

# Introduction



15-468, 15-668, 15-868  
Physics-based Rendering  
Spring 2021, Lecture 1

# Online lecture etiquette

- Lectures **are recorded**, including all discussions. This is to facilitate students that cannot attend the lectures live.
- Recordings become available on **Canvas** a few hours (usually  $\leq 3$ ) after the lecture. Please note that you are **not** allowed to share these recordings with anyone outside this class. This is to protect your FERPA rights and those of your fellow students.
- Please keep your Zoom window muted when you are not speaking.
- You are welcome to keep your camera on or off.
- Feel free to ask questions! Either use the “raise hand” option (preferable), or post in the chat. If I miss you, please repeat. And if I keep missing you, please unmute yourselves and mention that you have a question.
- I’ll be staying around for another 30 minutes after the lecture for additional Q&A.

# Overview of today's lecture

- Teaching staff introductions
- What is this course about?
- Course fast-forward and logistics

# Teaching staff introductions

# Instructor: Ioannis (Yannis) Gkioulekas

I won't hold it against you if you mispronounce my last name



Originally from Greece



National Technical University of Athens (2004-09)



Harvard University (2009-17)



Carnegie Mellon University (2017-now)

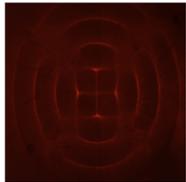


Yannis at Harvard in 2011

My website: <http://www.cs.cmu.edu/~igkioule>

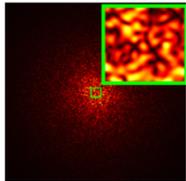
See also: <http://imaging.cs.cmu.edu/>

# Broadly interested in computational imaging, physics-based vision, and physics-based rendering



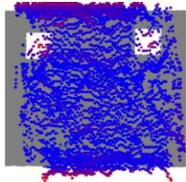
## Rendering Near-Field Speckle Statistics in Scattering Media

Adithya Pediredla, Yasin Karimi Chalmiani, Matteo Giuseppe Scopelliti, Maysam Chamanzar, Srinivasa Narasimhan, Ioannis Gkioulekas  
ACM Transactions on Graphics (SIGGRAPH Asia), 2020  
[paper](#) | [project page](#)



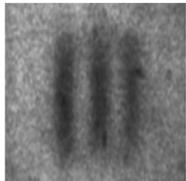
## Rendering Near-Field Speckle Statistics in Scattering Media

Chen Bar, Ioannis Gkioulekas, Anat Levin  
ACM Transactions on Graphics (SIGGRAPH Asia), 2020  
[paper](#) | [project page](#)



## A Theory of Fermat Paths for 3D Imaging Sonar Reconstruction

Eric Westman, Ioannis Gkioulekas, Michael Kaess  
IEEE International Conference on Intelligent Robots and Systems (IROS), 2020  
[paper](#) | [project page](#)



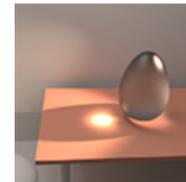
## Interferometric Transmission Probing with Coded Mutual Intensity

Alankar Kotwal, Anat Levin, Ioannis Gkioulekas  
ACM Transactions on Graphics (SIGGRAPH), 2020  
[paper](#) | [project page](#)



## Langevin Monte Carlo Rendering with Gradient-based Adaptation

Fujun Luan, Shuang Zhao, Kavita Bala, Ioannis Gkioulekas  
ACM Transactions on Graphics (SIGGRAPH), 2020  
[paper](#) | [project page](#)



## Path-Space Differentiable Rendering

Cheng Zhang, Bailey Miller, Kai Yan, Ioannis Gkioulekas, Shuang Zhao  
ACM Transactions on Graphics (SIGGRAPH), 2020  
[paper](#) | [project page](#)



## Effect of Geometric Sharpness on Translucent Material Perception

Bei Xiao, Shuang Zhao, Ioannis Gkioulekas, Wenyan Bi, Kavita Bala  
Journal of Vision (JOV), 2020  
[paper](#) | [code](#)

Use rendering to study human perception



## A Volumetric Albedo Framework for 3D Imaging Sonar Reconstruction

Eric Westman, Ioannis Gkioulekas, Michael Kaess  
IEEE International Conference on Robotics and Automation (ICRA), 2020  
[paper](#) | [project page](#)



## Towards Reflectometry from Interreflections

Kfir Shem-Tov, Sai Praveen Bangaru, Anat Levin, Ioannis Gkioulekas  
IEEE International Conference on Computational Photography (ICCP), 2020  
[paper](#) | [project page](#)

Use rendering to make reflectometry easier



## Towards Learning-based Inverse Subsurface Scattering

Chengqian Che, Fujun Luan, Shuang Zhao, Kavita Bala, Ioannis Gkioulekas  
IEEE International Conference on Computational Photography (ICCP), 2020  
[paper](#) | [project page](#)

Use rendering to make neural networks better



# TA: Bailey Miller

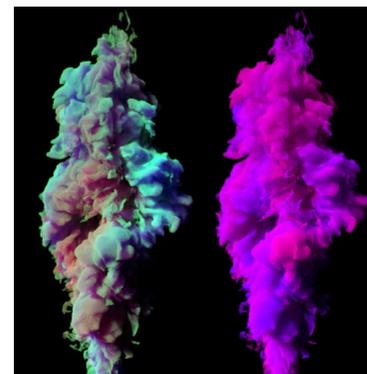
advised by Prof. Ioannis Gkioulekas

personal page: [bailey-miller.com](http://bailey-miller.com)

- **research interests:**
  - physically-based rendering
  - volumetric rendering
  - inverse graphics / differentiable rendering
- **current area of research:**
  - grid-free methods for solving the reduced wave equation



Zhang et al. '20



Miller et al. '19

dartmouth '14 to '18



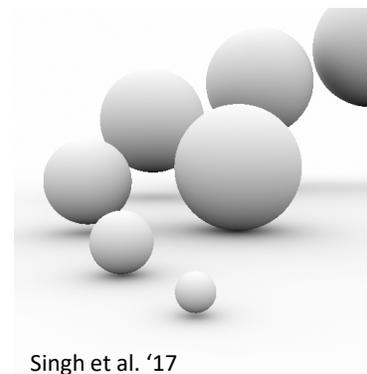
DARTMOUTH  
VISUAL COMPUTING LAB

blend '18 to '20



co-founded by a cmu  
alum!

cmu '20 to present



Singh et al. '17

What is this course about?

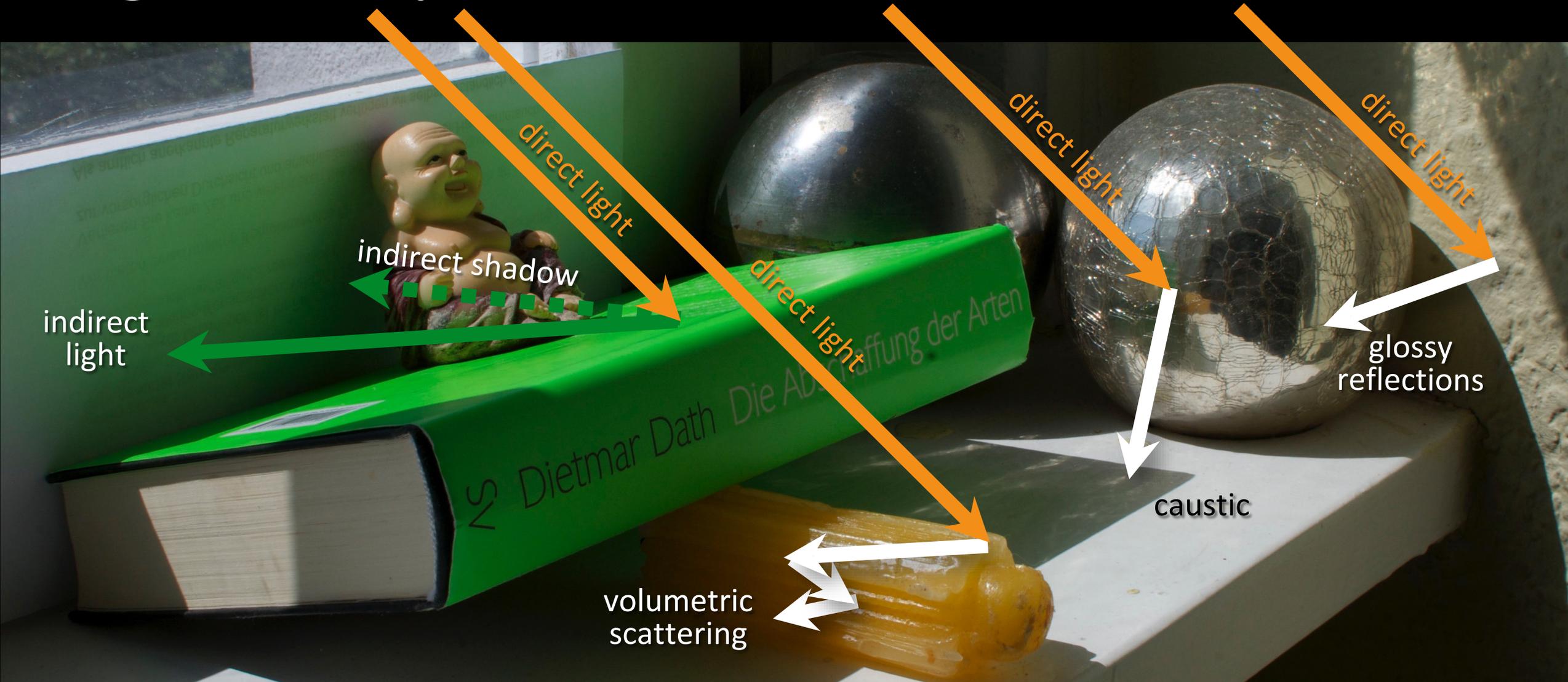
# What is this class about?

- How can we generate realistic images?
- Why do things look the way they do?

