

# Introduction



15-468, 15-668, 15-868  
Physics-based Rendering  
Spring 2022, 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)

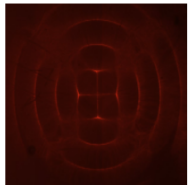


Yannis at Harvard in 2011

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

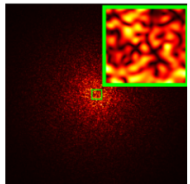
See also: <http://imaging.cs.cmu.edu/>

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



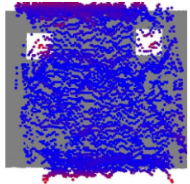
## Rendering Near-Field Speckle Statistics in Scattering Media

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



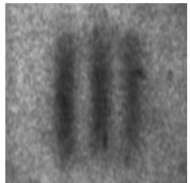
## Rendering Near-Field Speckle Statistics in Scattering Media

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](#)



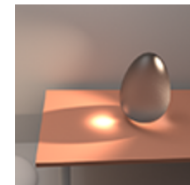
## Interferometric Transmission Probing with Coded Mutual Intensity

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

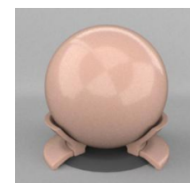
Bei Xiao, Shuang Zhao, Ioannis Gkioulekas, Wenyan Bi, Kavita Bala  
Journal of Vision (JOV), 2020  
[paper](#) | [code](#)

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



Bailey Miller advised by Prof. Ioannis Gkioulekas

Teaching Assistant for 15-468 and 2nd year PhD in CSD

### Monte Carlo methods for PDEs

(aka physical simulations that work with complex geometry)

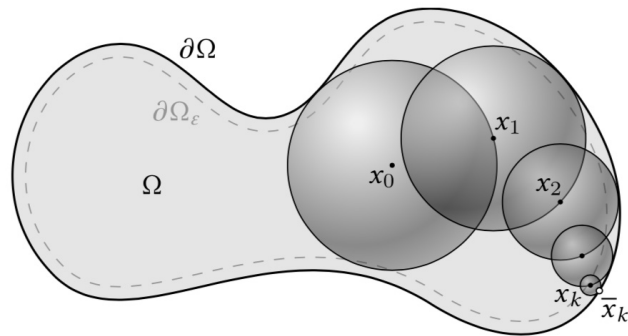


Figure from Sawhney et al '20

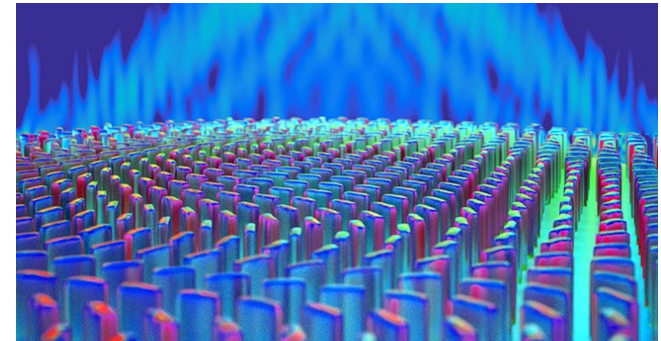
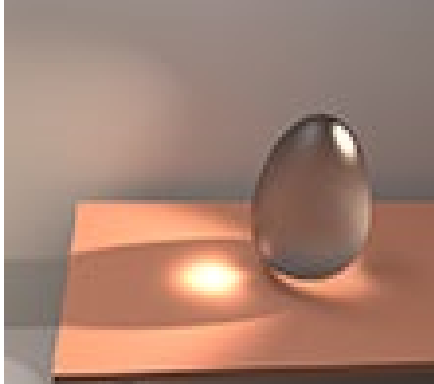


Image from startup Metalenz



Zhang et al. '20

### neural rendering for reconstruction

(aka computer vision methods that use physics-based rendering)

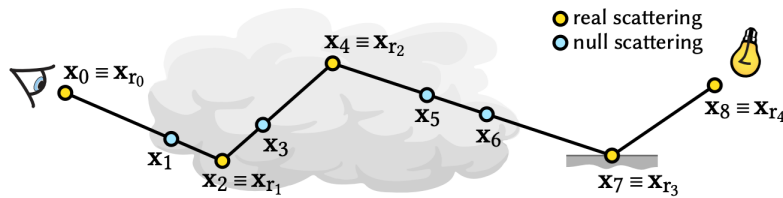


Figure from Miller et al '19

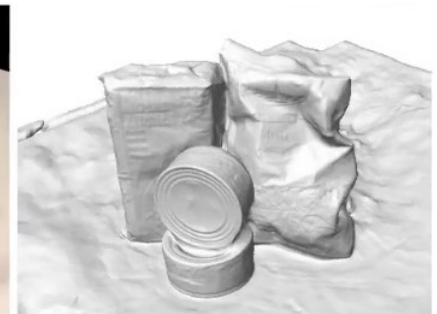
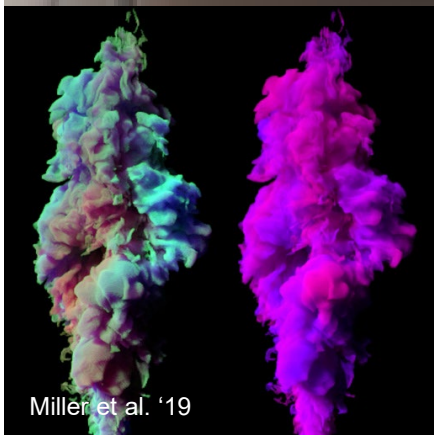


