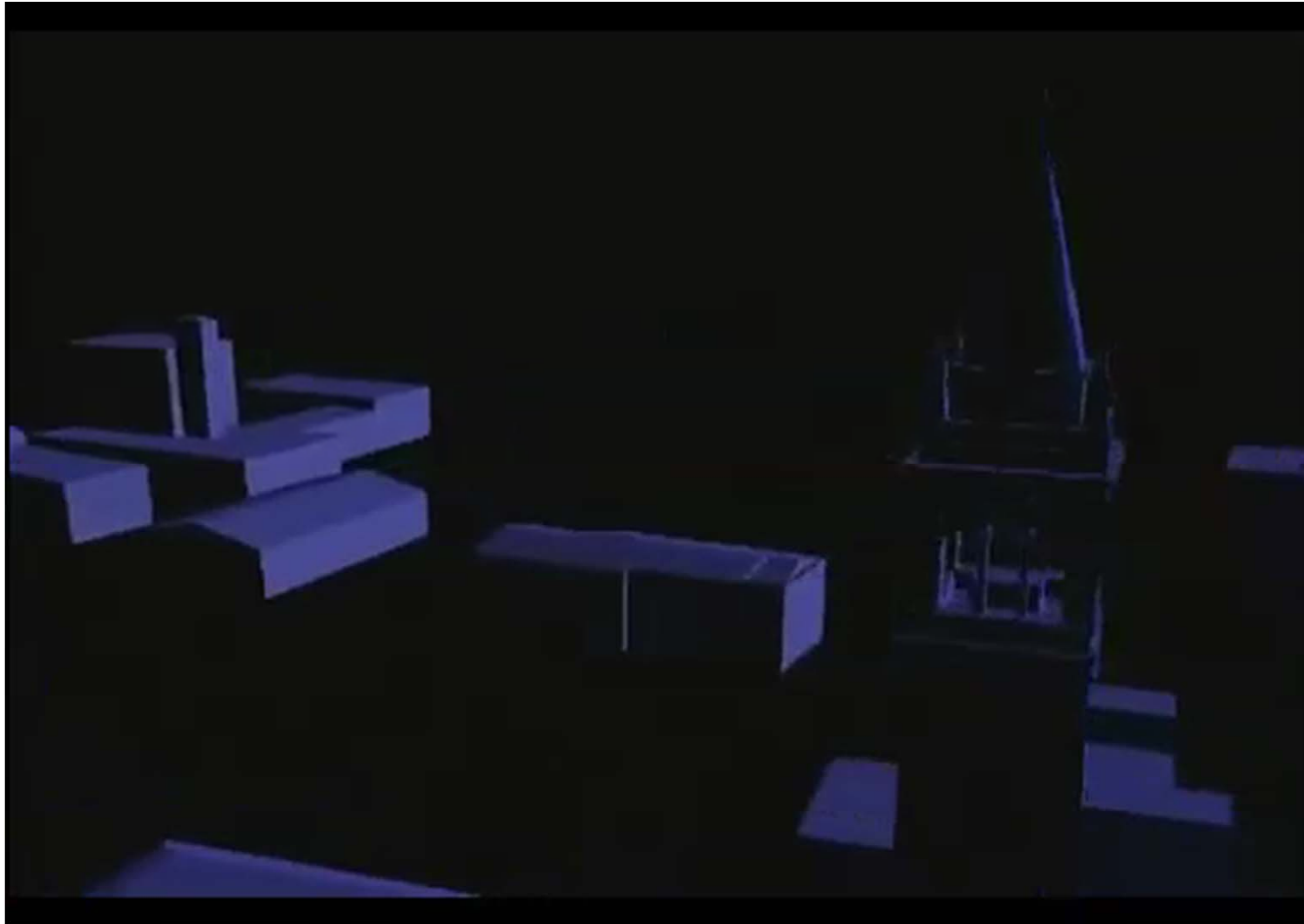
Lots of data! High redundancy, compression