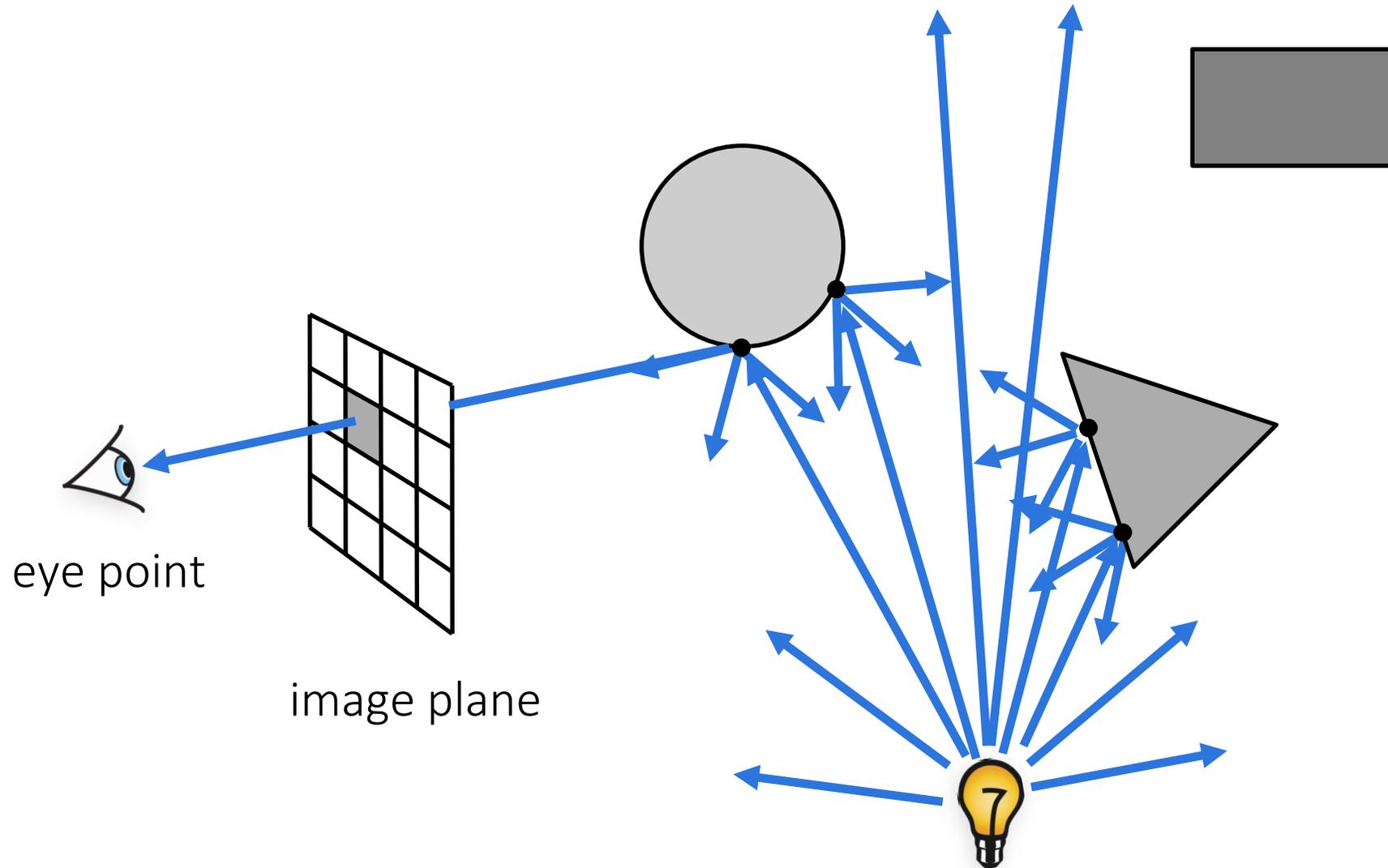
# Motivation



# Light transport in the real world



# Physics-based rendering



Mimic the physics of light transport using ray tracing

# Ray tracing in production



Arnold Renderer

SOLIDANGLE

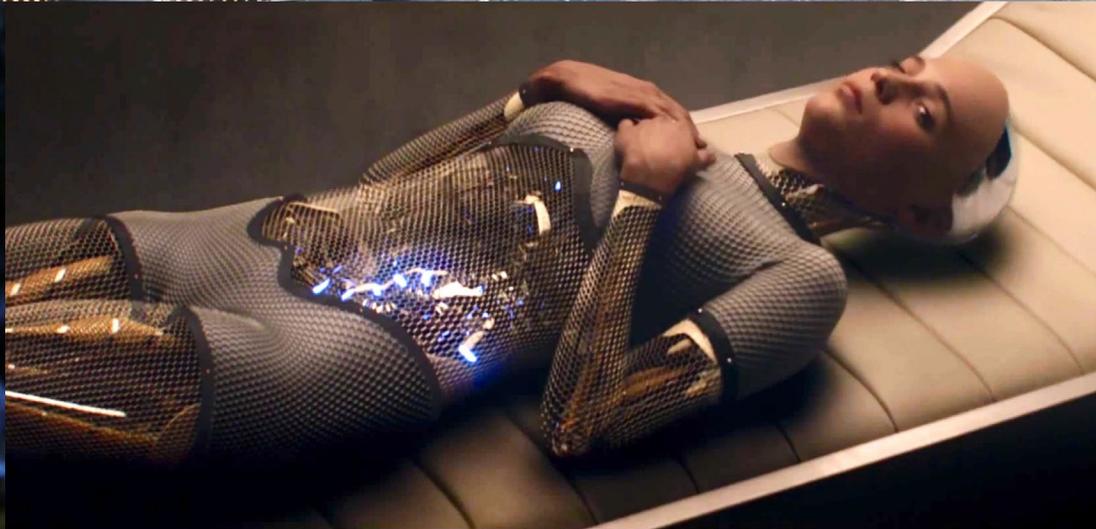


PIXAR's  
RenderMan



Hyperion

# Visual effects



# Animated films



# Video games



# Architectural visualization



# Architectural visualization



# Advertising/product visualization



# Advertising & E-commerce

**VANJA**  
Dish towel, assorted patterns white/black  
**\$4.99** / 2 pack

**PANNÅ**  
Place mat, turquoise  
**\$1.99**

**RASKOG**  
Utility cart  
**\$29.99**

**LAPPLJUNG RUTA**  
Rug, low pile, white, black

**\$79.99**



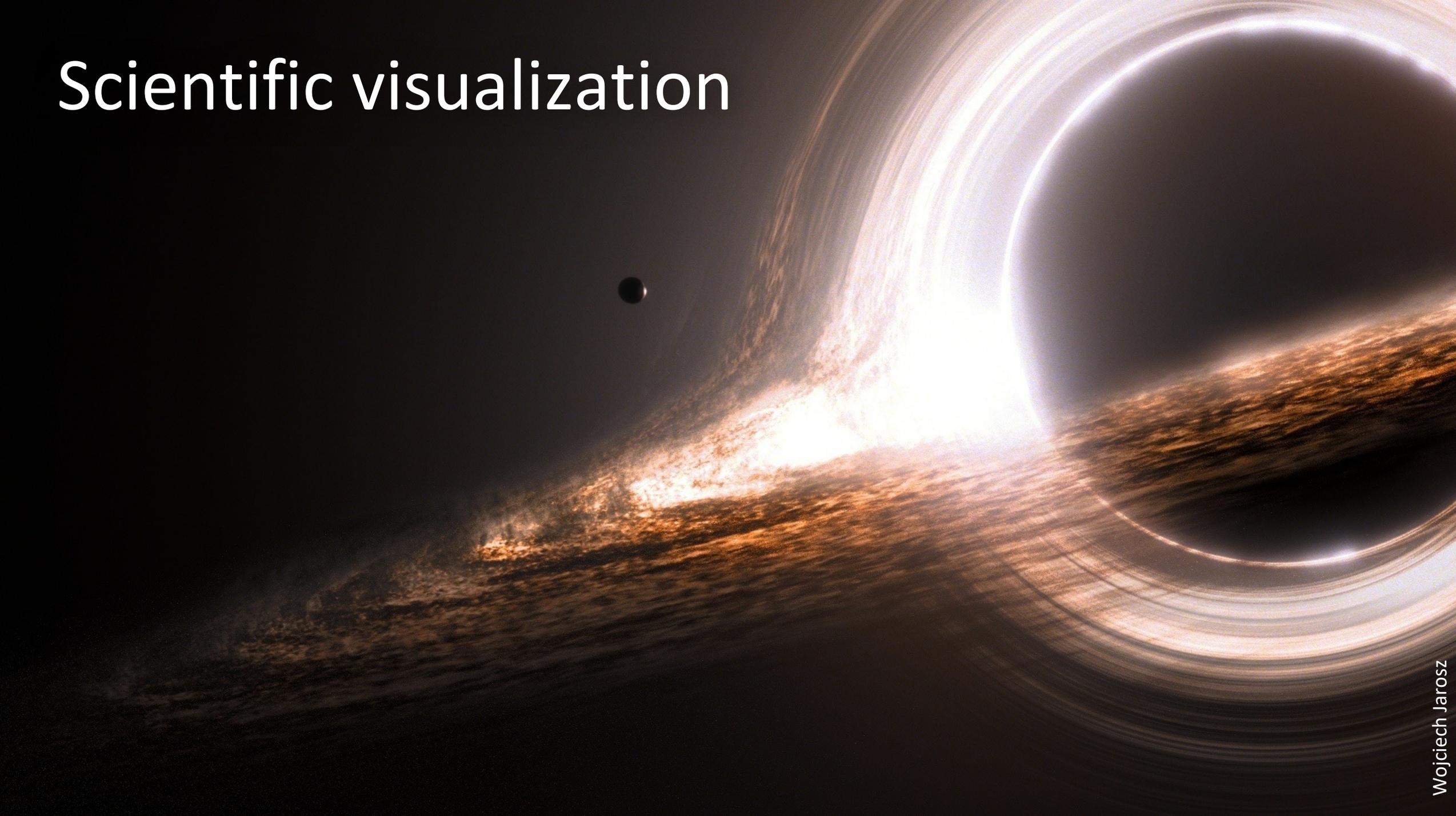
# Cultural heritage



# Digital fabrication

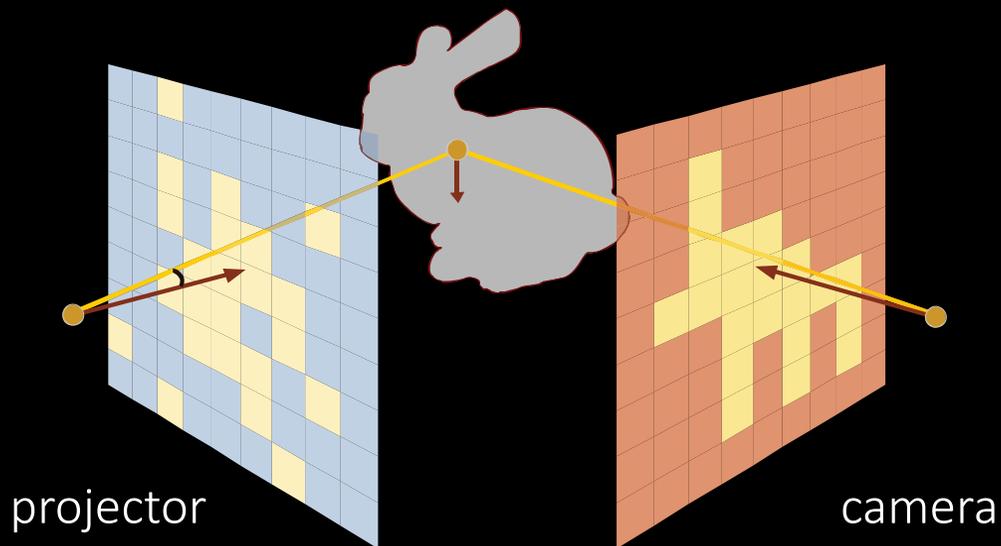


# Scientific visualization



# Scientific imaging

rendering computational light transport

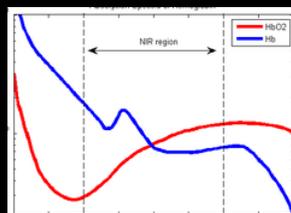
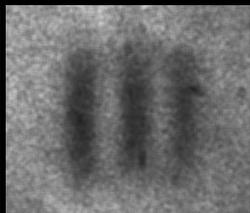
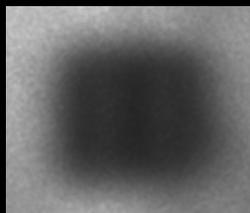
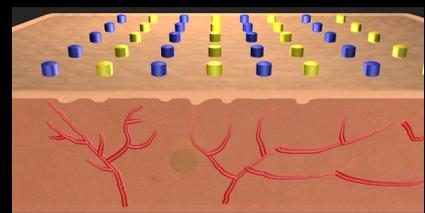


Used by CMU imaging projects:

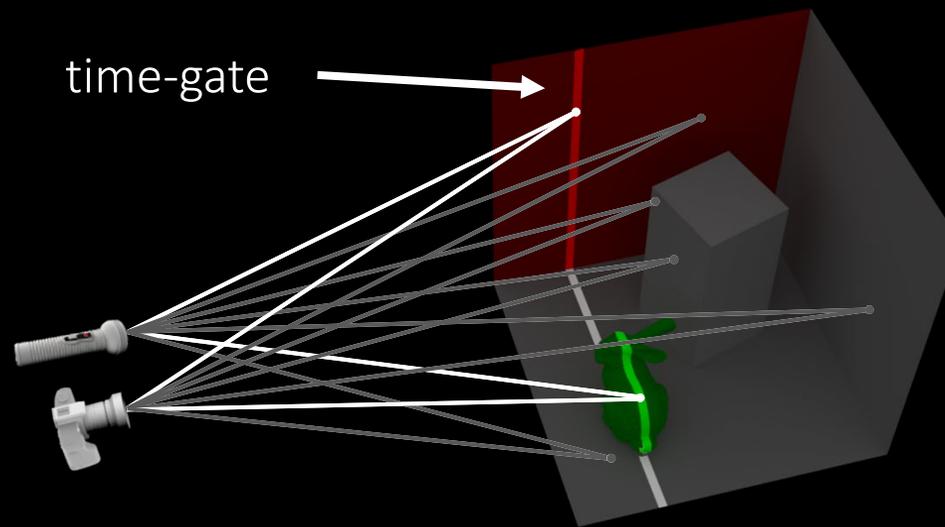
convolutional DOT

coded coherence

coded spectrum



rendering time-of-flight sensors

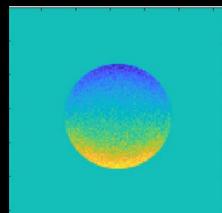
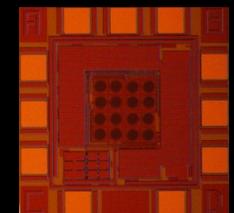
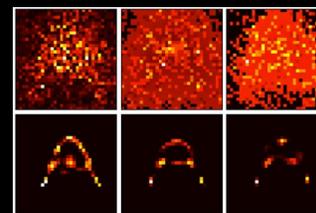
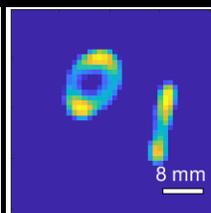
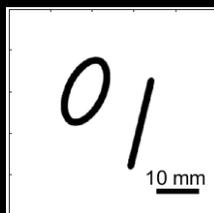


Used by CMU imaging projects:

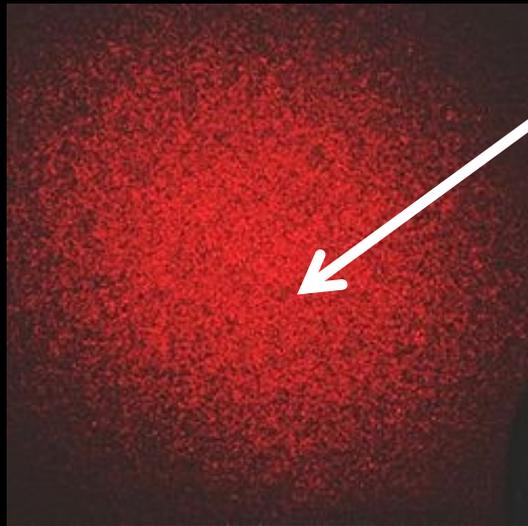
ToF DOT

all-photon imag.

