### **Neural Rendering**

### CS 482 Interactive Computer Graphics Jaeyoon Kim (TA)





 NeRF: Representing Scenes as Neural Radiance Fields for View Synthesis



# **Neural Rendering**

• Deep Learning + Rendering = Neural Rendering

• A very new and rapidly emerging field



#### **Semantic Photo Synthesis and Manipulation**













Remove chairs



Output result

Input photo

Add windows

Output result



Input photo

Input photo



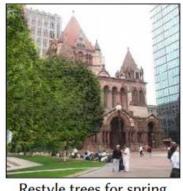
Change rooftops



Output result







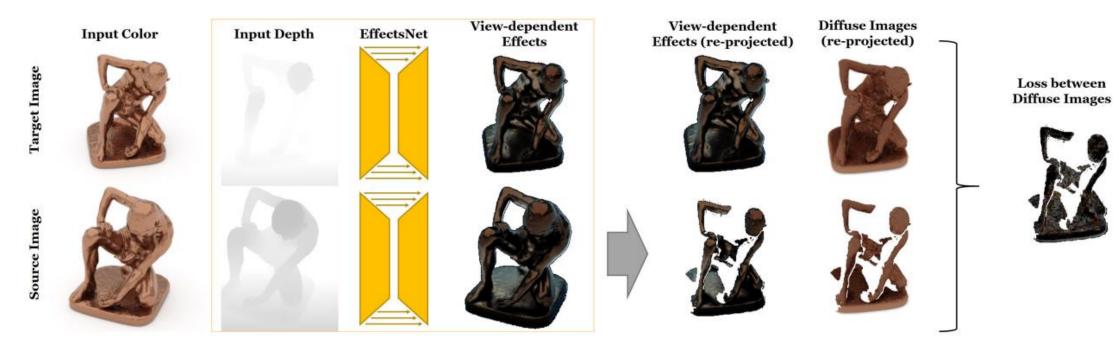
Restyle trees for spring



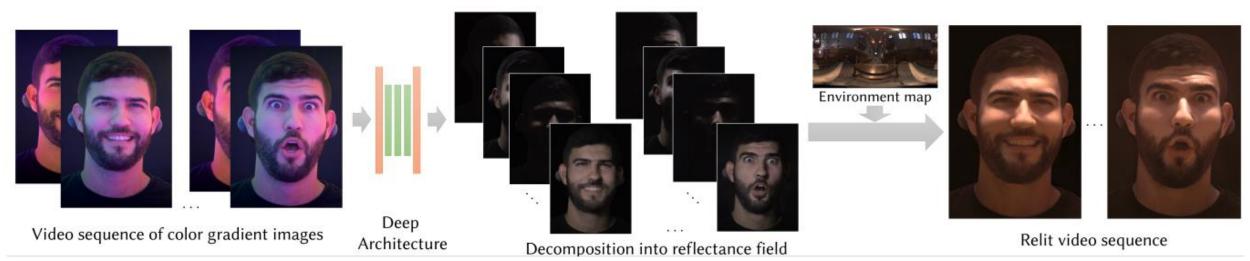
Restyle trees for autumn



- Semantic Photo Synthesis and Manipulation
- View Synthesis



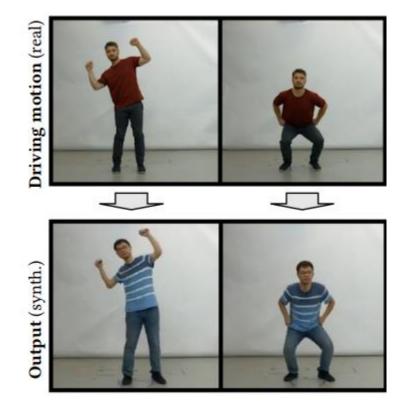
- Semantic Photo Synthesis and Manipulation
- View Synthesis
- Relighting





- Semantic Photo Synthesis and Manipulation
- View Synthesis
- Relighting
- Facial/Body Reenactment







- Semantic Photo Synthesis and Manipulation
- View Synthesis
- Relighting
- Facial/Body Reenactment
- Anything else combining deep learning and CG concepts!