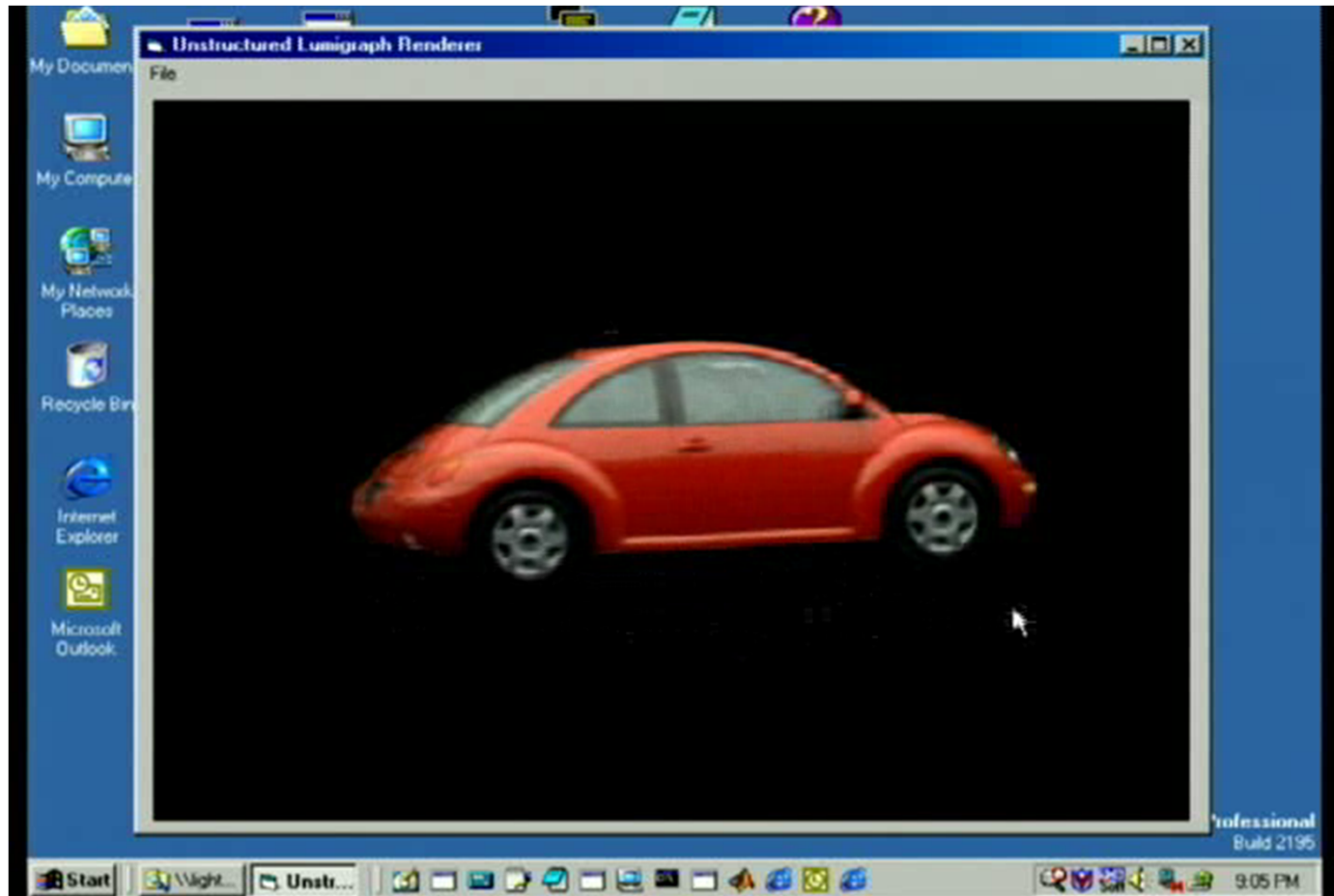
# View-dependent texture mapping [Debevec & Malik SIGGRAPH 1997]