differential SPAD

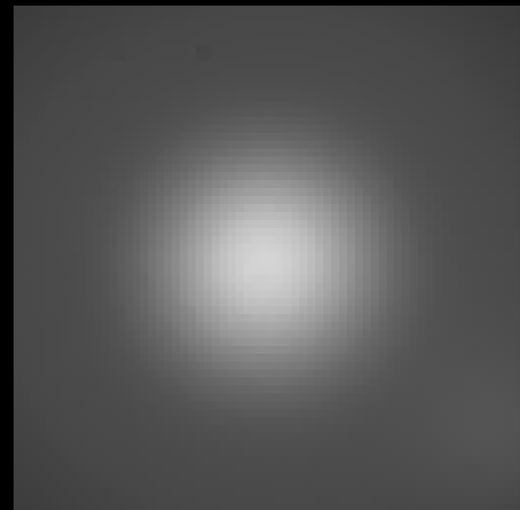


# Rendering wave effects



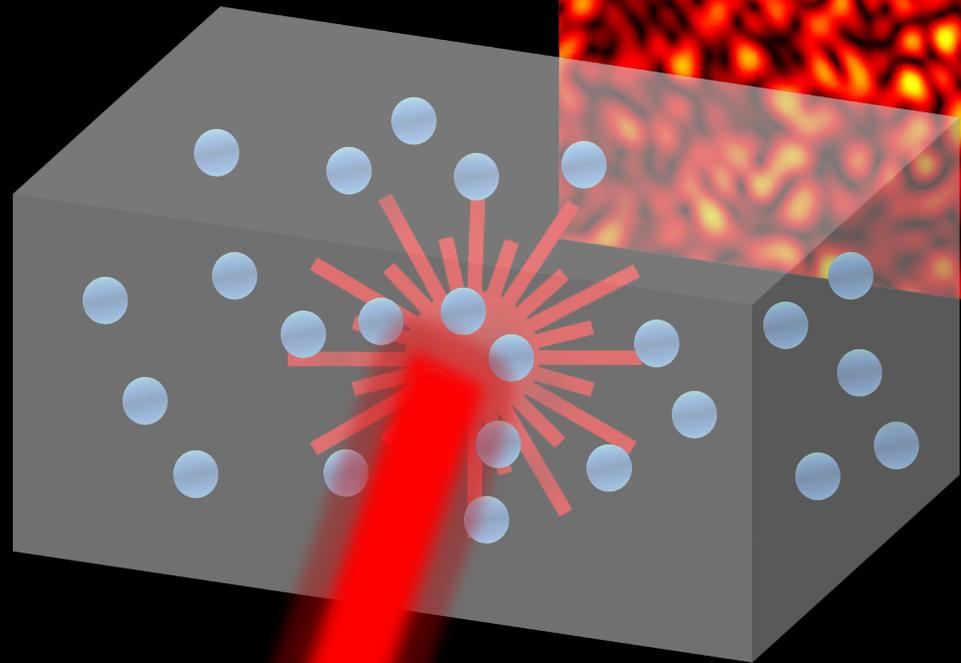
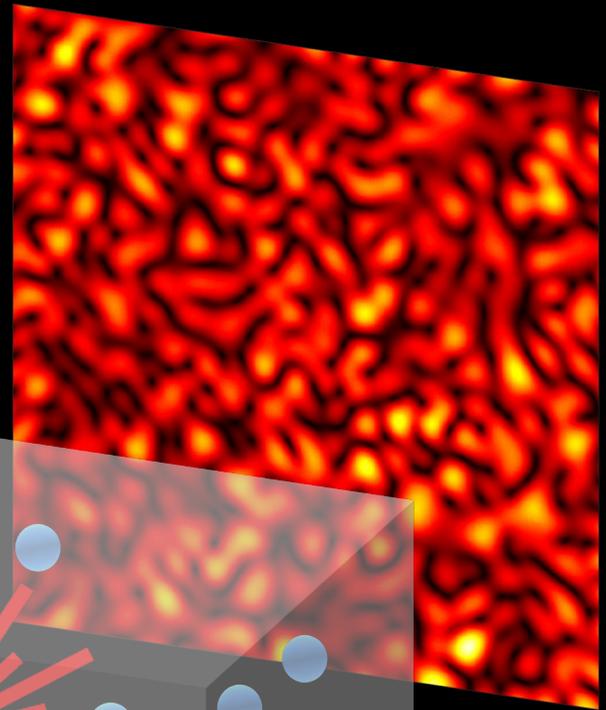
speckle: noise-like pattern

what real laser images look like



what standard rendered images look like

projected speckle image

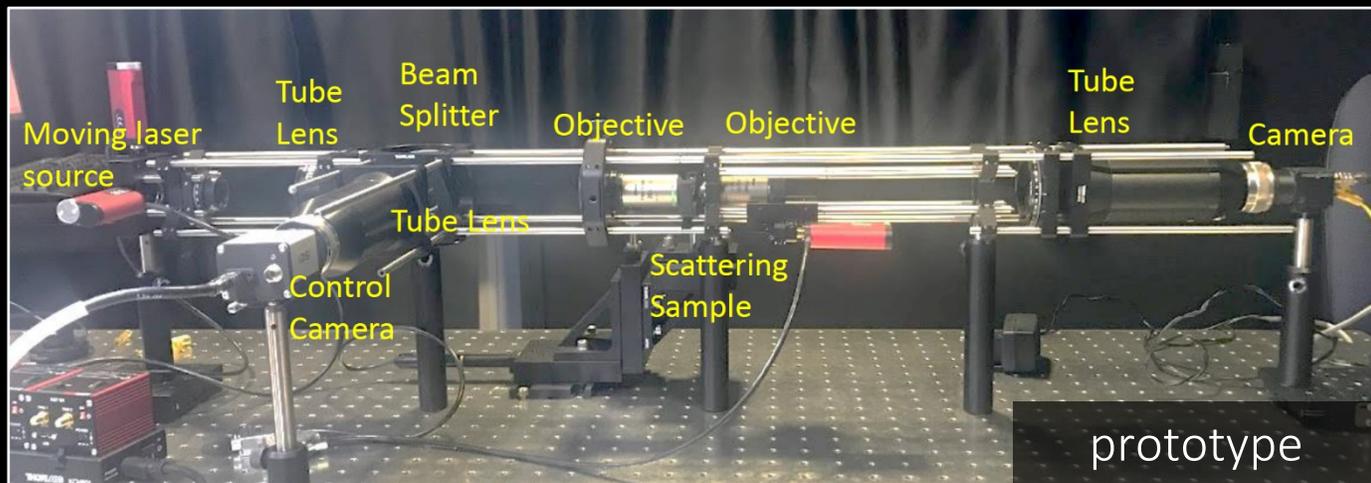
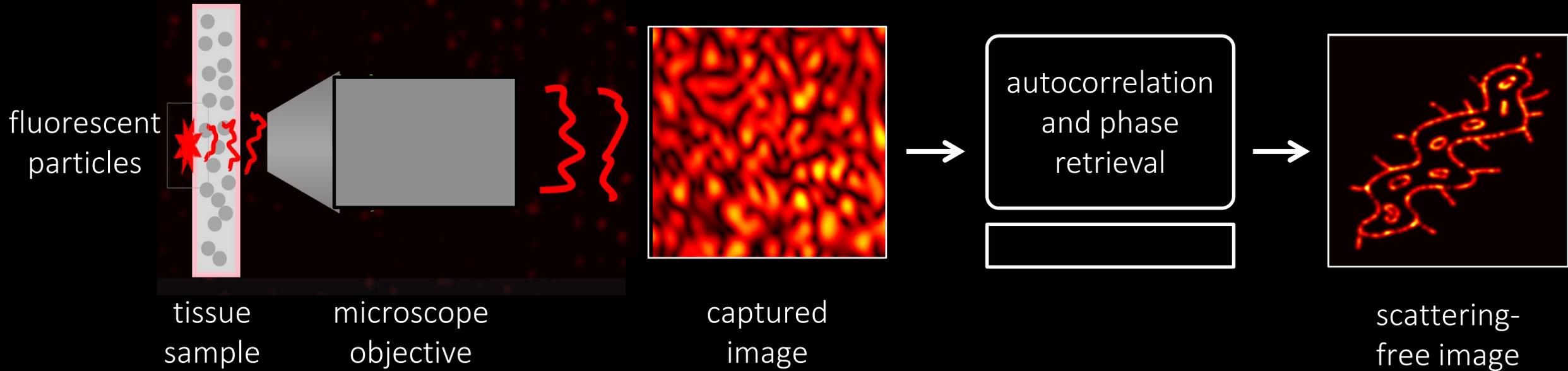


laser beam

scattering volume



# Application: fluorescence Microscopy

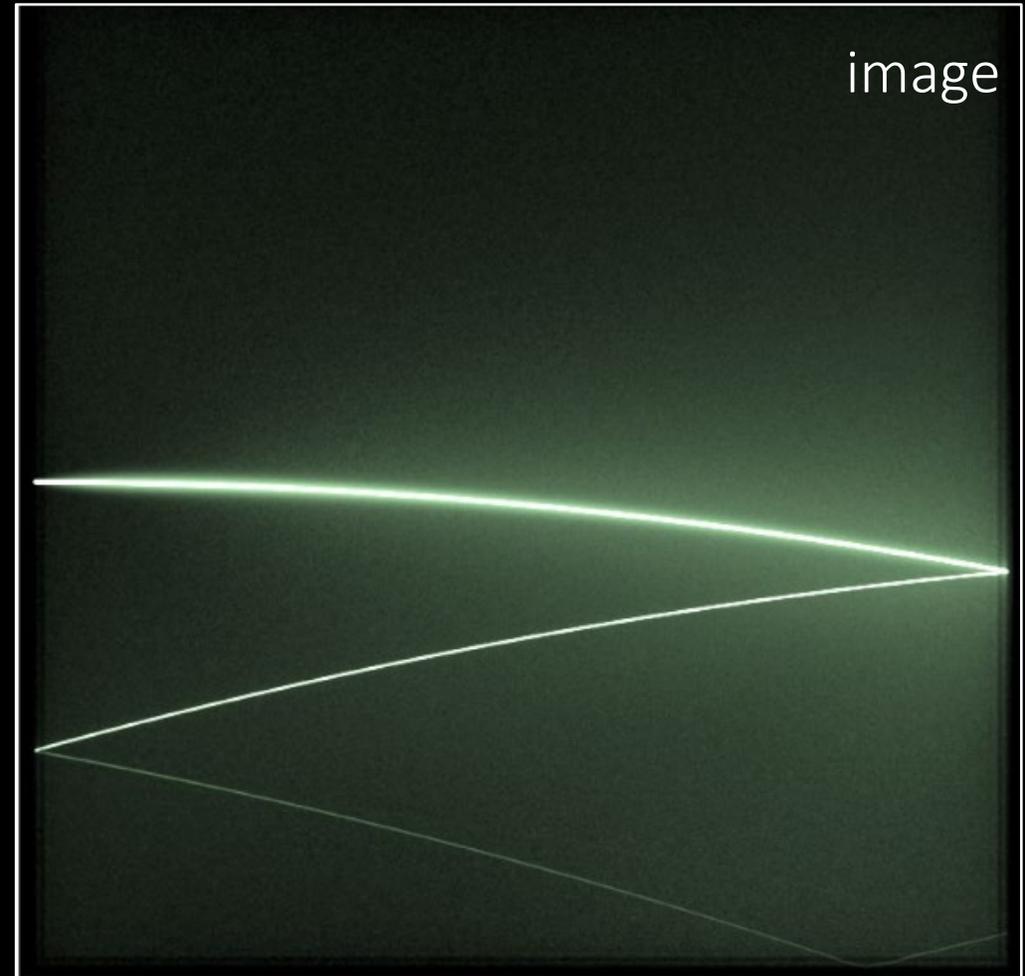
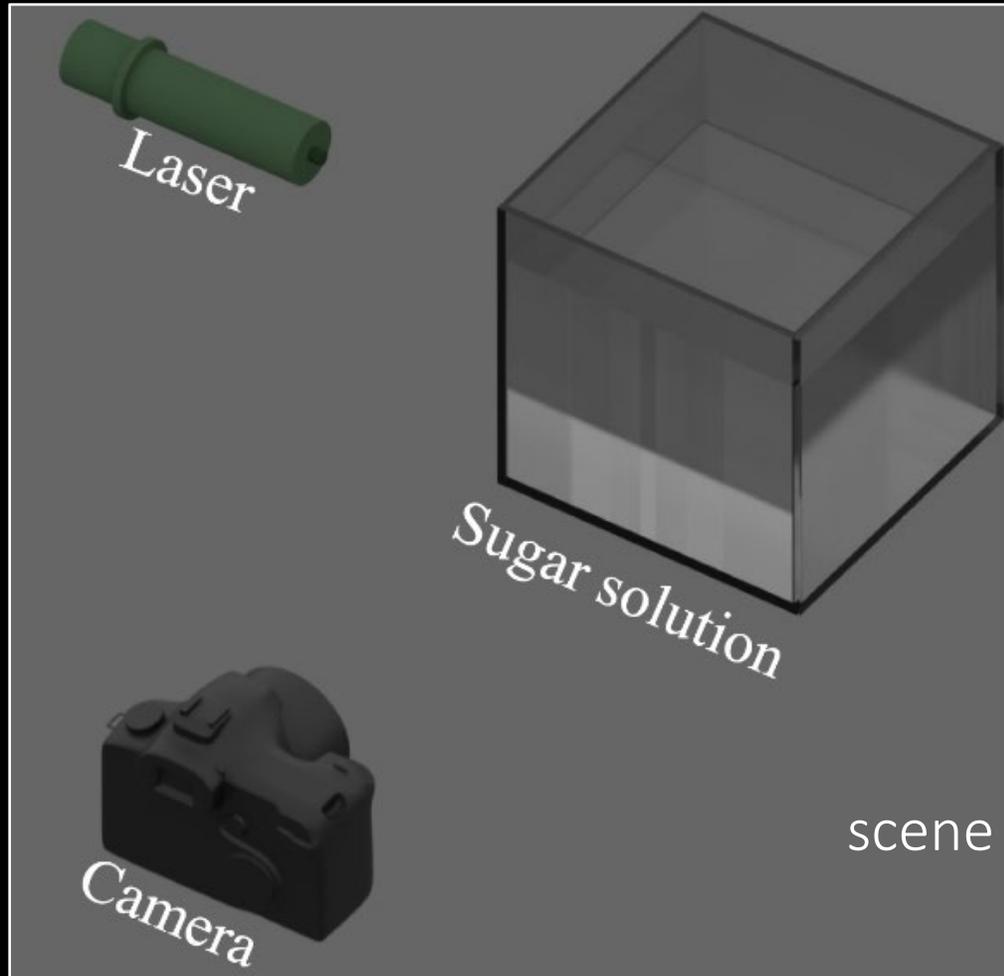


Performance strongly depends on:

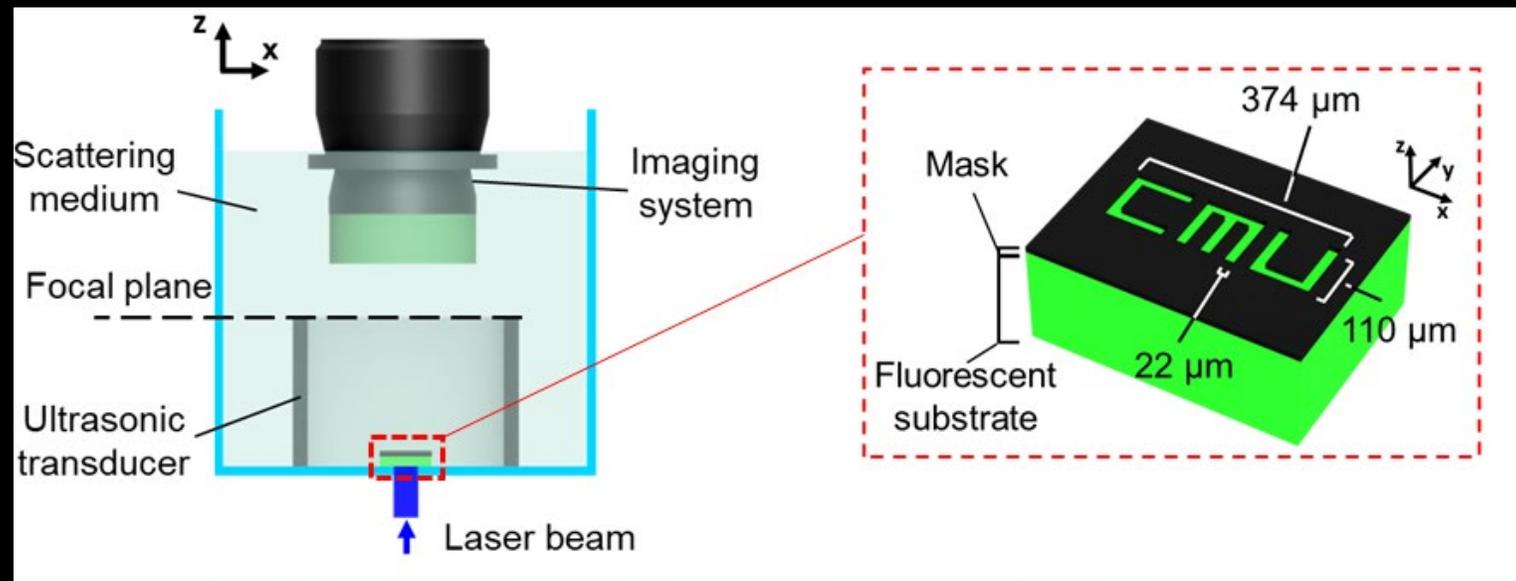
- speckle statistics
- image priors
- tissue parameters

Rendering-assisted exploration and new algorithms!

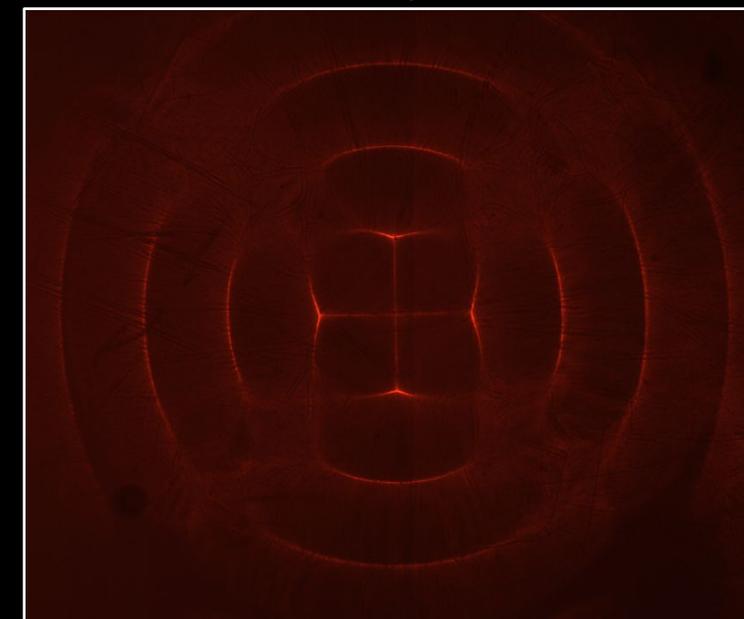
# Rendering eikonal transport



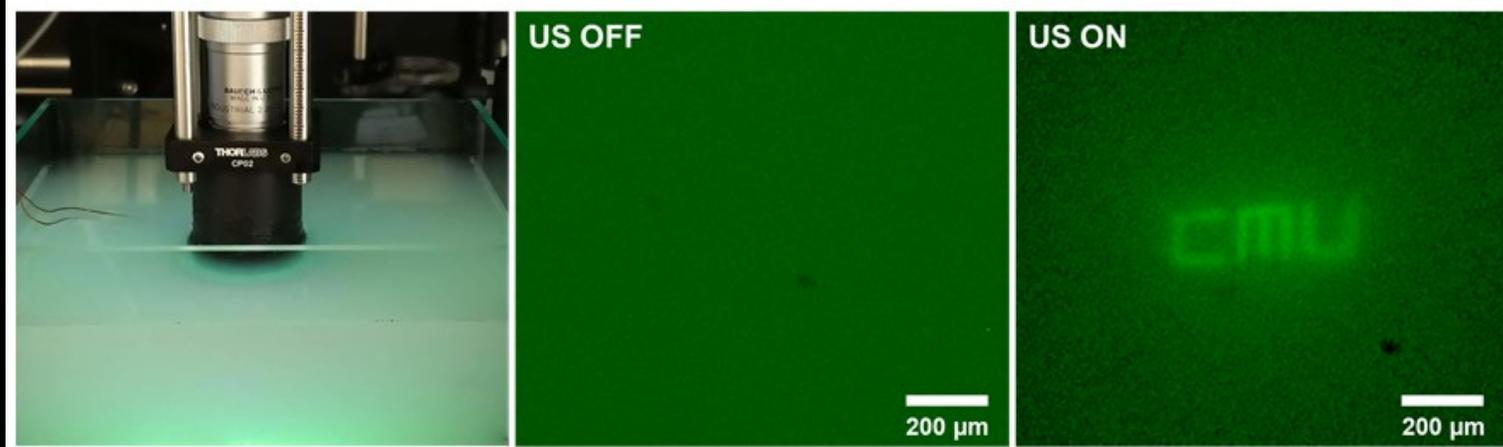
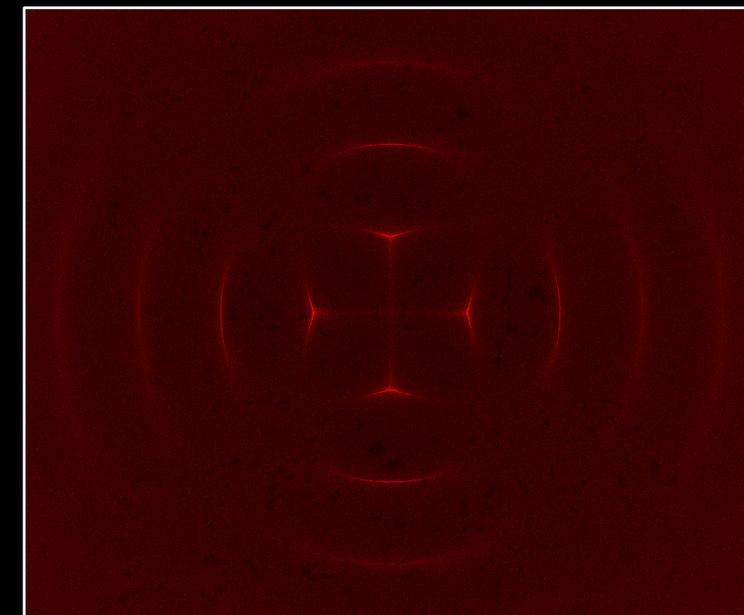
# Application: acousto-optics