Image from Oechsle et al '21



Miller et al. '19

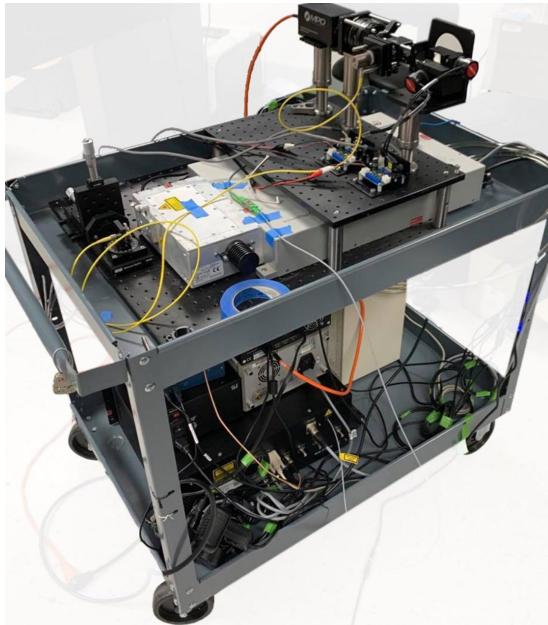
some prior works



Ryan Po  
15-468 TA and Senior in CS

Research: imaging with single-photon sensors

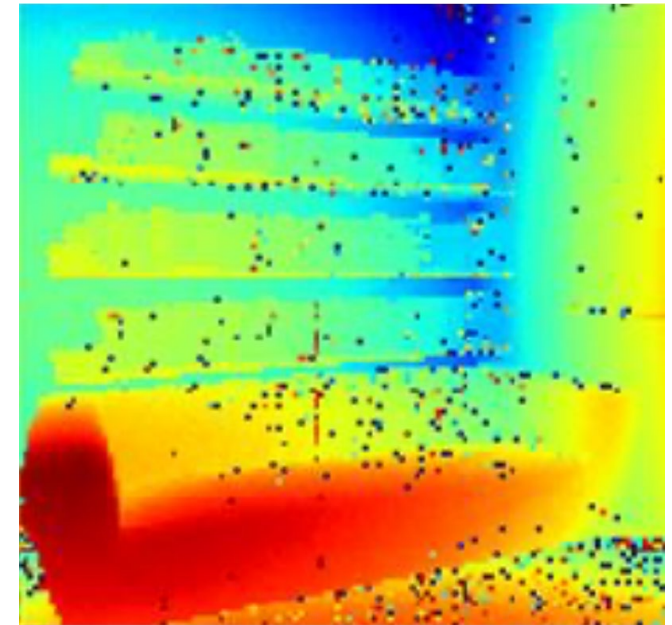
SPAD setup



3D scan outside CFA



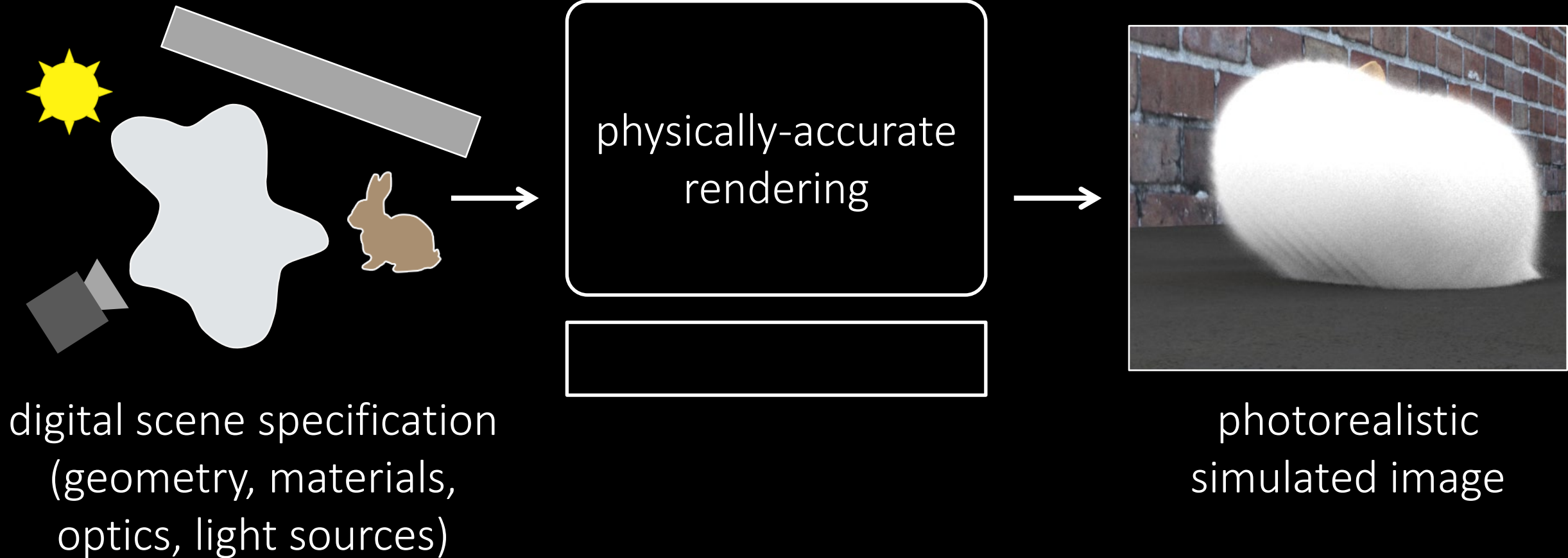
3D scan of Yannis' office





What is this course about?

# Forward rendering



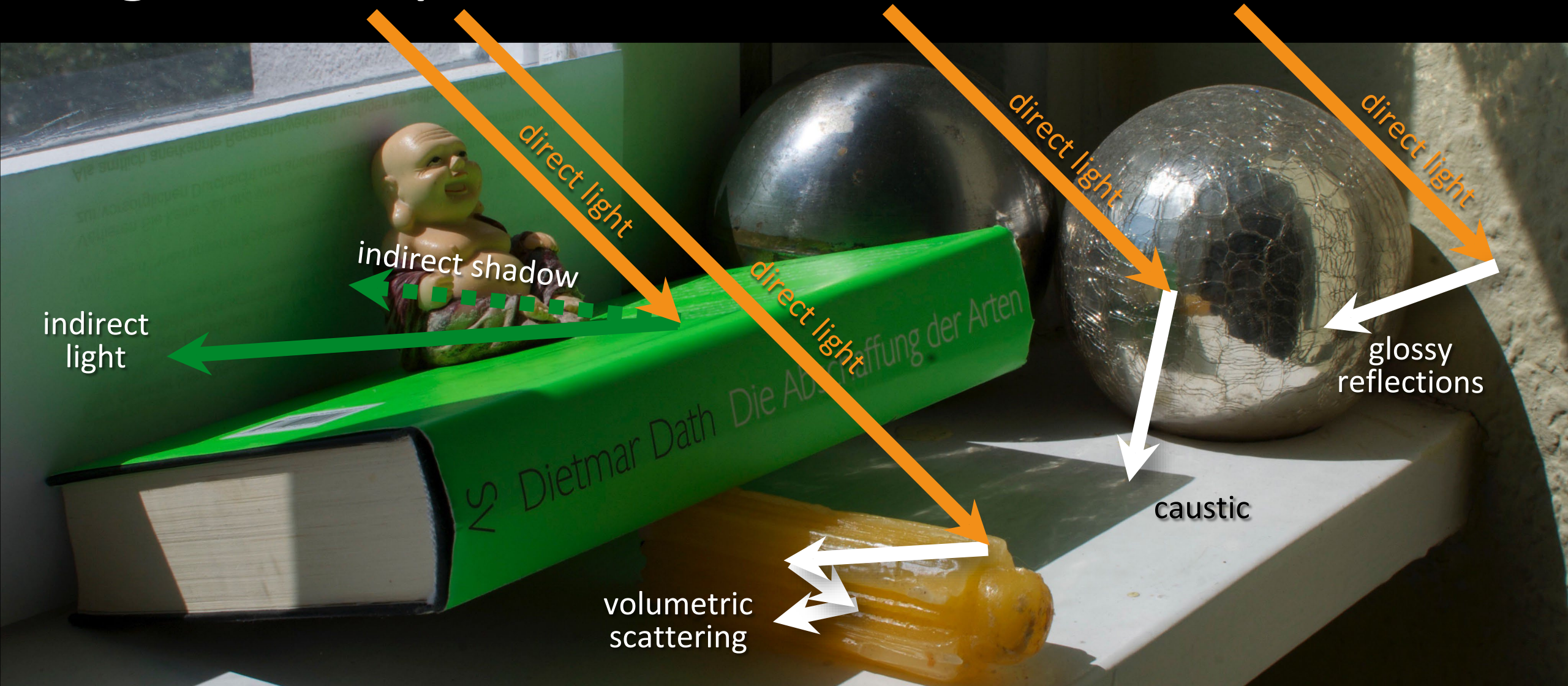
# What is this class about?