# View-dependent texture mapping [Debevec & Malik SIGGRAPH 1997]



# Unstructured Lumigraph (ULR) [Buelher et al. SIGGRAPH 2001]



# Recent Image-Based Rendering

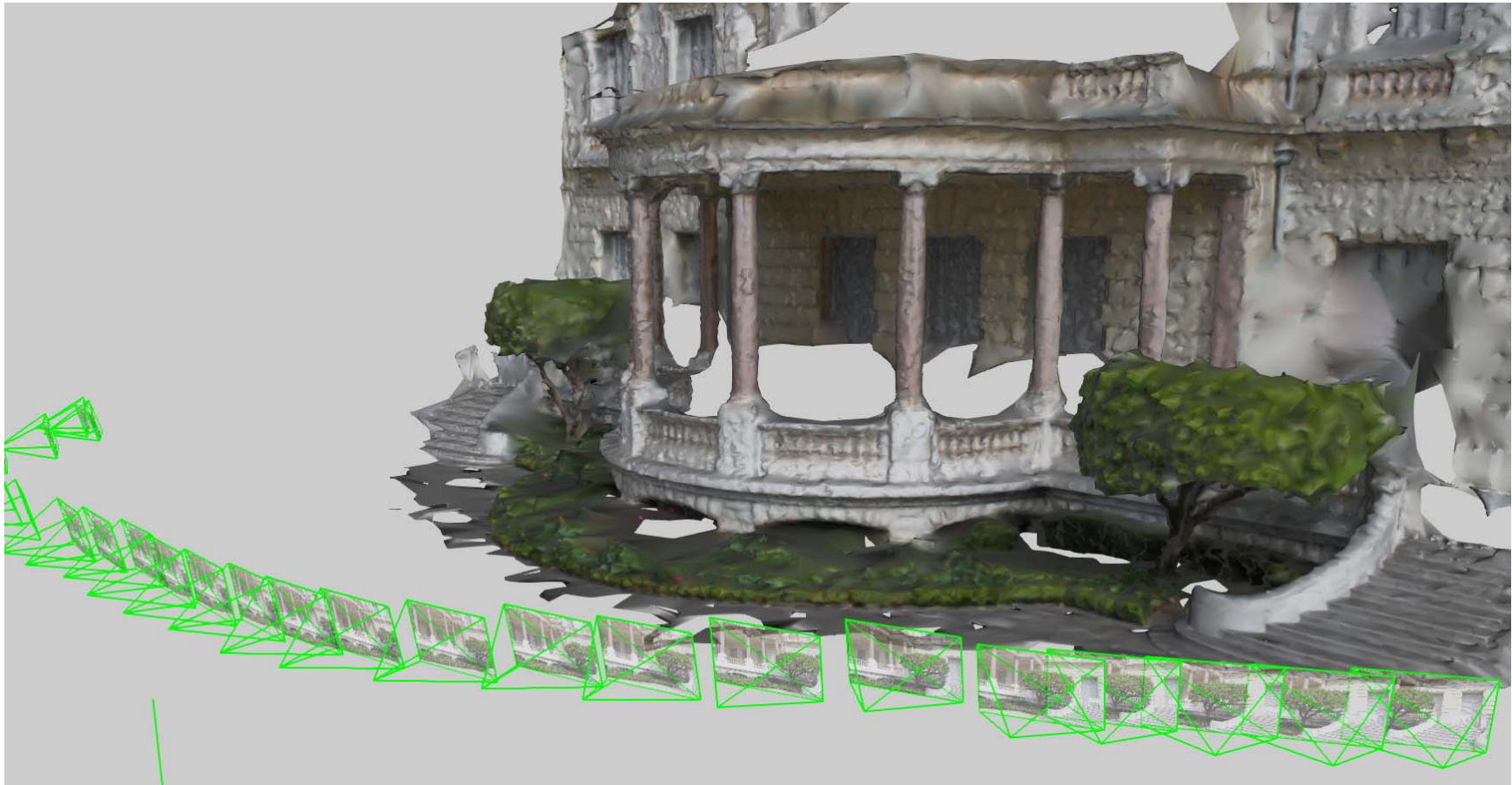
- Approximate multi-view capture of a scene
  - Camera calibration (Structure from Motion, SfM)
  - Multi-view Stereo reconstruction (MVS)
- Now a mature technology, commercially available solutions
  - Bentley/Acute3D ContextCapture
  - RealityCapture
  - PhotoScan
  - ... etc