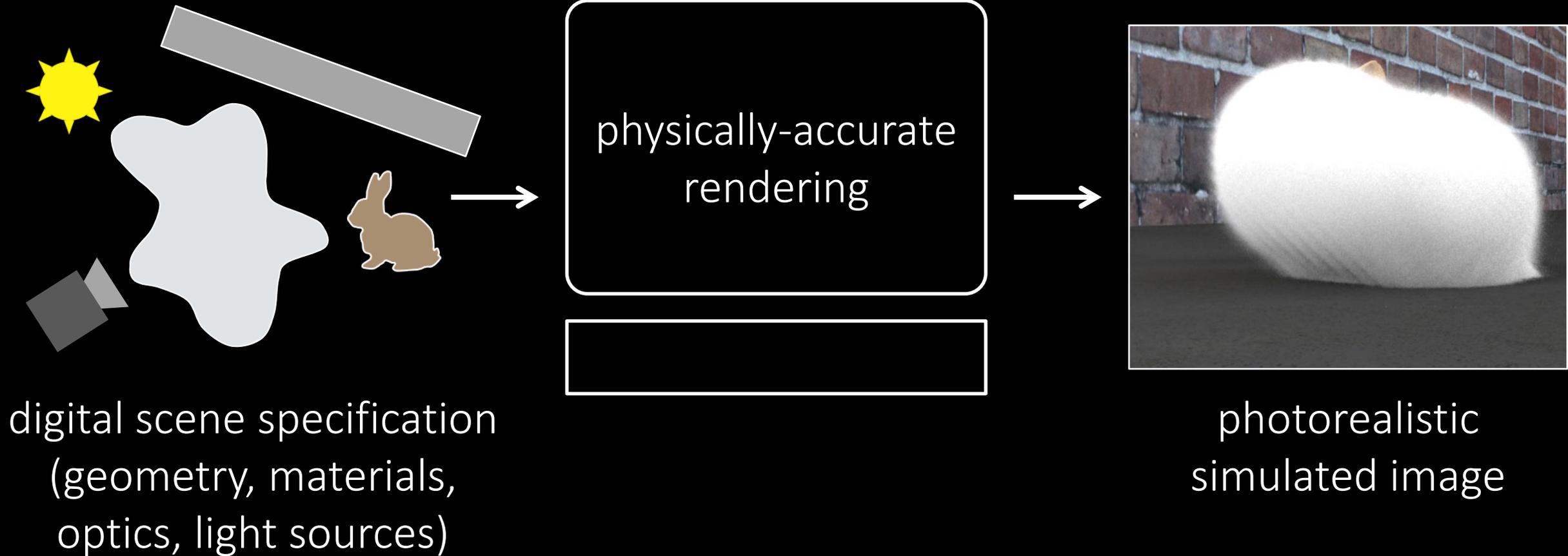
real capture



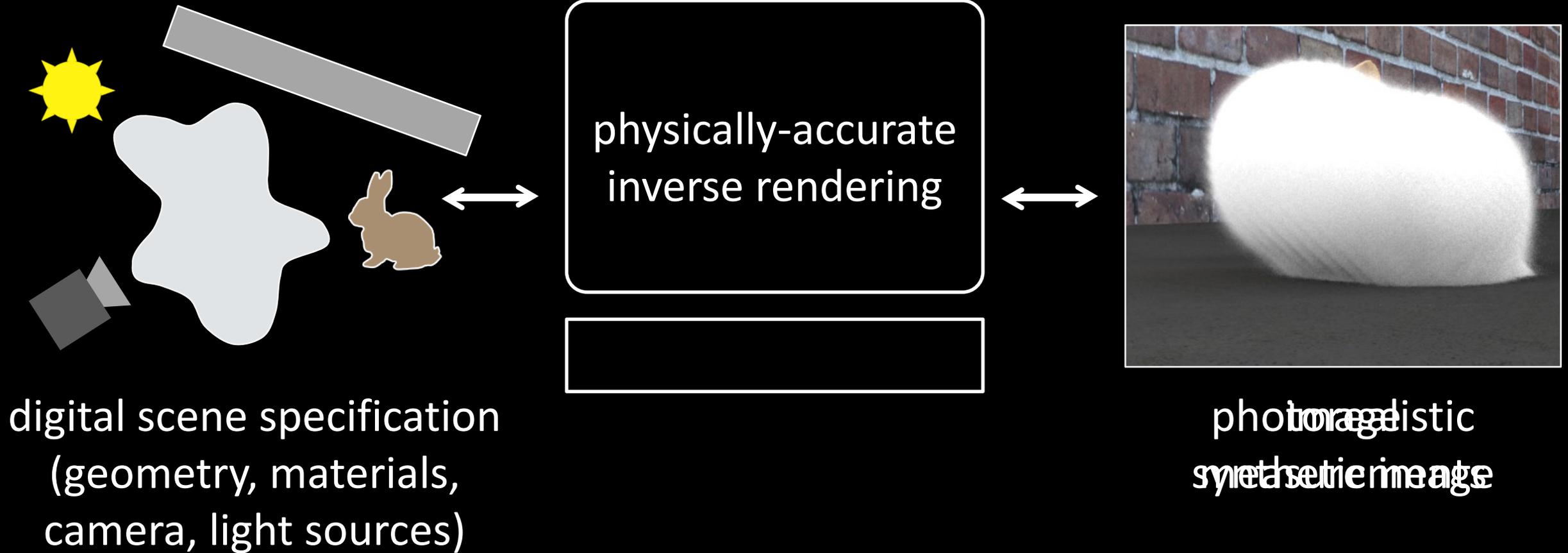
our algorithm



# Forward rendering

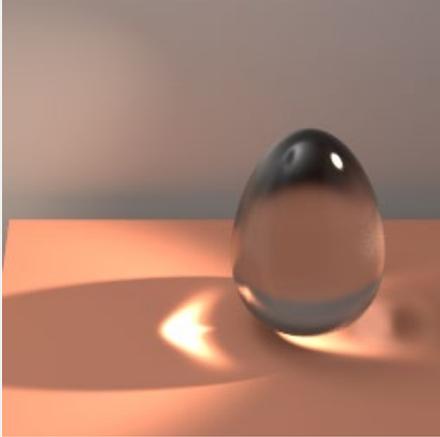


# Inverse rendering

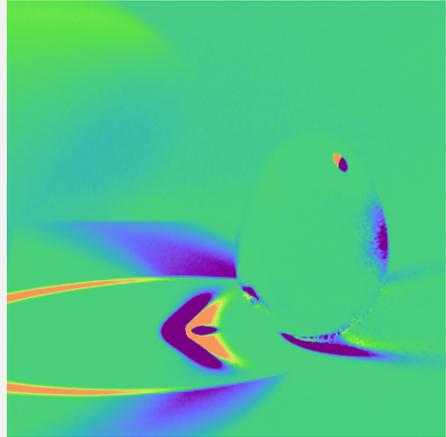


# Differentiable rendering

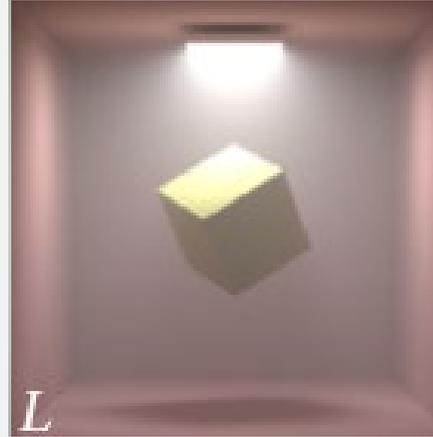
Original image



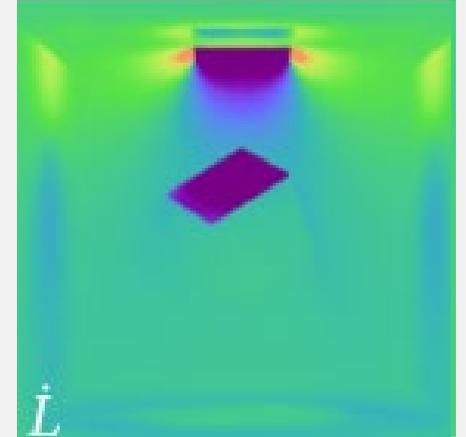
Derivative image



Original image



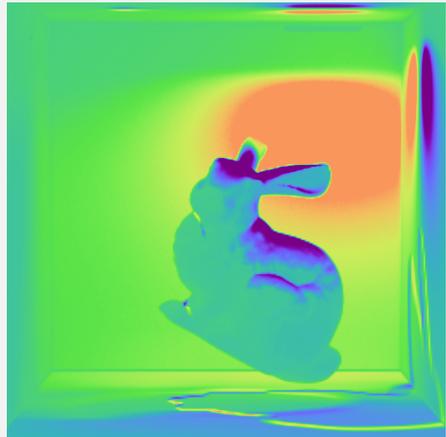
Derivative image



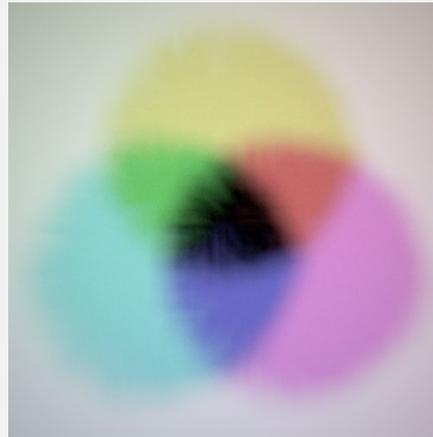
Original image



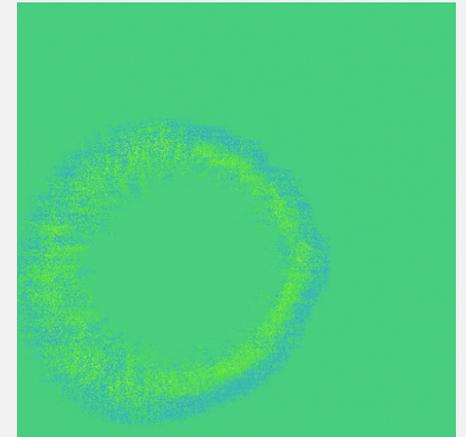
Derivative image



Original image

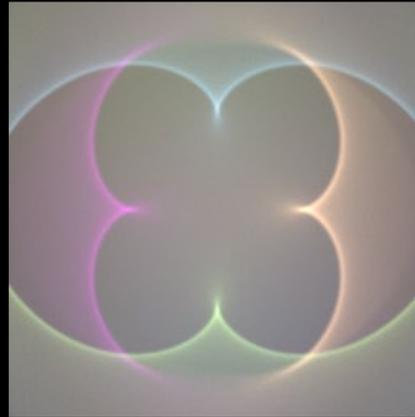


Derivative image

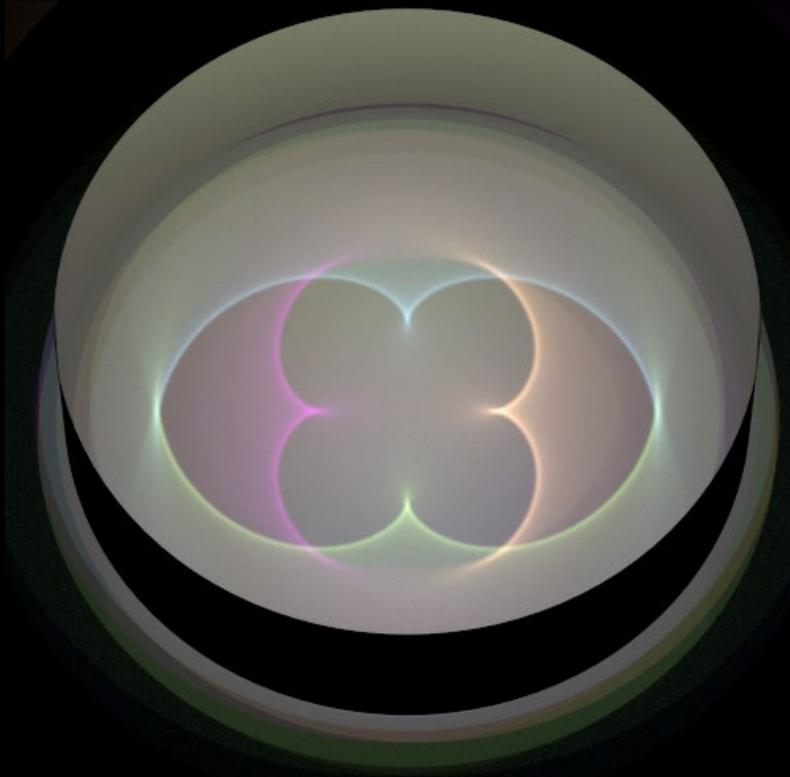
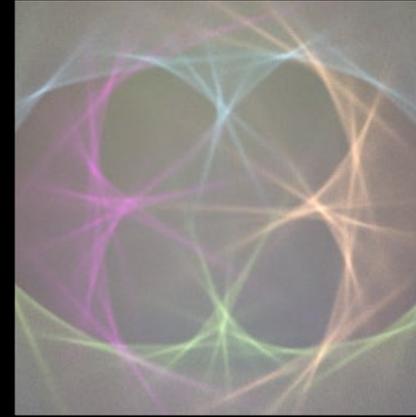


# Application: shape optimization

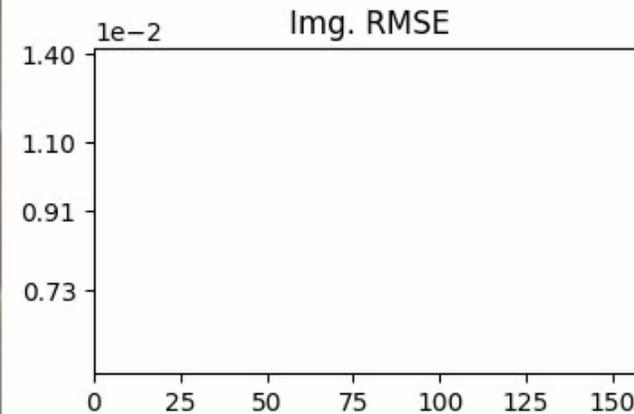
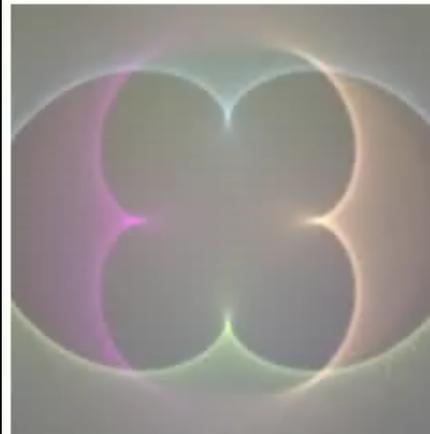
Initial



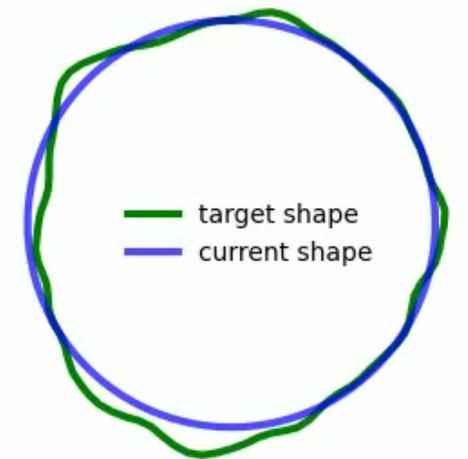
Target image



Iter #0

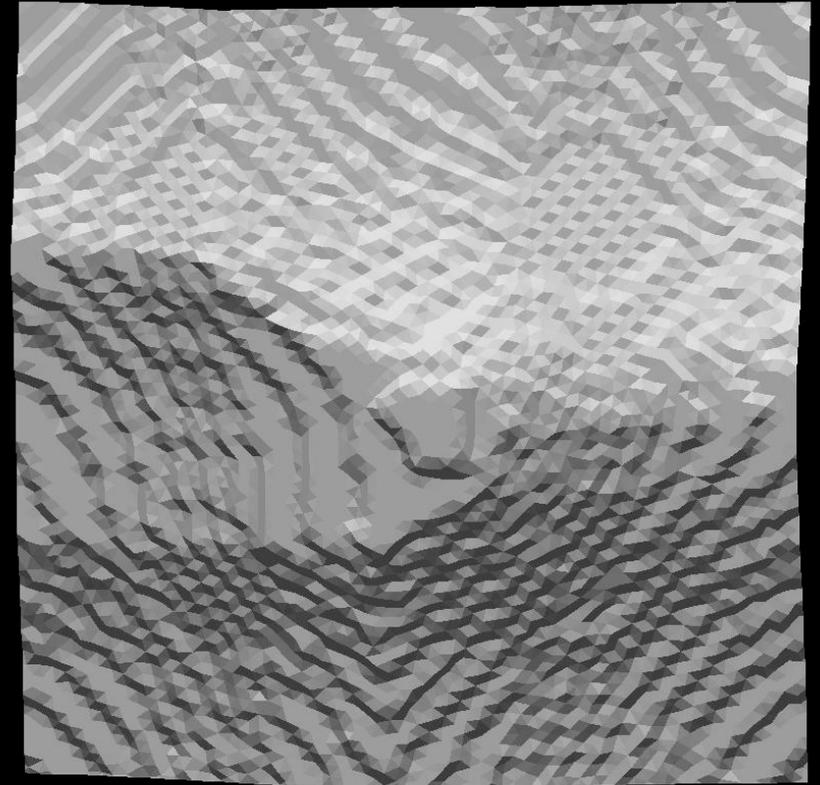
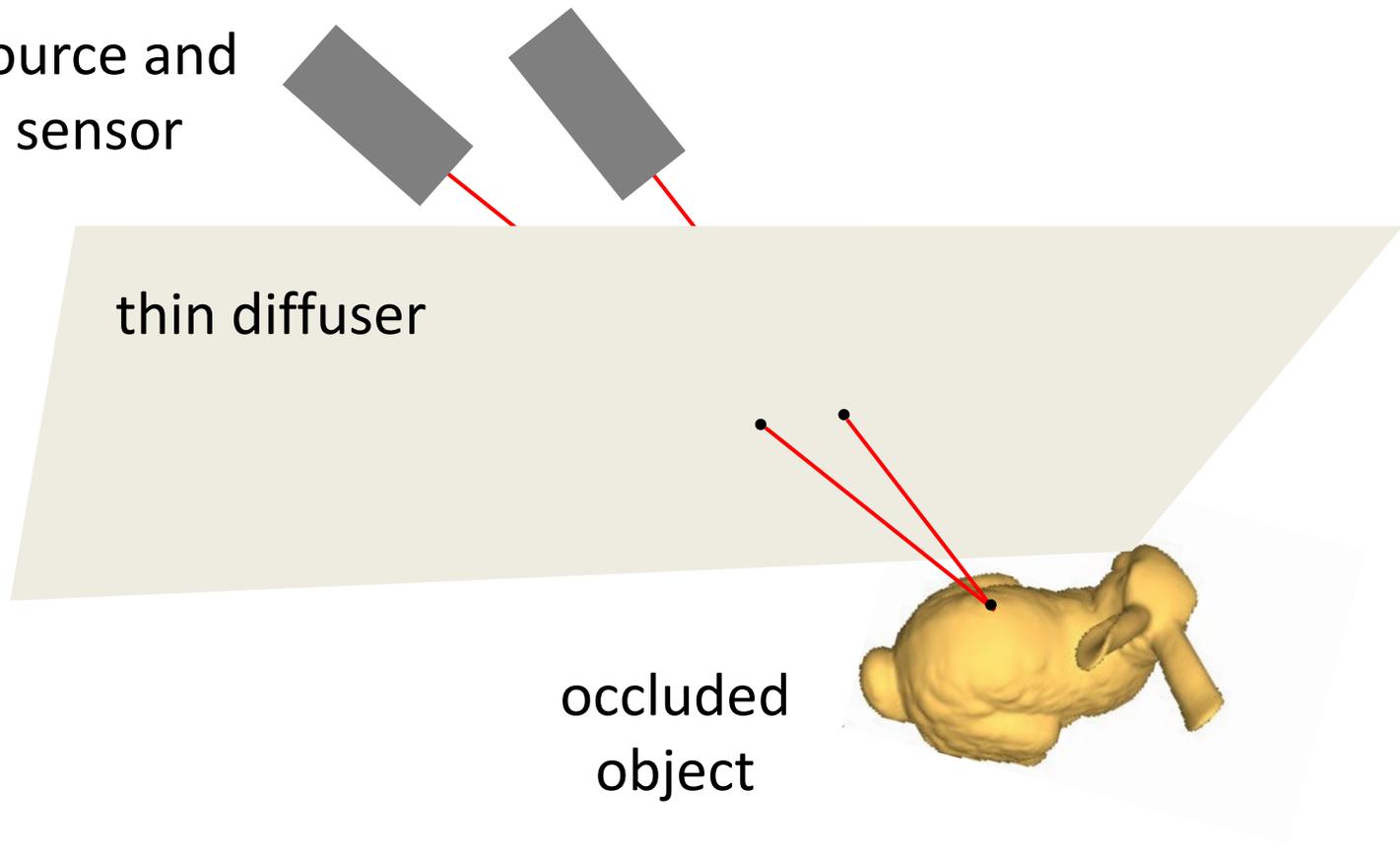