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

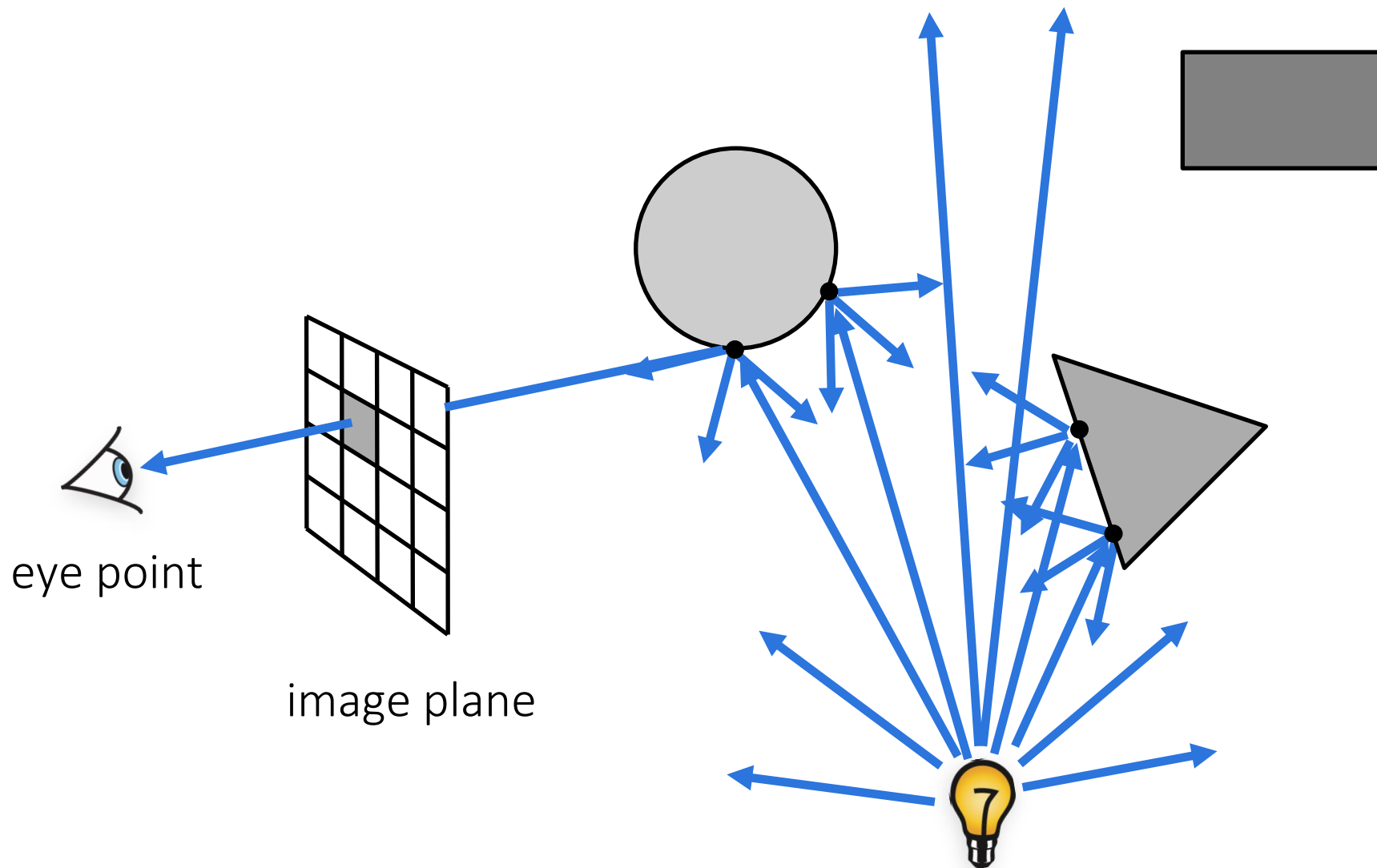
# Motivation



# Light transport in the real world

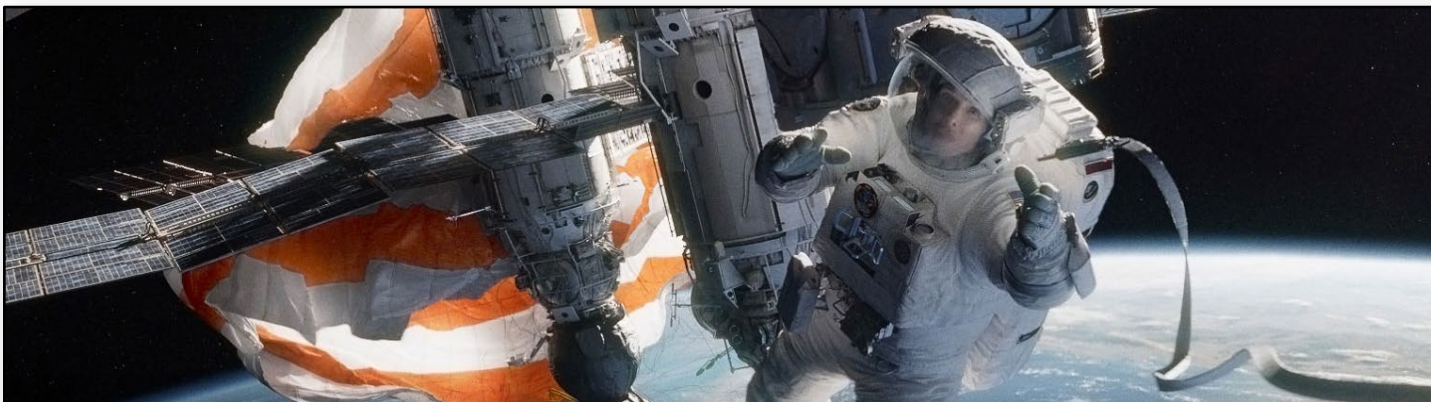


# Physics-based rendering



Mimic the physics of light transport using ray tracing

# Ray tracing in production

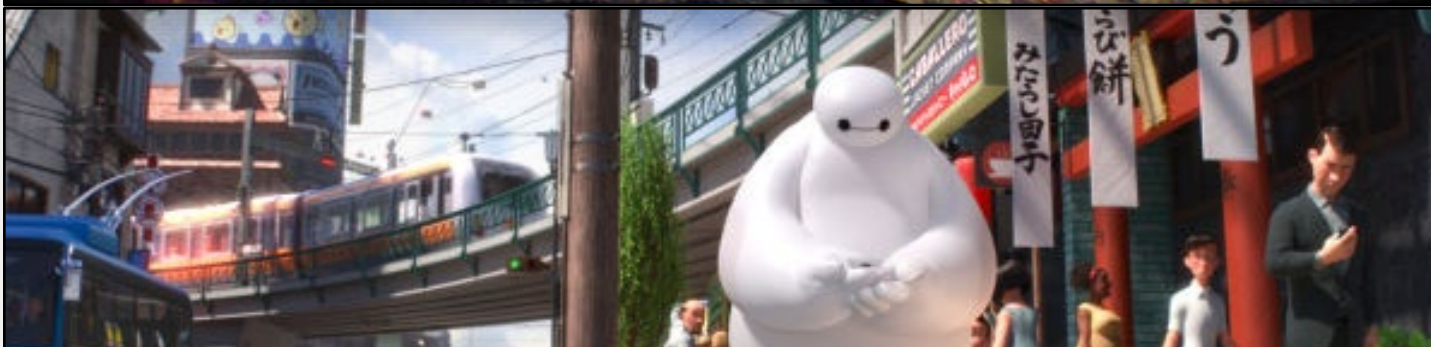


Arnold Renderer

SOLIDANGLE

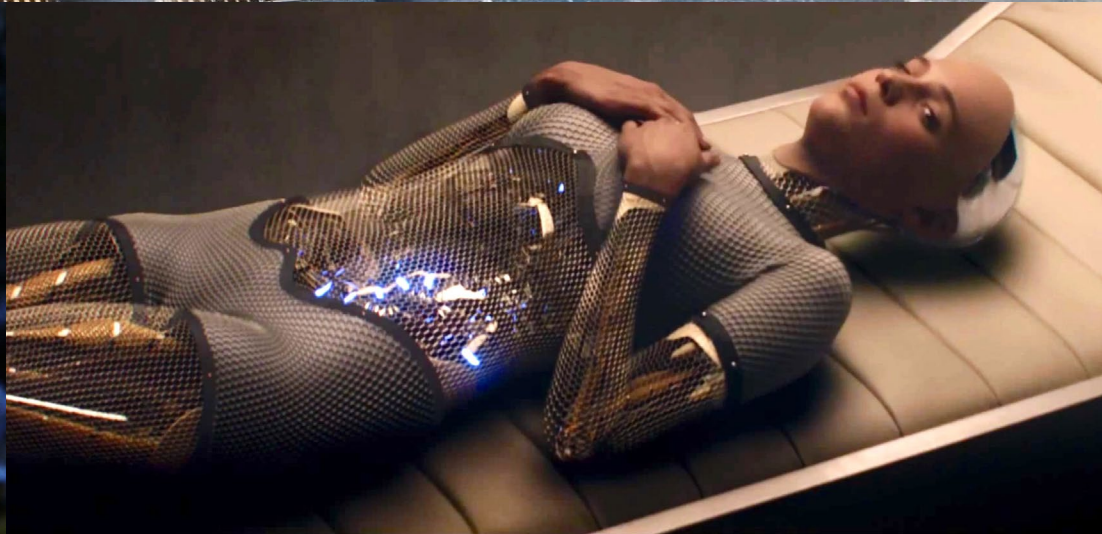