# Multi-View Stereo



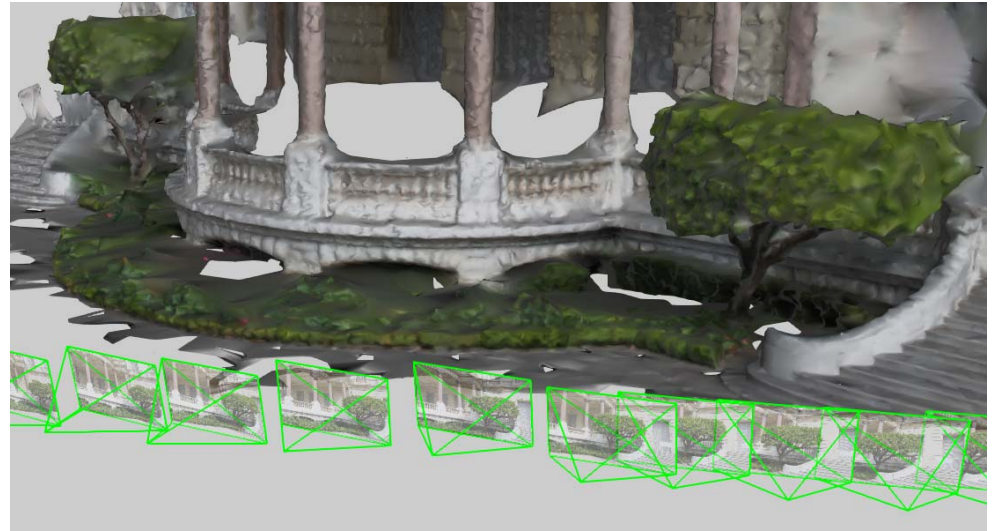
# Multi-View Stereo





# SfM and MVS

- We have the positions and orientations of the camera for each photo



- We have an approximate geometric model
  - Missing parts and details
  - Overestimated geometry
  - Bad normals/surface reconstruction



**How to render ?**

## Option 1: Textured Mesh



# Textured Mesh



# Option 2: Traditional IBR

## Basic Idea

- Use MVS *geometry* and *blend* images using a set of “clever” *weights*
- Image blending:
  - Corrects some of the geometry errors
  - Provides some view-dependent effects

## Option 2: ULR [Buehler 2001]



# Prior work: ULR? [Buehler2001]



Moving highlights

# Novel Solutions for IBR at Inria/GRAPHDECO

Address two main shortcomings:

- Inaccurate proxy geometry
- Finding good blending weights

How ?

- Create a representation *per-view* overcoming limitations on geometry
- New algorithms to improve blending of different views