Cross-sectional shape  
(displacement x 20)



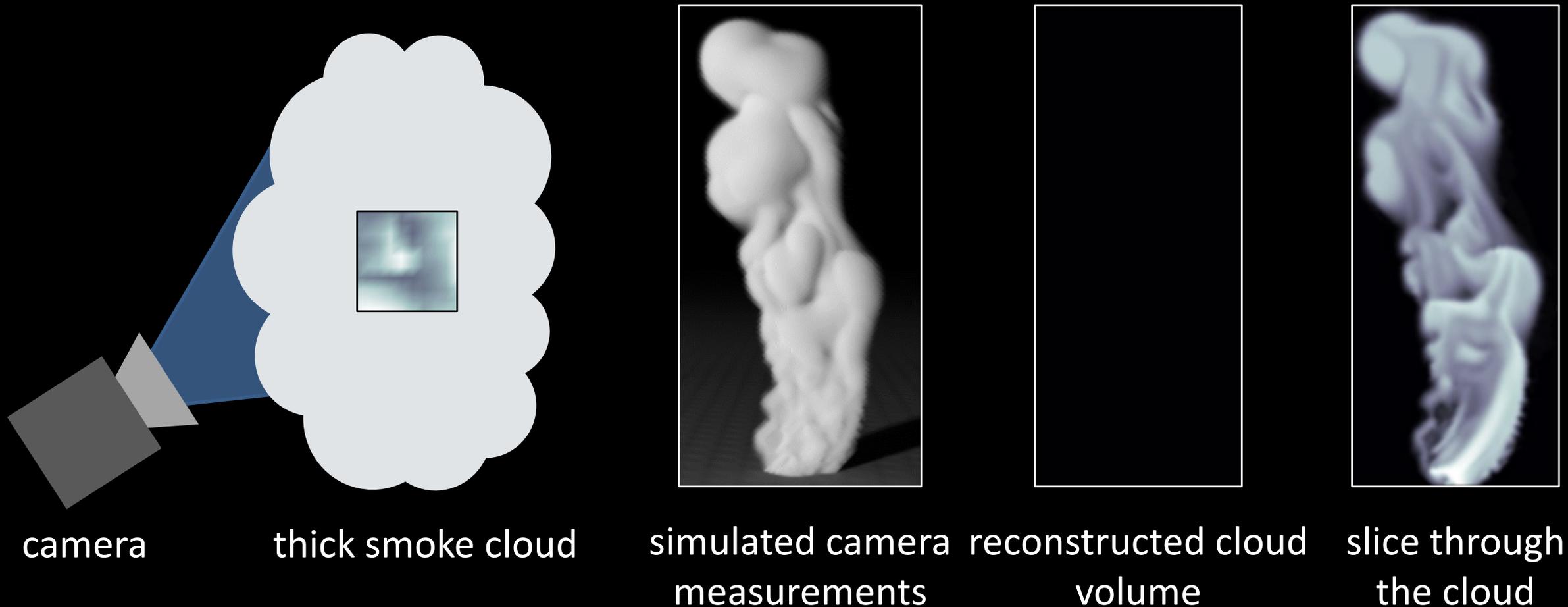
# Application: non-line-of-sight imaging

source and  
sensor

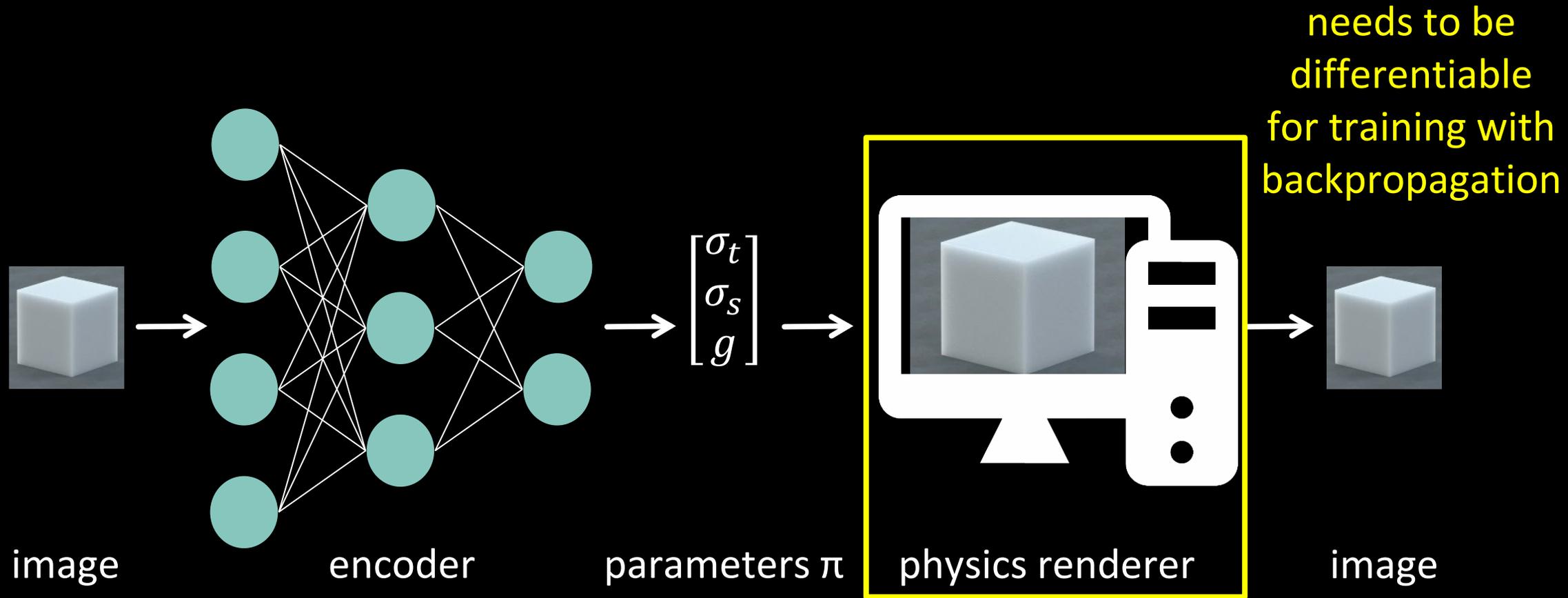


reconstruction evolution

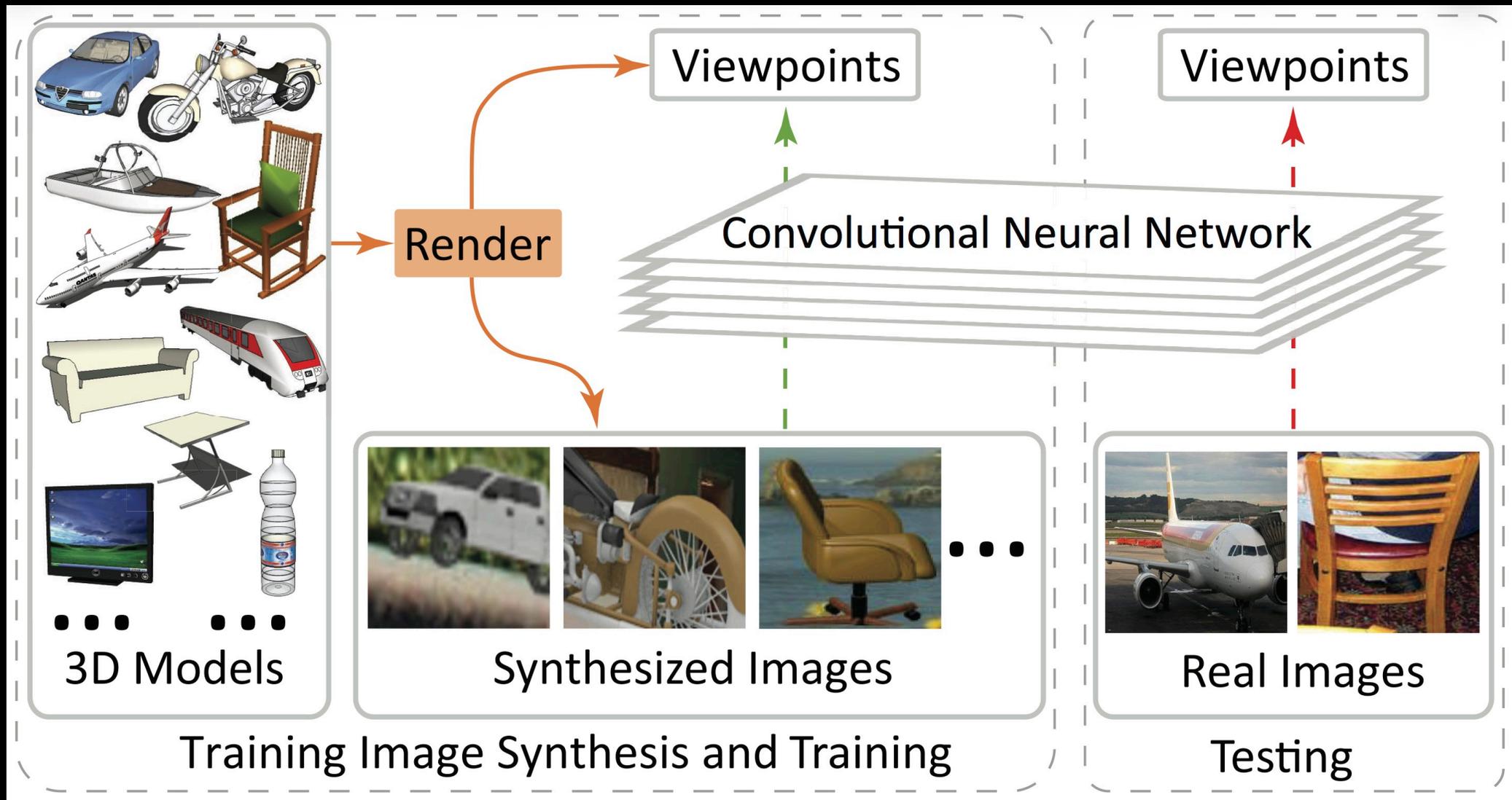
# Application: non-invasive tomography



# Application: vision and machine learning



# Application: vision and machine learning



# Application: neural rendering



# What is this class about?

Producing realistic images by:

- *simulating* light transport (global illumination)
- *simulating* light's interaction with materials (appearance modeling)

Understanding why things look the way they do:

- Why is the sky blue?
- Why is the grass green?
- Why does metal look different than marble?