PIXAR's  
RenderMan



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

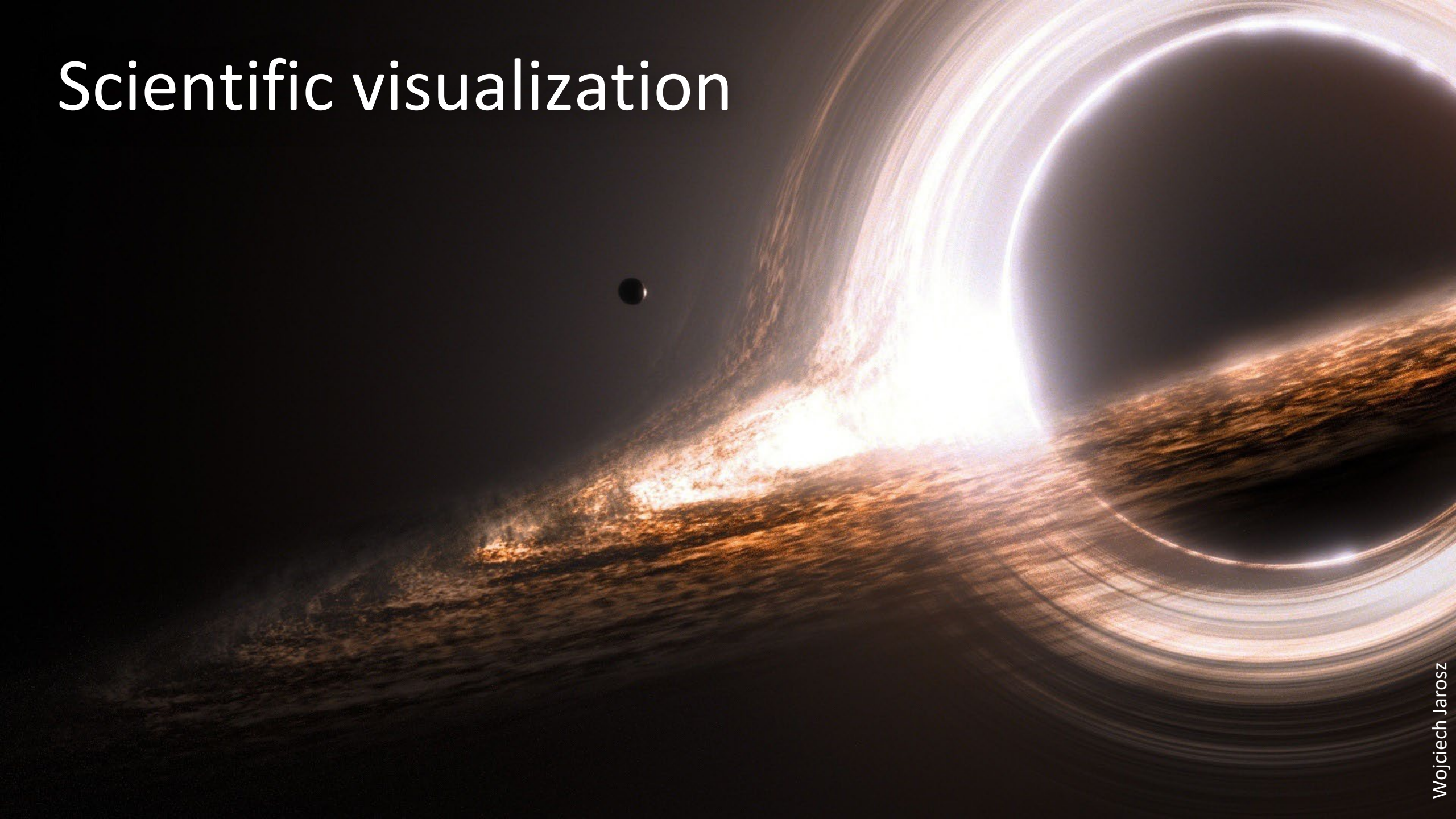


# Digital fabrication



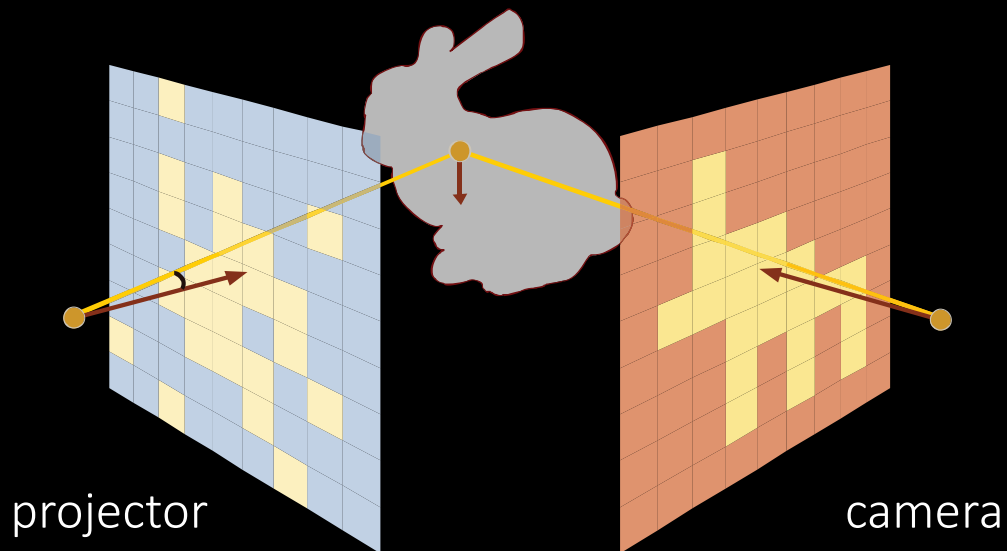


# Scientific visualization

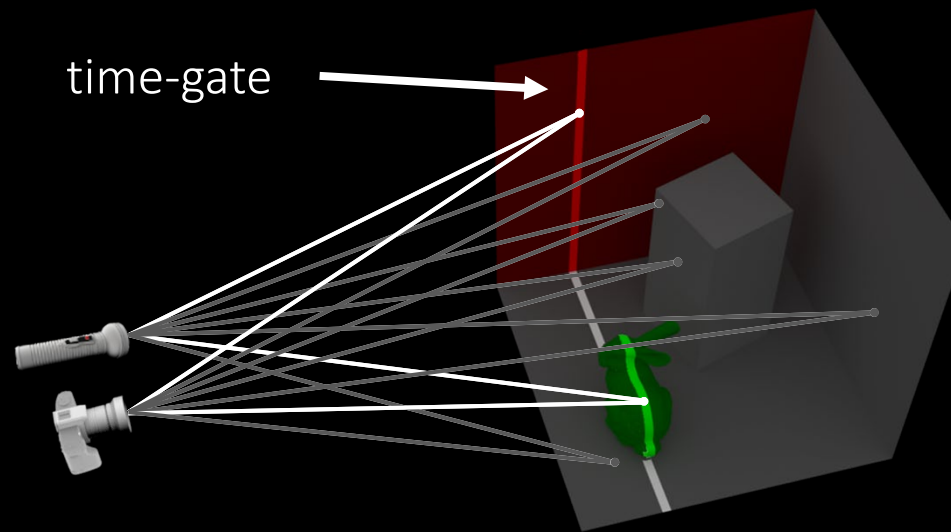


# Scientific imaging

rendering computational light transport



rendering time-of-flight sensors

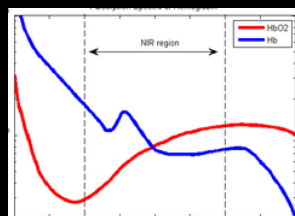