# **Depth synthesis and local warps for plausible image-based navigation**

G. Chaurasia, S. Duchêne,  
O. Sorkine-Hornung, G. Drettakis

ACM Trans. On Graphics 2013

# Main Problems

- Sparse depth
- Occlusion boundaries



# Compensate using 2D image-based approximations

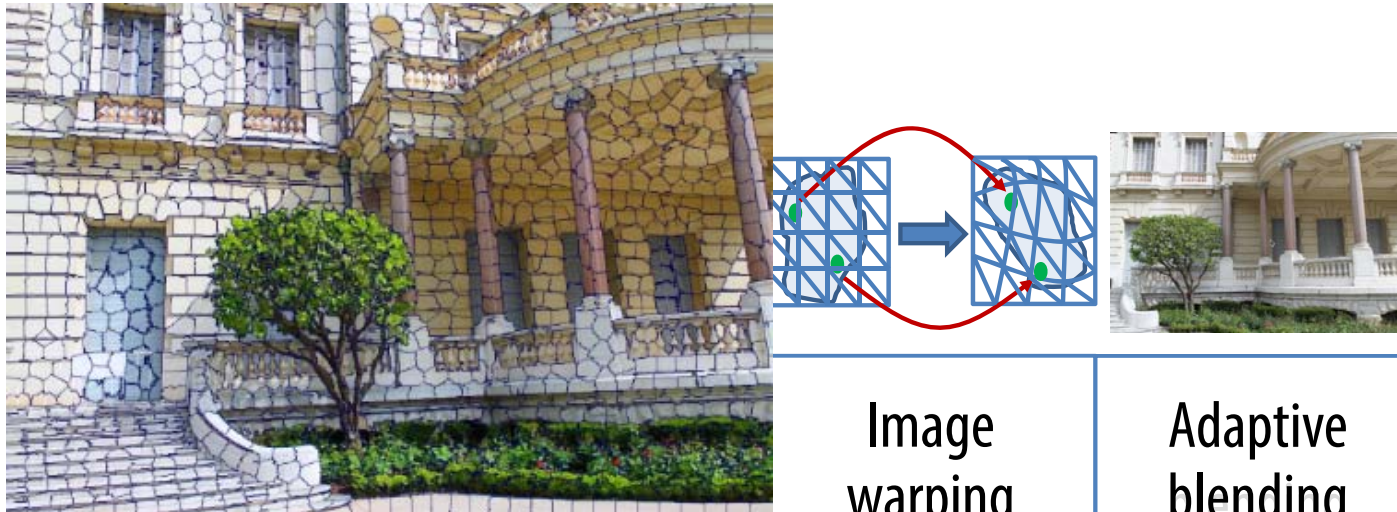


Image  
warping

Adaptive  
blending

Fill depth in empty regions and use only one image for image warps

# Local Shape Preserving Warp



Image reprojected into novel view using depth samples



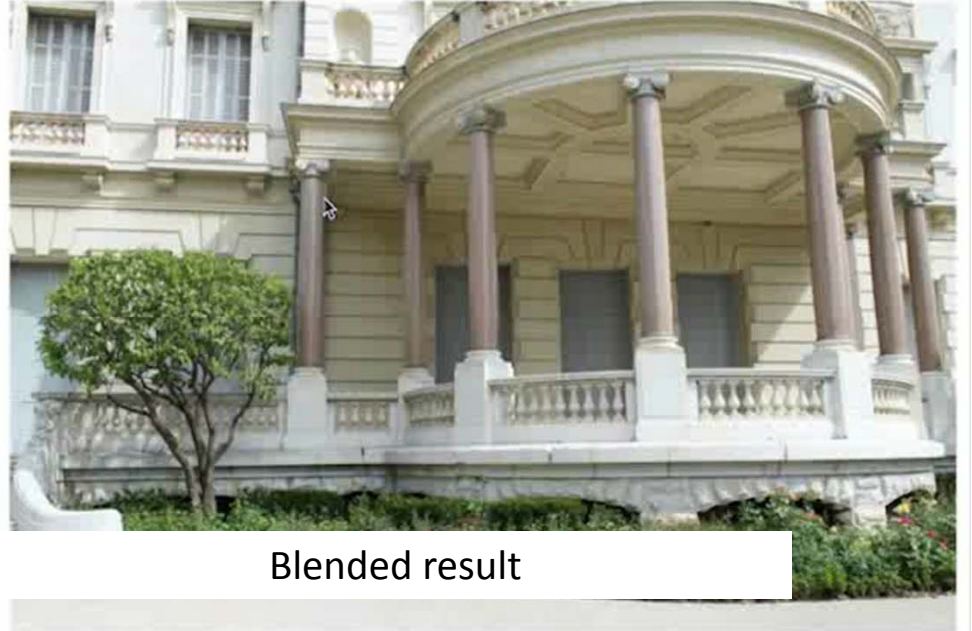
Image warped into novel view using shape-preserving warp



# Warp and Blend



Warped images



Blended result

# Results



# Scalable Inside-Out Image-Based Rendering

Peter Hedman <sup>1</sup>, Tobias Ritschel <sup>1</sup>, George  
Drettakis <sup>2</sup>, *Gabriel Brostow* <sup>1</sup>