- A novel view image generation by neural radiance fields and volume rendering
- A fully-connected network representing radiance fields
- Trained from a set of images with known camera poses



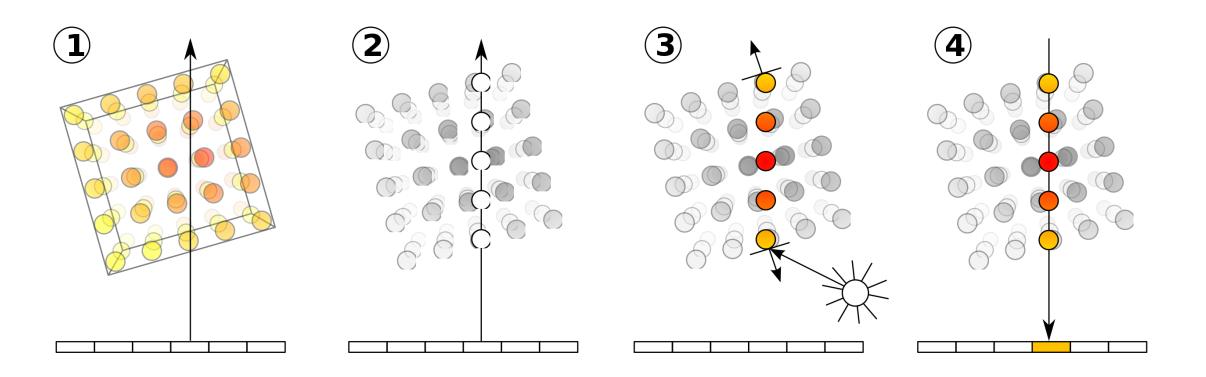


#### Radiance fields

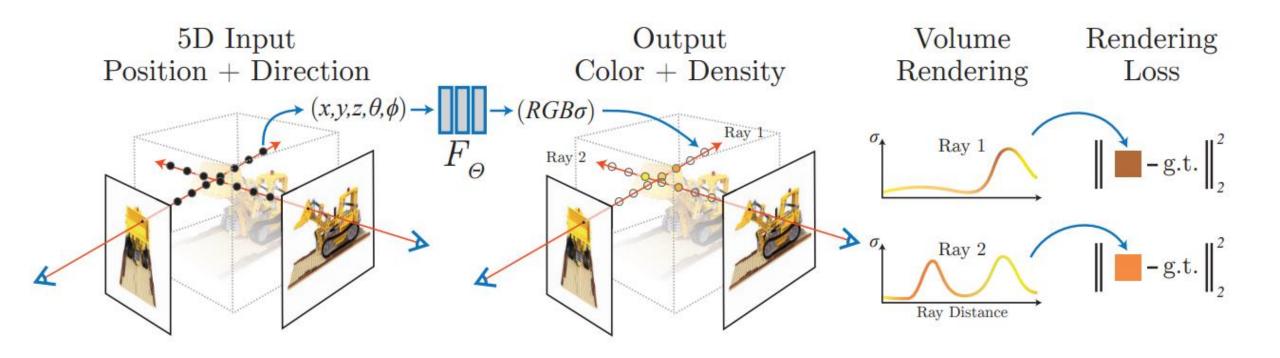
- A vector function representing radiance in every direction through every point in space
- $L: \mathbb{R}^3 \times S^2 \to \mathbb{R}^3$
- $(x, y, z) \times (\theta, \phi) \mapsto (r, g, b)$



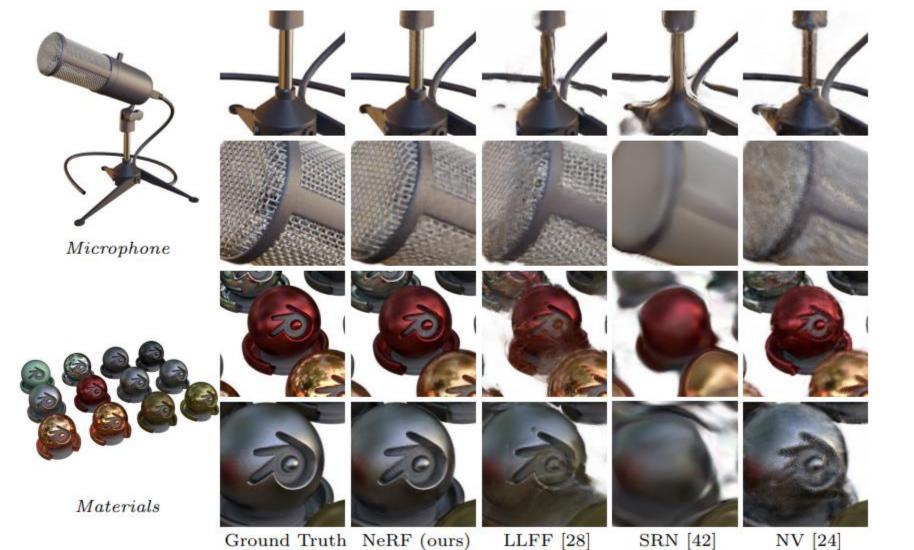
#### • Volume rendering



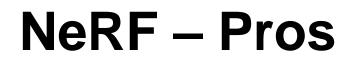








KAIST



- High quality of details
- Low memory (~5MB for MLP Weights)
  - No other data required (e.g. Mesh, Voxel grids, etc.)