Course fast-forward and logistics

# Course logistics

- Course website:

<http://graphics.cs.cmu.edu/courses/15-468>

- Piazza for discussion and announcements (sign up!):

<https://piazza.com/class/kklw0l5me2or4>

- Canvas for homework submissions, Zoom links, and recordings:

<https://canvas.cmu.edu/courses/22291>

- Slack server for real-time discussion:

See Piazza for the invite link

# Please take the start-of-semester survey!

- Posted on Piazza as well:

<https://docs.google.com/forms/d/e/1FAIpQLScwNSk9hXN61oeohumgsiclifleHw4ogk9K3ccnPDVKb399cQ/viewform>

# Course fast-forward

Tentative syllabus at:

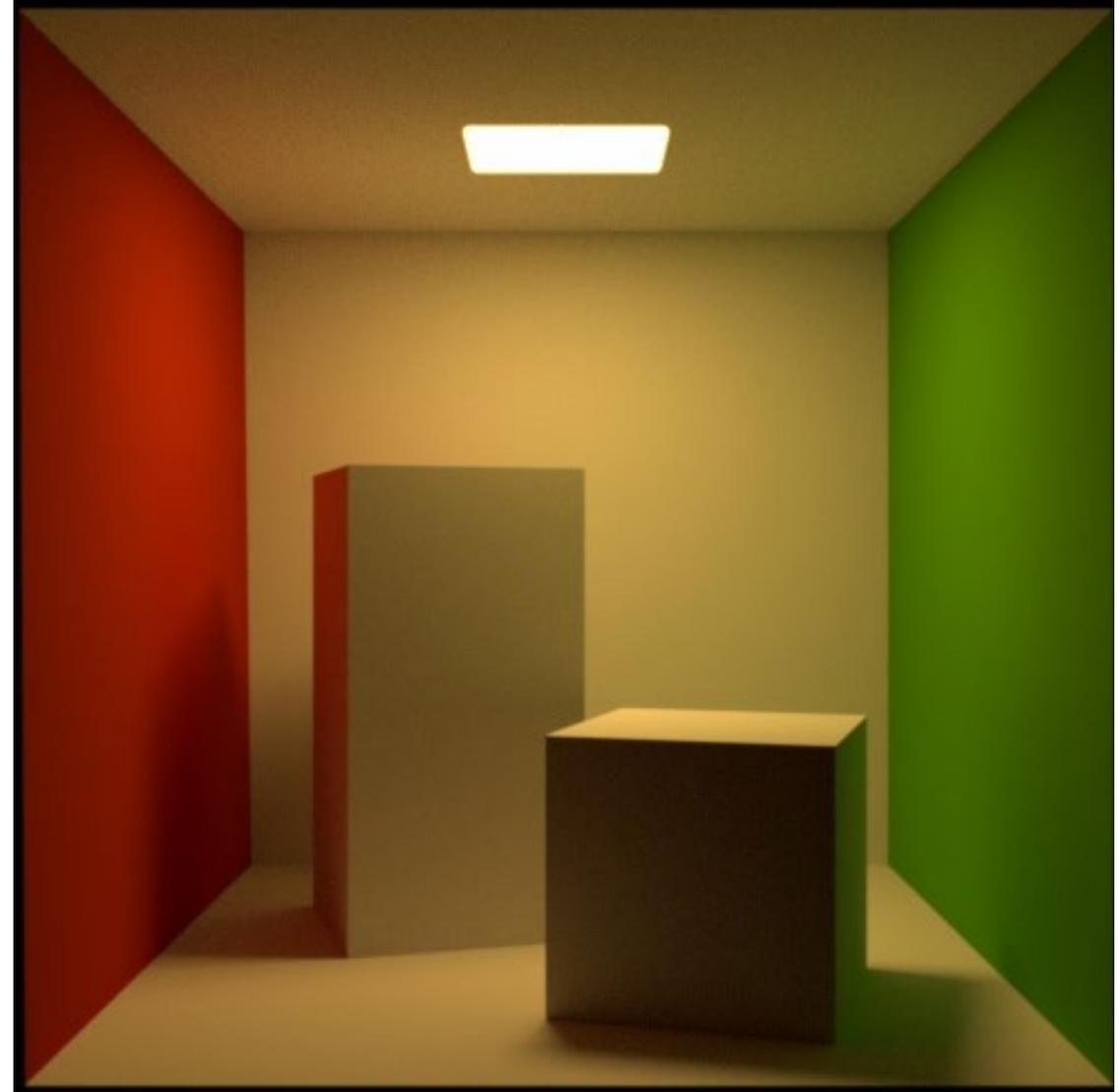
<http://graphics.cs.cmu.edu/courses/15-468>

- schedule and exact topics will most likely change during semester
- keep an eye out on the website for updates

# Topics to be covered

Basics of ray tracing:

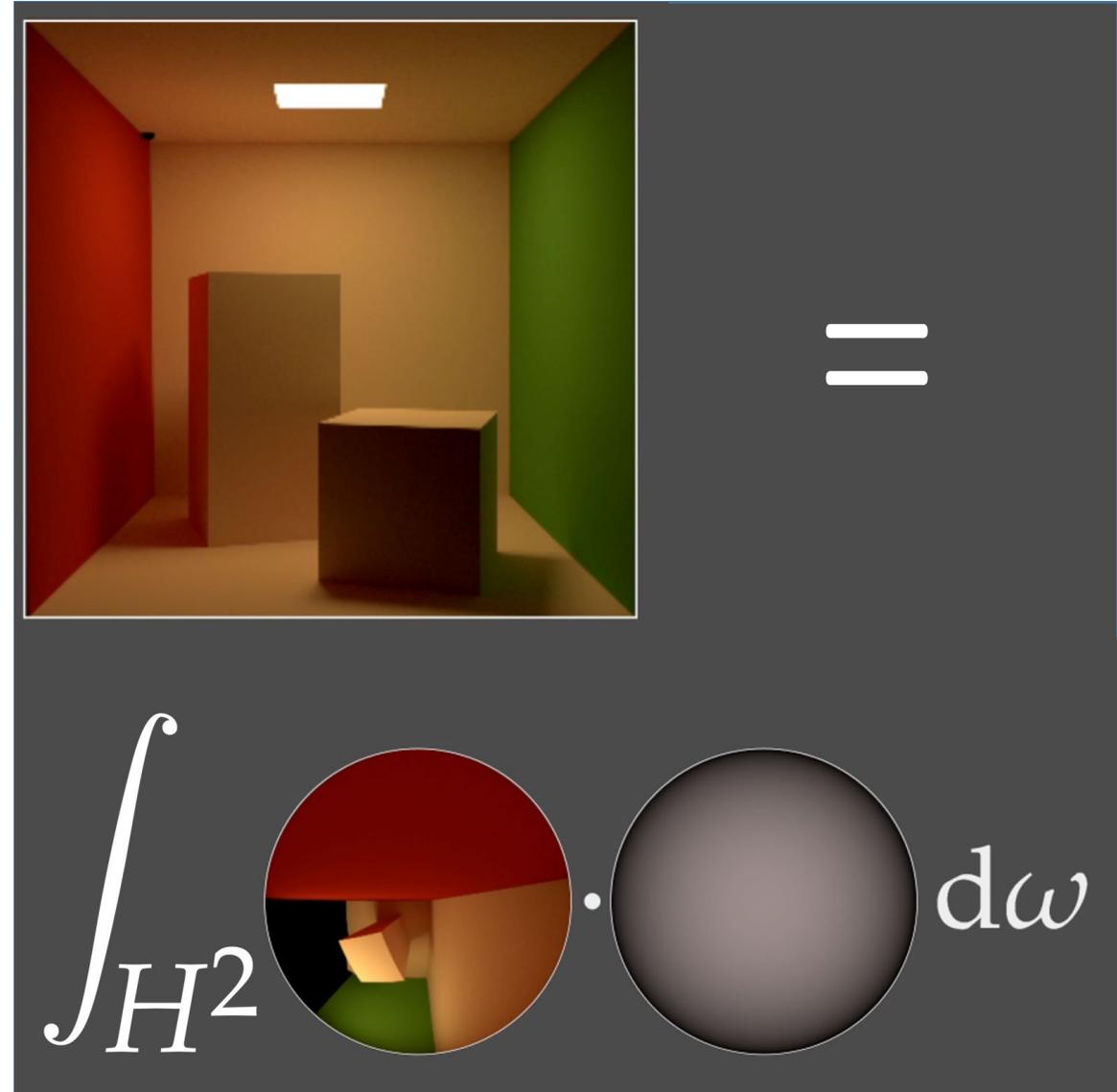
- trace-intersect recursions
- basic camera and illumination models
- shading
- intersection queries
- texture mapping



# Topics to be covered

Theory of light transport and materials:

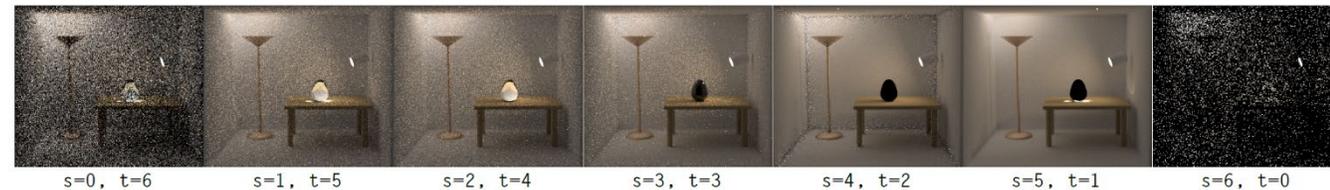
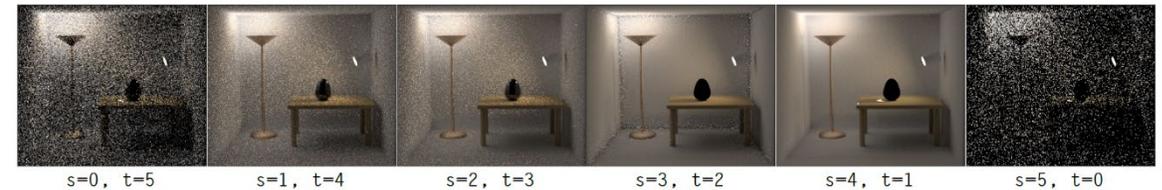
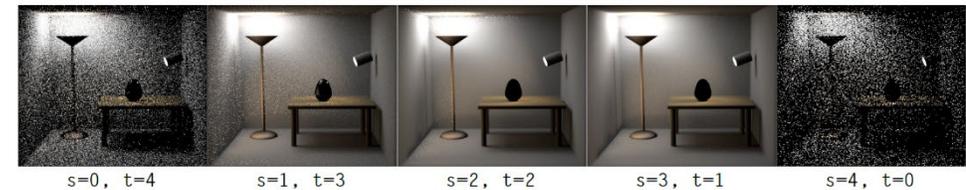
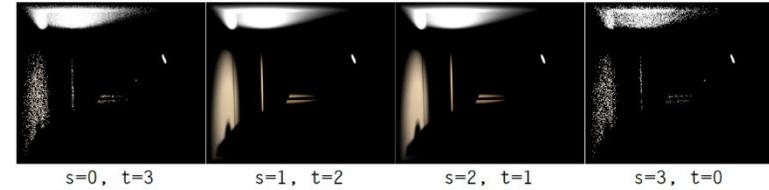
- rendering equation
- radiative transfer equation
- path integral formulations
- microfacet reflectance models
- statistical scattering models



# Topics to be covered

Monte Carlo rendering algorithms:

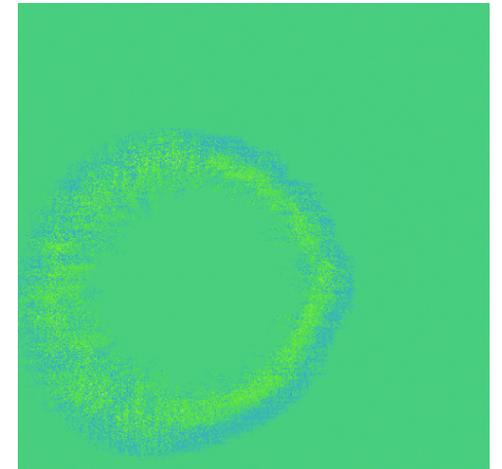
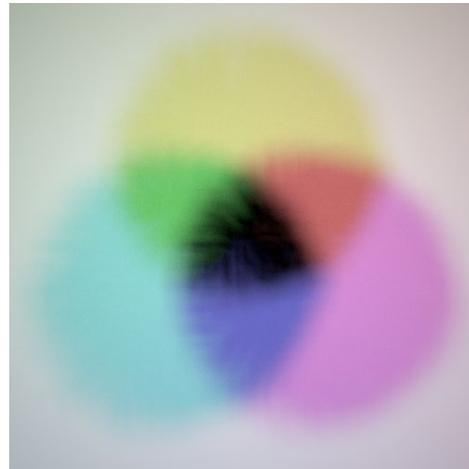
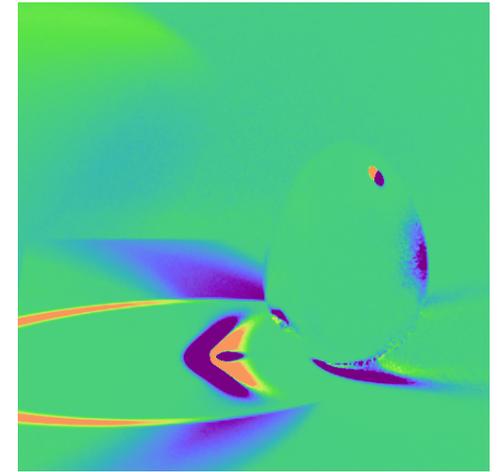
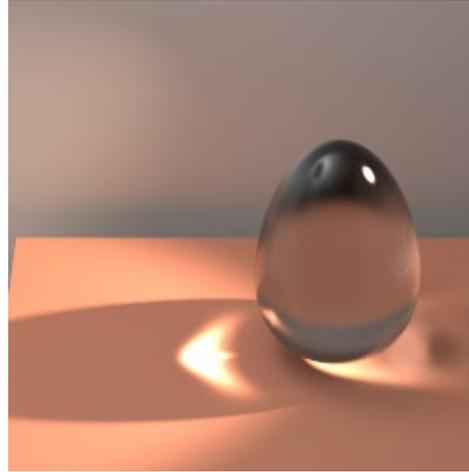
- unidirectional and bidirectional estimators
- Markov chain Monte Carlo techniques
- volumetric rendering
- importance sampling techniques
- quasi-Monte Carlo techniques