*UCL* <sup>1</sup>, *Inria* <sup>2</sup>

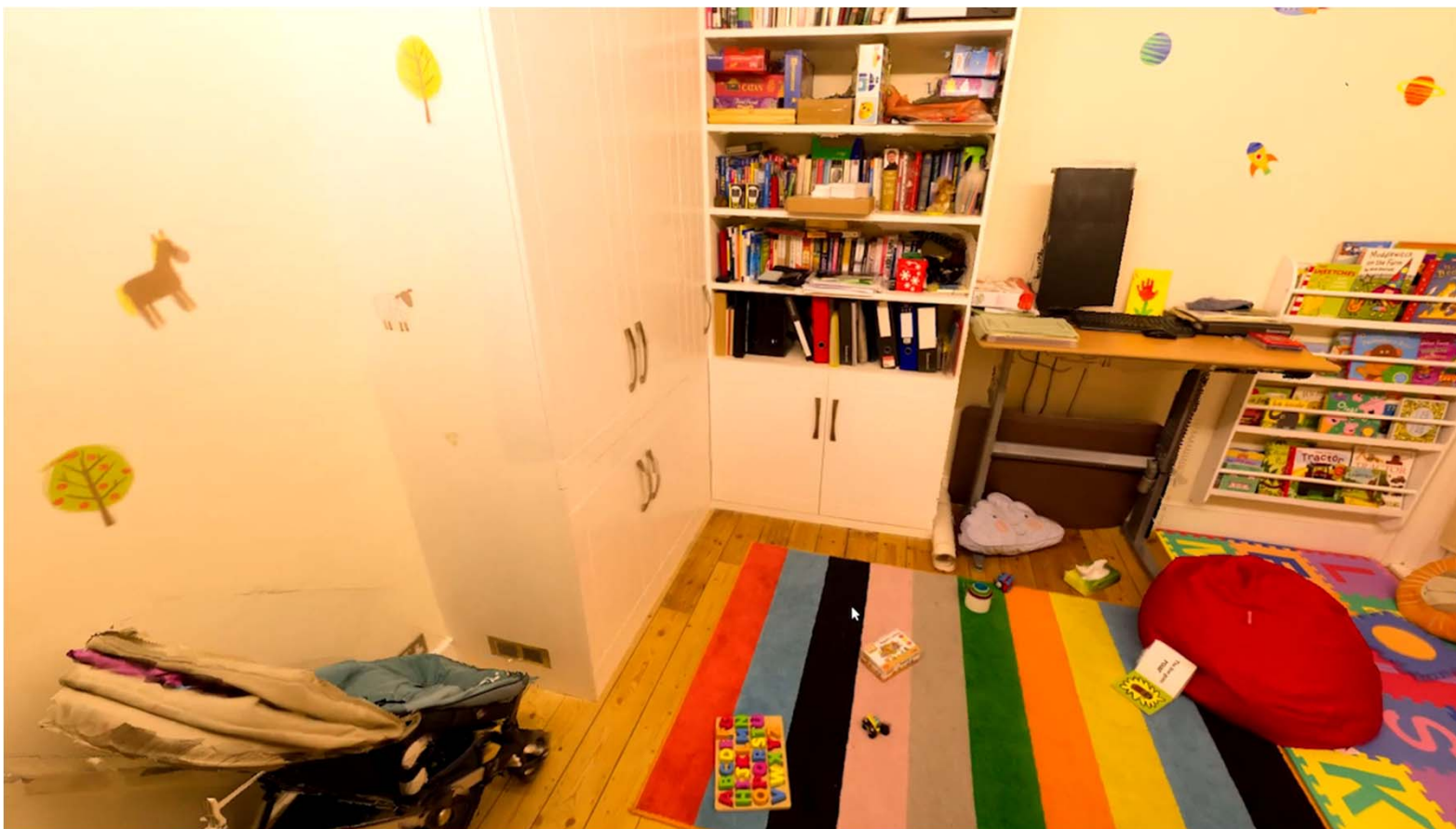
*ACM Transactions on Graphics*  
*(SIGGRAPH Asia 2016)*

# Improving Per-View Representation

- Improve per-view representation
  - Per-view *meshes*
- Start with Indoors Scenes
  - Initial version using depth sensors



# Indoors Scenes



# Indoors Scene

- Use Kinect to get reasonable *global* geometry
- Needs a large number of photos to cover the space
  - Larger overlap than outdoors

# Prior work: Unstructured Lumigraph (ULR)?

[Deveci1998, **Buehler2001**, Eisemann2008]



Inaccurate geometry

# Prior work: Per-photograph geometry!

[**Ours**, Zitnick2007, Chaurasia2013, Kopf2013, Ortiz-Cayon2015]