### NeRF – Cons

- Slow training & inference
  - Training: 1-2 days for NVIDIA V100 GPU
  - Inference: few seconds for FHD image
- Train one model for one scene
  - No generalization
- Scalability to large scenes

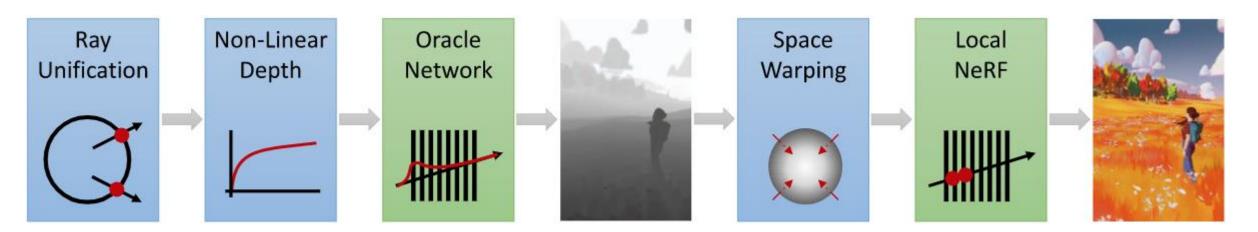
### **Further Discussion**

- Faster training/inference
- Generalization on various scenes
- Multiscale representation
- Better detail reconstruction via position encoding
- Extend task



# **Faster Training & Inference**

- DONeRF: Towards Real-Time Rendering of Compact Neural Radiance
  Fields using Depth Oracle Networks
  - Reduce required samples via predicting locations of rays through depths
  - 48x inference cost, same quality with 4 samples compared to NeRF(256 samples)



17 Slide credit from Kyubeom Han, Paper presentation of NeRF

## **Faster Training & Inference**

• DONeRF: Towards Real-Time Rendering of Compact Neural Radiance

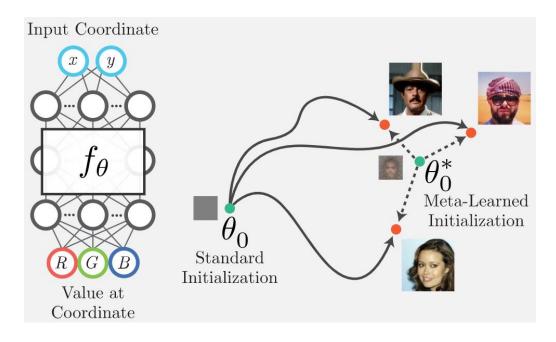
**Fields using Depth Oracle Networks** 



18 Slide credit from Kyubeom Han, Paper presentation of NeRF

### **Generalization on Scenes**

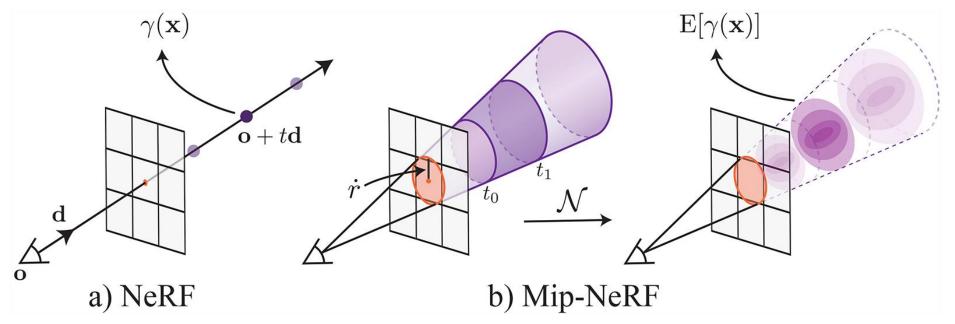
- Learned Initializations for Optimizing Coordinate-Based
  Neural Representations
  - Better initialization via meta-learning





### **Multiscale Representation**

- Mip-NeRF: A Multiscale Representation for Anti-Aliasing Neural Radiance Fields
  - Mipmap for various scale representation and better positional encoding





### **Multiscale Representation**

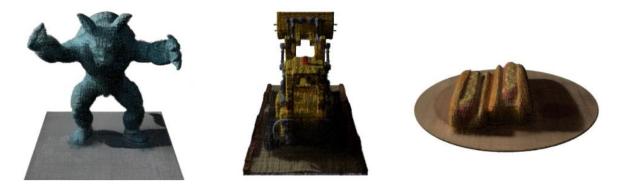
 Mip-NeRF: A Multiscale Representation for Anti-Aliasing Neural Radiance Fields





# **NeRF for Relighting**

- NeRV: Neural Reflectance and Visibility Fields for Relighting and View Synthesis
  - Predicting reflectance & visibility field to deal with arbitrary lighting





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Neural rendering

 Recent neural volume rendering techniques for view synthesis



### Reference

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