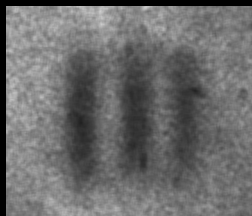
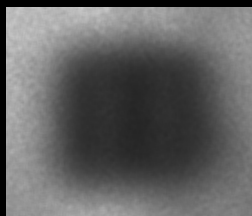
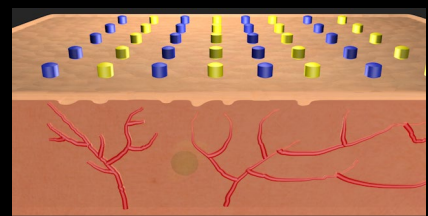


Used by CMU imaging projects:

convolutional DOT

coded coherence

coded spectrum

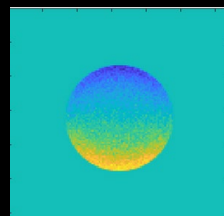
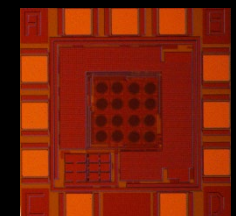
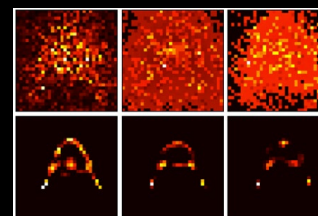
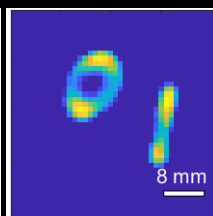
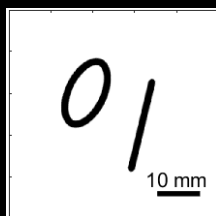