Refined geometry

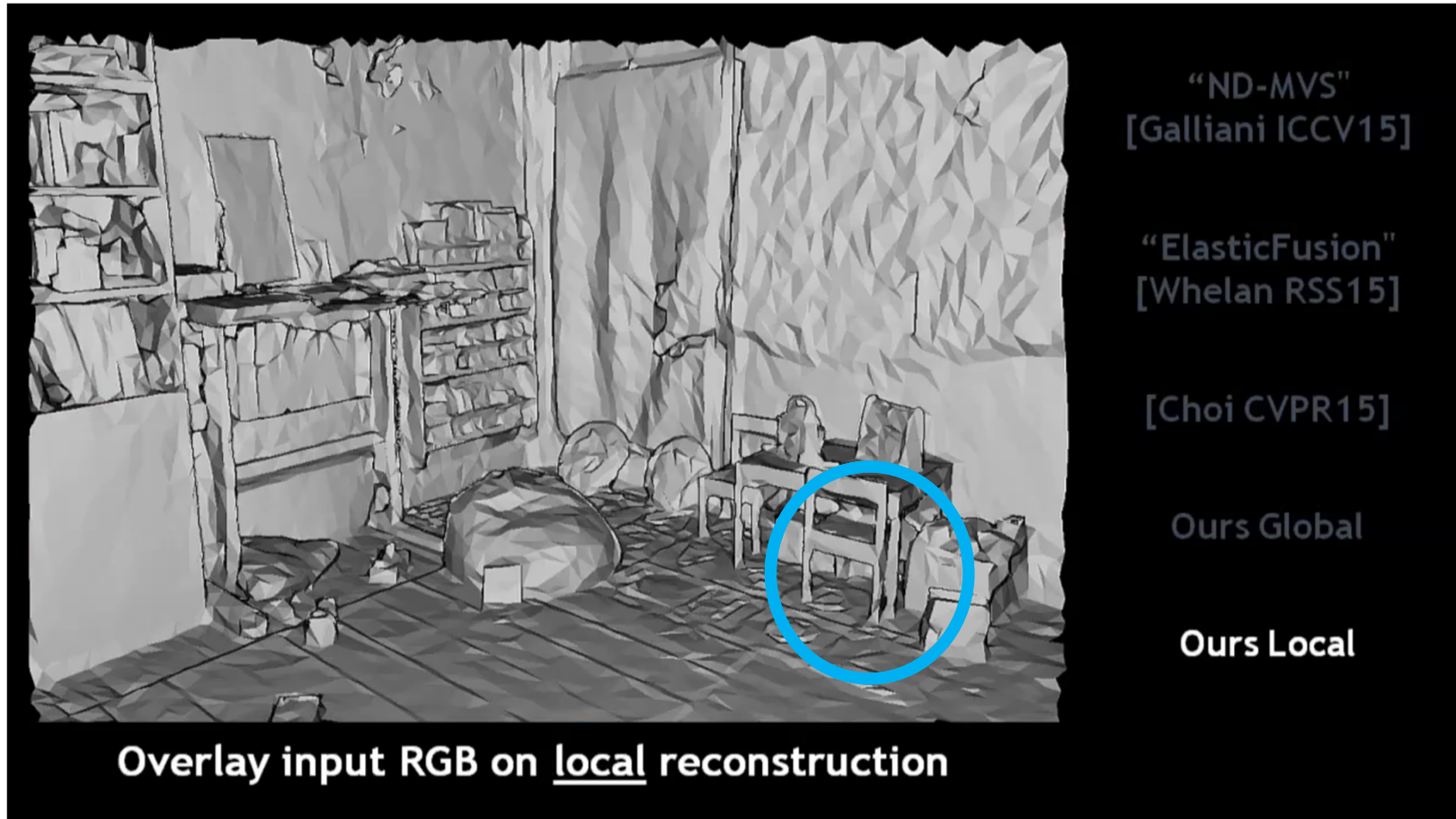


## Refining per-photograph geometry

### Triangulated mesh



# Indoors scenes





# Indoors scenes



**Museum scene: 298 input images**

# Deep Blending for Image-Based Rendering

Peter Hedman <sup>1</sup>, Julien Philip <sup>3</sup>, True Price <sup>2</sup>, Jan-Michael Frahm <sup>2</sup>, George Drettakis <sup>3</sup>, *Gabriel Brostow* <sup>1</sup>

*UCL* <sup>1</sup>, *UNC* <sup>2</sup>, *Inria* <sup>3</sup>

*ACM Transactions on Graphics (SIGGRAPH Asia 2018 –  
conditionally accepted)*

# Deep Blending

- Further improve per-view meshes
  - Better refinement
  - Edge-aware mesh simplification
  - Can treat **outdoors** scenes !
- Learn blend weights by training in a leave-one-out manner
  - Train on 19 datasets, total of 2600 images
  - Learn blending weights

# Deep Blending Results



# Outdoors Scene: texture mapping





# Deep Blending Results





# Additional Challenges

- Changing the scene is hard in IBR
- Two advances:
  - Removing / moving objects
  - Changing the lighting (“relighting”)

# Plane-Based Multi-View Inpainting for Image-Based Rendering

Julien Philip

Inria, Université Côte d'Azur

George Drettakis

Inria, Université Côte d'Azur

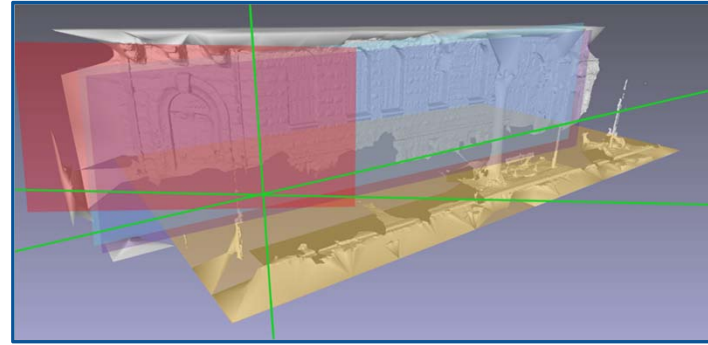
*ACM SIGGRAPH Symposium on Interactive 3D Graphics and Games  
Montreal, Quebec, Canada: 17 May 2018*