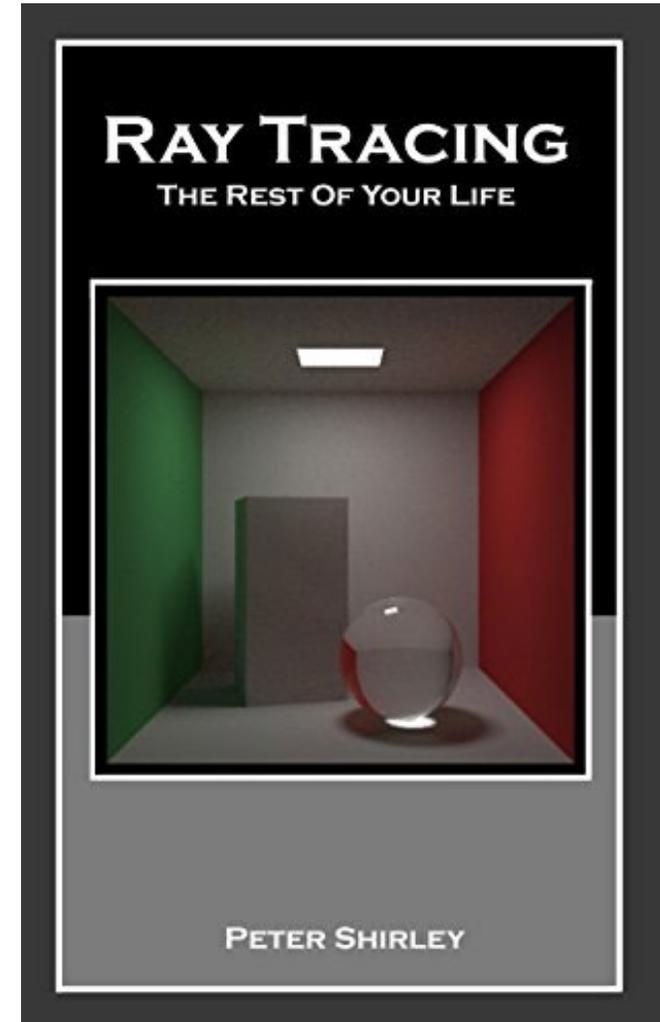
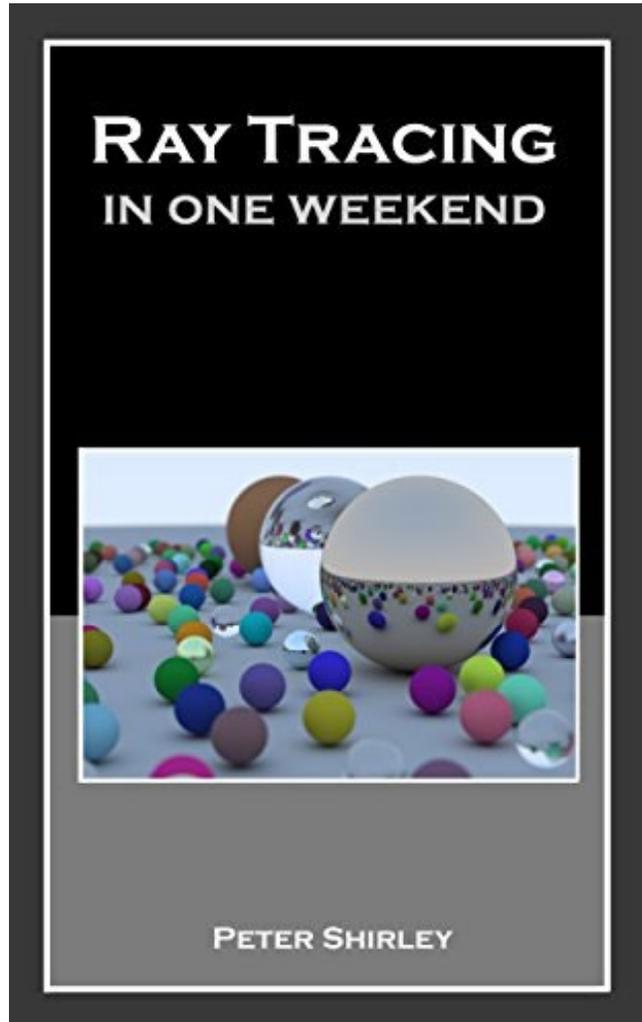
# Topics to be covered

Advanced topics:

- differentiable and neural rendering
- neural rendering
- rendering wave-optics effects
- rendering specular transport effects
- rendering eikonal transport effects



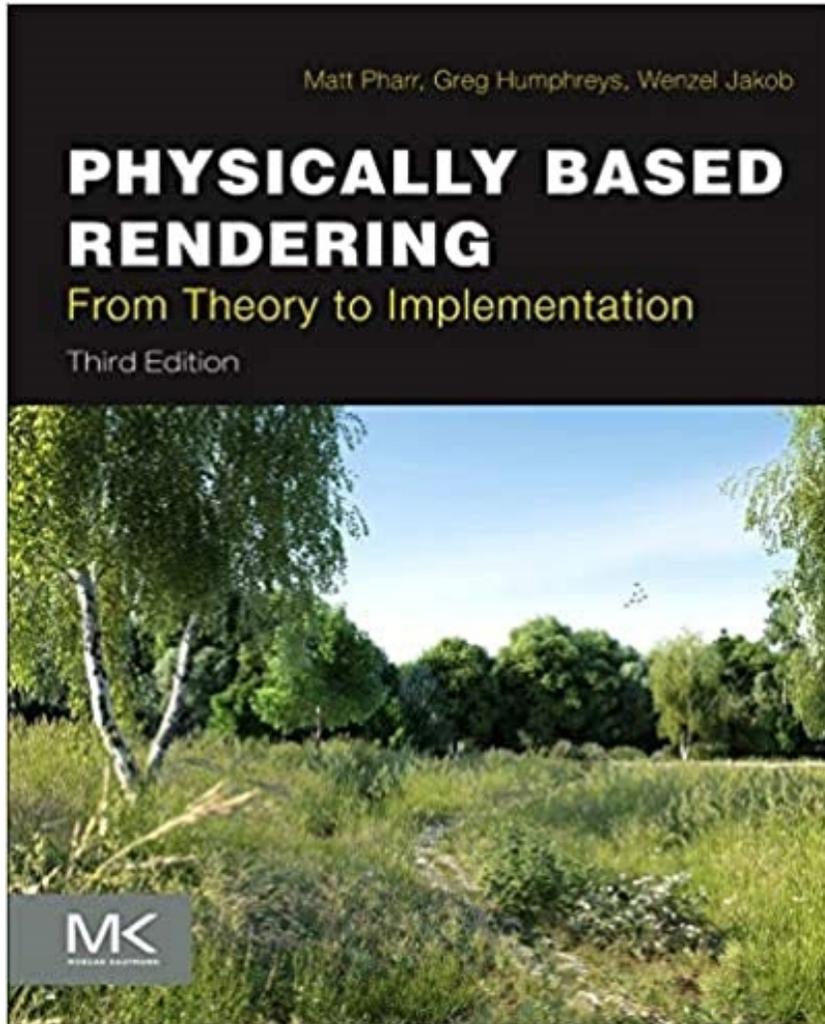
# Books



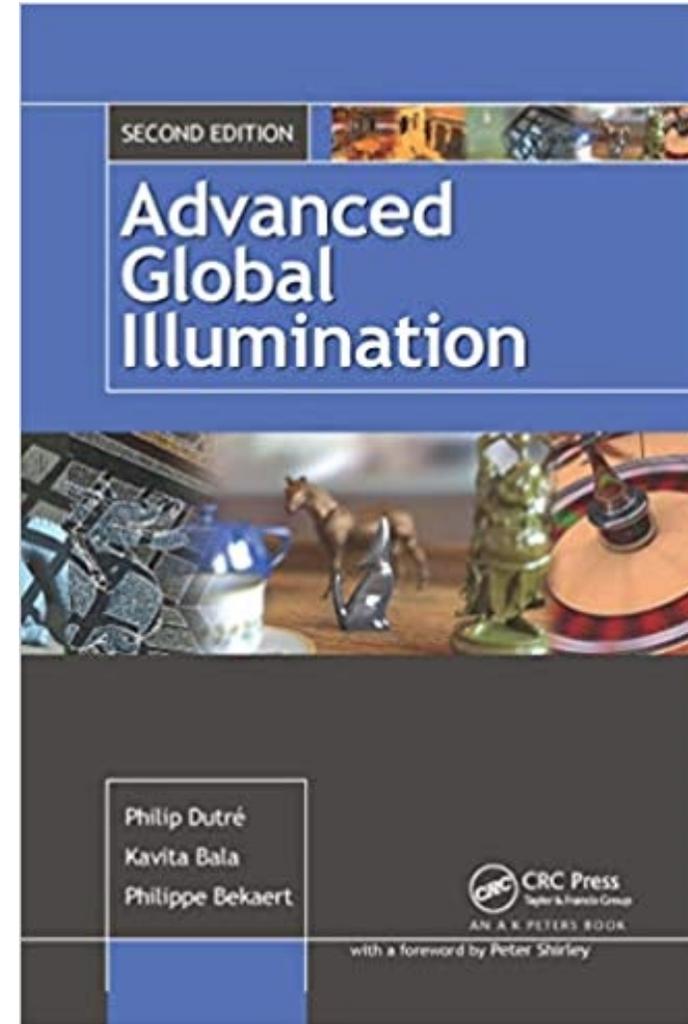
Peter Shirley's "Ray Tracing" series.

- Great reference material for first and second half programming assignments.

# Books



“PBR(T)”, great reference for later programming assignments.



“AGI”, great reference for theoretical aspects of the course.

# Evaluation

- Four (plus one) programming assignments (50%):
  - implement progressively more advanced features within an existing barebones rendering framework.
  - all programming will be in **C++**.
  - 0-th assignment will serve as a gentle introduction to our simplified version of [Nori educational renderer](#).
  - six late days, no more than three per assignment, 10% penalty per additional late day.
- Final project and rendering competition (25%):
  - implement rendering features of your choice and produce compelling imagery.
  - compete for **two free SIGGRAPH registrations (technical award and artistic award)!**
  - we will provide more information near the end of February.
  - 15-668, 15-868 require more substantive project.
  - **no exam, but final project presentations are during the exam period.**
- Ten take-home quizzes (20%):
  - solve 2-3 simple math problems related to each week's lectures.
  - **no late days, we will do solutions in class.**
  - you can skip three out of ten quizzes without penalty.
- Class, Piazza, and Slack participation (5%):
  - be around for lectures and office hours (lenient this semester).
  - participate in Piazza and Slack discussions.
  - ask questions and answer other people's questions.

Submission deadlines will be enforced strictly!

# Rendering competition

Look at rendering competitions for similar courses at other universities for inspiration!

- Dartmouth ([2019](#), [2017](#), [2016](#))
- EPFL ([2019](#), [2018](#), [2017](#))
- ETH Zurich ([2017](#), [2016](#), [Fall 2015](#), [Spring 2015](#), [2014](#), [2013](#), [2012](#))
- UC San Diego ([2011](#), [2010](#), [2008](#), [2007](#), [2006](#), [2005](#), [2004](#), [2003](#))
- [Stanford](#).

# Contact information, office hours, and discussion

- Feel free to email us about administrative questions.
  - please use [15468] in email title!
- Technical questions should be asked on Piazza or Slack.
  - we won't answer technical questions through email.
  - you can post anonymously if you prefer.
- Office hours will be determined by poll.
  - office hours will be through Zoom.
  - feel free to email Yannis about additional office hours.
  - ~~○ you can also just drop by Yannis' office (Smith Hall (EDSH) Rm 225).~~
  - you can also post on Piazza or DM on Slack for additional office hours.
  - office hours for this week will be announced on Piazza.
- Post-lecture Q&A for 30 minutes.
- We will explore options for study groups and reading groups during the semester.

# Prerequisites

At least one of the following:

- A computer vision course at the level of 16-385 or 16-720.
- A computer graphics course at the level of 15-420.

# Pop quiz

How many of you know or have heard of the following terms:

- Gaussian and box filtering.
- Convolution and Fourier transform.
- Aliasing and anti-aliasing.
- Homogeneous coordinates.
- Affine transforms and homographies.
- Pinhole, perspective, and orthographic camera.
- Triangular mesh.
- Ray-mesh intersections.
- Texture mapping.
- Radiometry and radiometry.
- Lambertian, diffuse, and specular BRDFs.
- $n \cdot l$  lighting.
- Environment map.
- Point and directional light sources.
- Ray tracing.
- Monte Carlo estimation.
- Refraction and diffraction.

# This course is still highly experimental!

- First time this course is offered, so expect things to inevitably change throughout the semester.

# Interested in research?

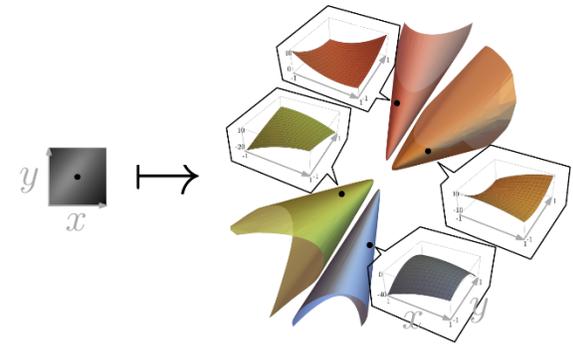
- Visit the graphics lab and imaging group websites:

<http://graphics.cs.cmu.edu/>

<https://imaging.cs.cmu.edu/>

- Email Yannis if you want to be added to the graphics lab mailing list and attend our weekly meetings (**Tuesdays, 1 – 2 pm ET**).
- We are actively recruiting research assistants for projects relating to **rendering**, imaging, and graphics in general. Please email Yannis if interested.

# Today's talk



- Speaker: **Kathryn Heal** (Harvard, Google X)
- Title: **A Lighting-Invariant Approach to Shape from Shading**
- Abstract: Under the conventional diffuse shading model with unknown directional lighting, the set of quadratic surface shapes that are consistent with the spatial derivatives of intensity at a single image point is a 2D algebraic variety embedded in the 5D space of quadratic shapes. We study the geometry of such varieties, and use those insights to prove existence and uniqueness results in the areas of two-shot uncalibrated photometric stereo and co-quadratic shape from shading. Our theory leads naturally to a concise, feedforward model that computes an explicit, differentiable approximation of the variety from the intensity and its derivatives at any single image point. The result is a parallelizable processor that operates at each image point, and produces a lighting-invariant descriptor of the continuous set of compatible surface shapes at that point.
- TL;DR: **How can we combine algebraic geometry, physics, and neural networks to solve shape from shading.**

# Please take the start-of-semester survey!

- Posted on Piazza as well:

<https://docs.google.com/forms/d/e/1FAIpQLScwNSk9hXN61oeohumgsiclifleHw4ogk9K3ccnPDVKb399cQ/viewform>