Used by CMU imaging projects:

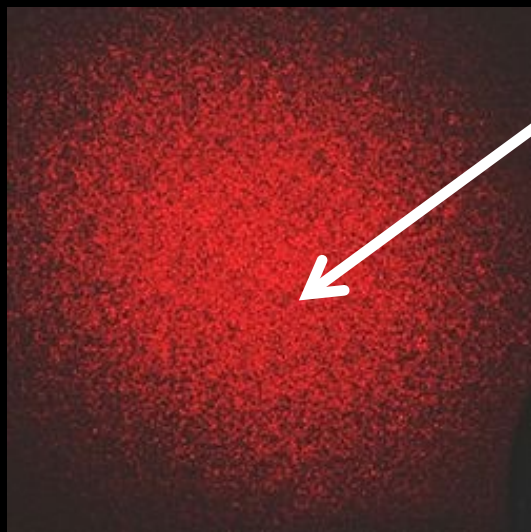
ToF DOT

all-photon imag.

differential SPAD

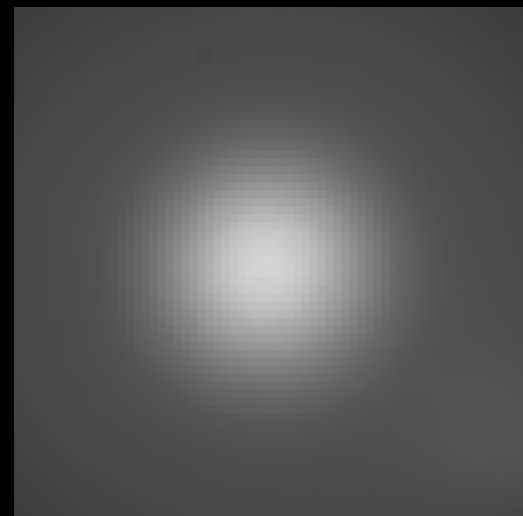


# Rendering wave effects



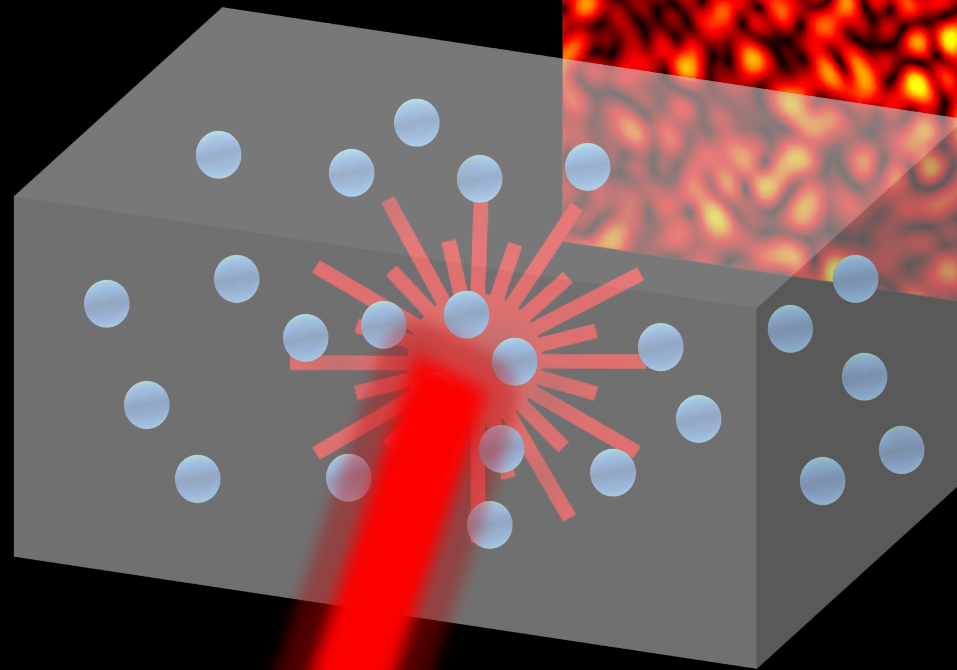
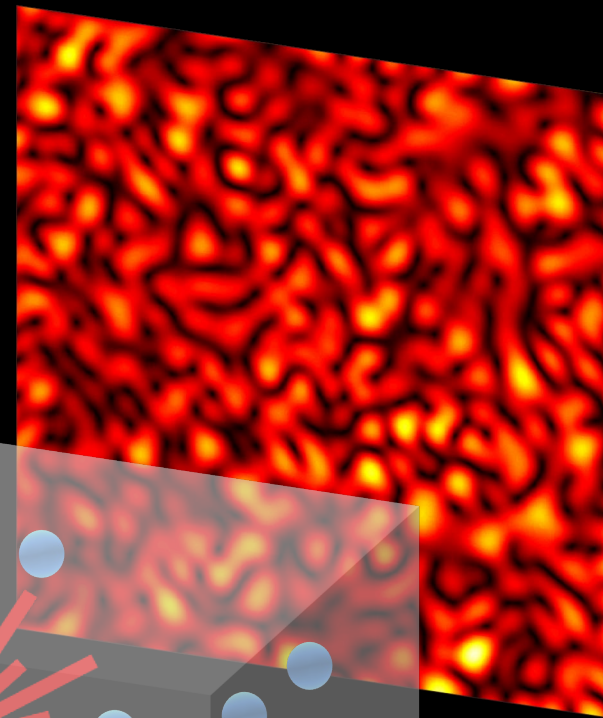
speckle: noise-like pattern