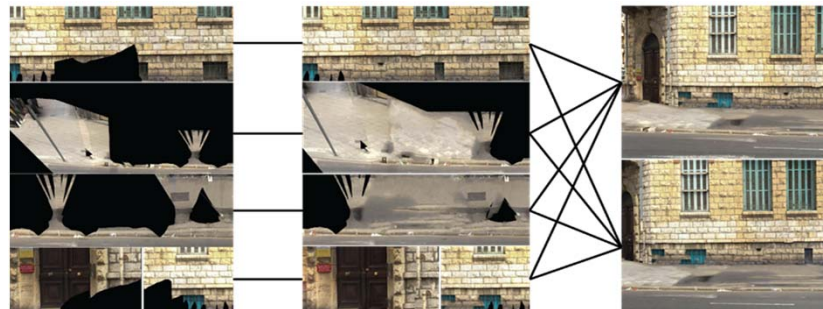
DEMO

# Remove Objects

- Perform multi-view *inpainting*
  - Estimate local planar approximation of surface



- Perform efficient multi-scale, resolution-aware inpainting using PatchMatch



Inpaint planar regions

Inpaint input images

# Some of the Input Images





# Our result



# Our result





# Multi-View Relighting for Outdoors Scenes

S. Duchêne, C. Riant, G. Chaurasia, J. Lopez-Moreno, P-Y. Laffont, S. Popov, A. Bousseau, G. Drettakis

*ACM Transactions on Graphics 2015*

# Intrinsic Decomposition

Guide decomposition combining  
3D information, rendering  
and image-processing



Input Image



Reflectance



Shading

# Results





# Image-Based Relighting



# Application to Image-Based Rendering with Relighting





# Driving Simulation Application

- First challenge: capture of large scenes
  - Previous examples 20-200 images
  - Need 1000-2000 images for a city block
- Solution:
  - “Inria-bike” capture:



# Driving Simulation Application

- Second challenge: Rendering large scenes with thousands of pictures
  - CPU memory; loading from disk
  - GPU memory; loading from CPU
- (Initial) Solution:
  - Streaming system

# Driving Simulation Application

- Demo !
- Note: Semi-automatic cleanup for mesh outliers and moving cars (in the process of being automated)



```
Frame 843 - onStreamGPULoading Camera 407 [success=1]
Frame 841 - onStreamGPULoading Camera 654 [success=1]
Frame 839 - onStreamGPULoading Camera 639 [success=1]
Frame 837 - onStreamGPULoading Camera 453 [success=1]
Frame 835 - onStreamGPULoading Camera 2016 [success=1]
Frame 843 - onStreamGPULoading Camera 672 [success=1]
Frame 841 - onStreamGPULoading Camera 645 [success=1]
Frame 839 - onStreamGPULoading Camera 1143 [success=1]
Frame 837 - onStreamGPULoading Camera 1148 [success=1]
Frame 835 - onStreamGPULoading Camera 446 [success=1]
Frame 835 - onStreamGPULoading Camera 1359 [success=1]
```

# Future Work

- Correct remaining artifacts
  - Solution for reconstruction & rendering of cars
  - Hard cases in general:
    - Thin structures,
    - Reflections, transparency
  - Ad-hoc, specific solutions
  - Semantics & Learning to the rescue ?



# Future Work

- Allow more editing
  - Better relighting solution
  - More geometry editing
- Seamless mix with synthetic content
  - Combine rendering modalities; develop solutions that are not mutually exclusive (ERC FUNGRAPH)

# Conclusions

- Very promising technology to provide highly realistic CG for driving simulators
  - But technology must mature before “prime time”
- Could be a “game-changer” for realism in driving simulation
  - (Human) Training in assisted driving
  - (Machine) Training for autonomous driving

# Funding

- EU FP7 VERVE <https://gv2.scss.tcd.ie/VERVE/>
- EU FP7 CR-PLAY <http://www.cr-play.eu/>
- EU H2020 EMOTIVE <https://www.emotiveproject.eu/>
- ANR SEMAPOLIS <https://project.inria.fr/semapolis/>



# Thank you

Questions ?