what real laser images look like



what standard rendered images look like

projected speckle image

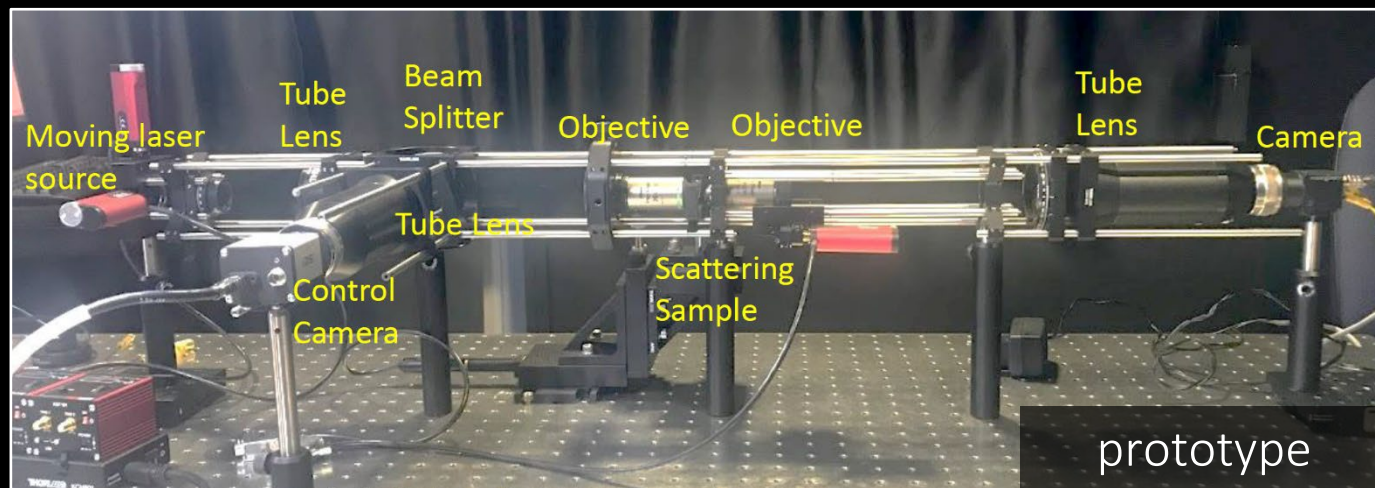
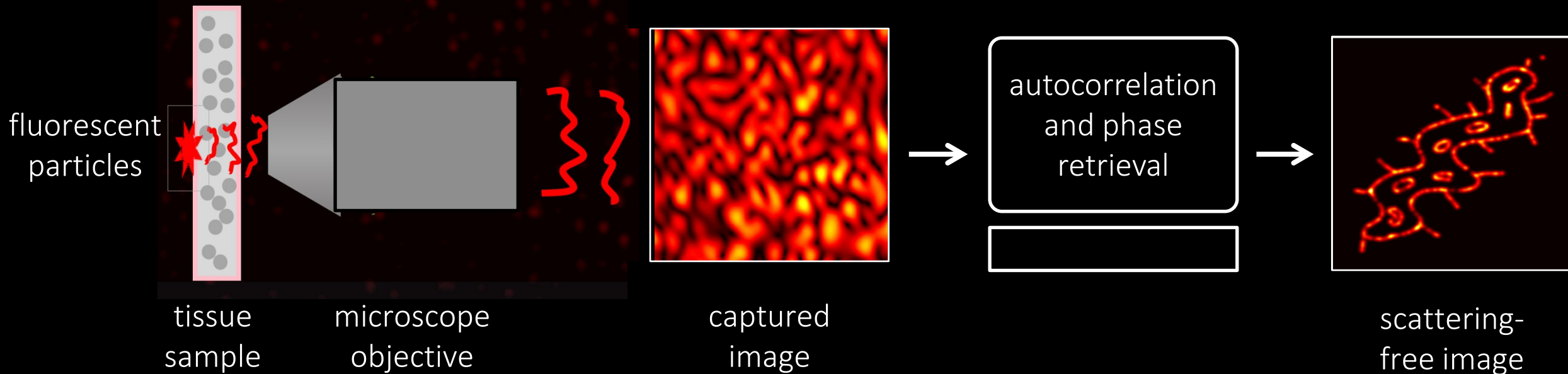


laser beam

scattering volume



# Application: fluorescence Microscopy

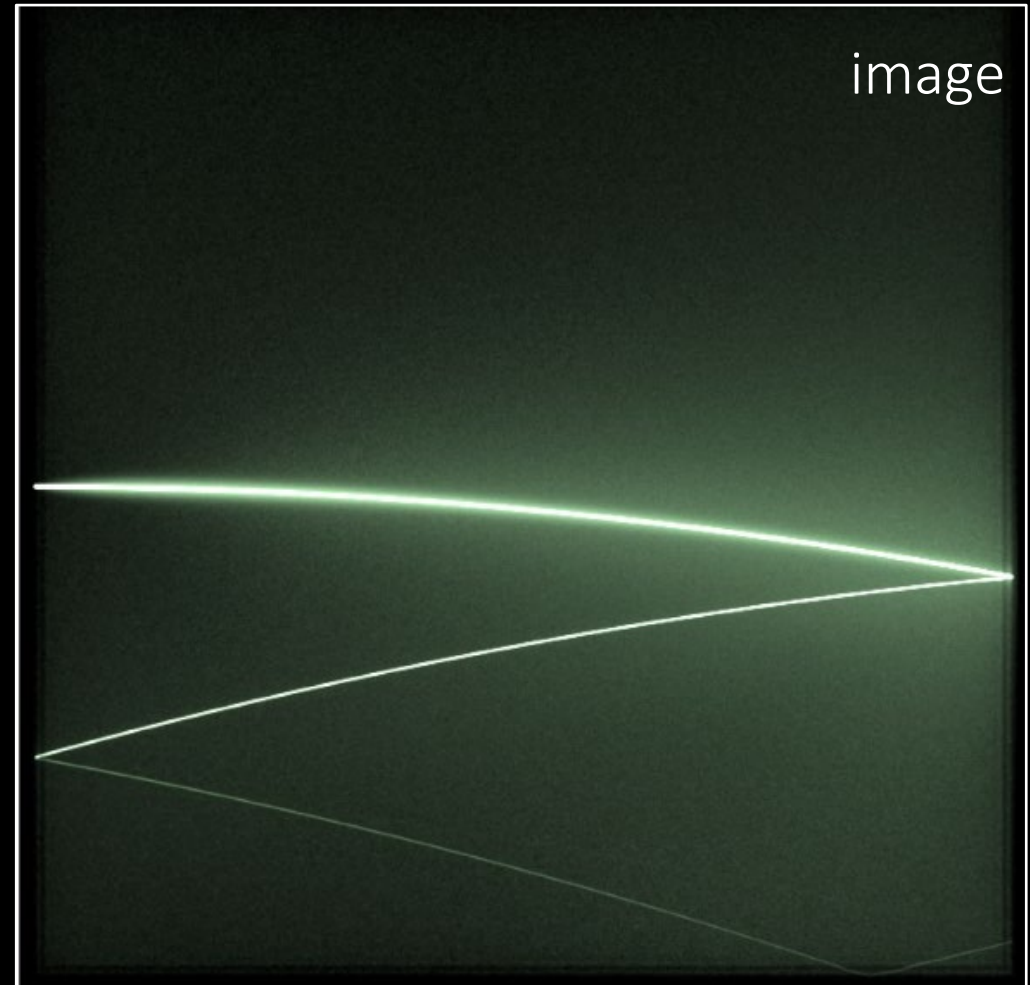
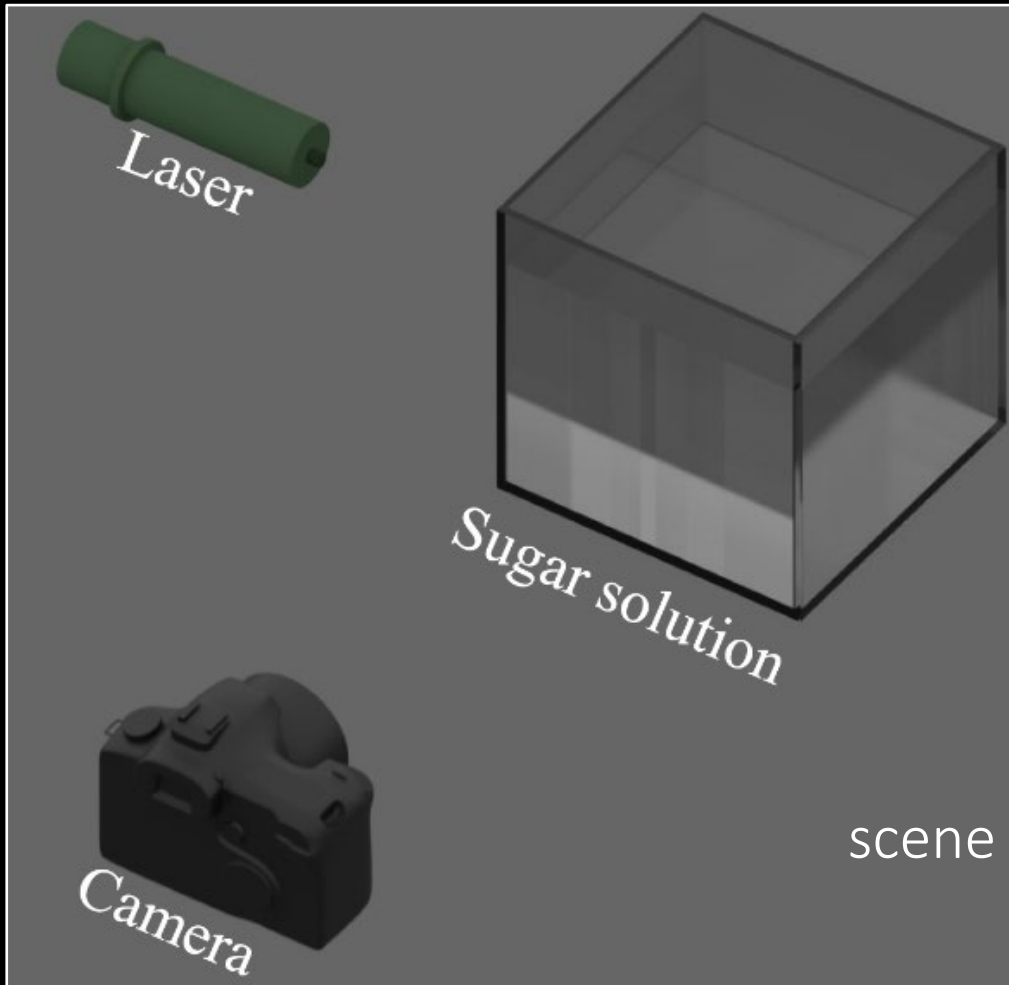


Performance strongly depends on:

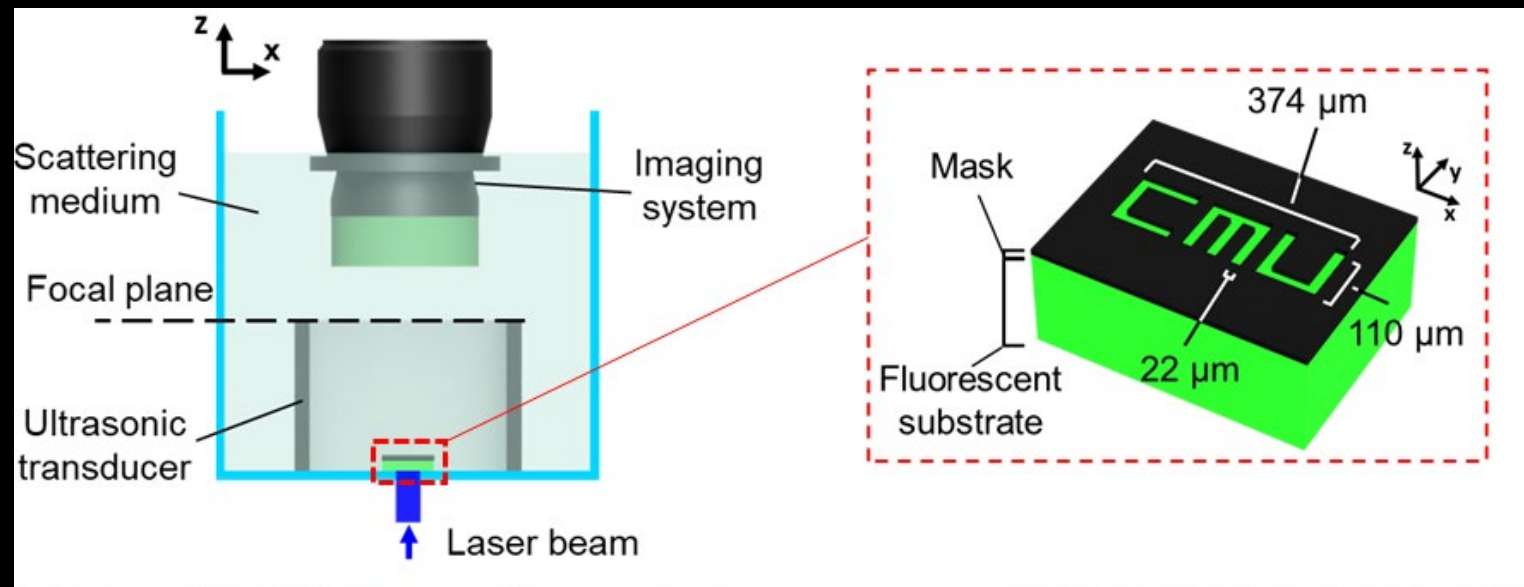
- speckle statistics
- image priors
- tissue parameters

Rendering-assisted exploration and new algorithms!

# Rendering eikonal transport



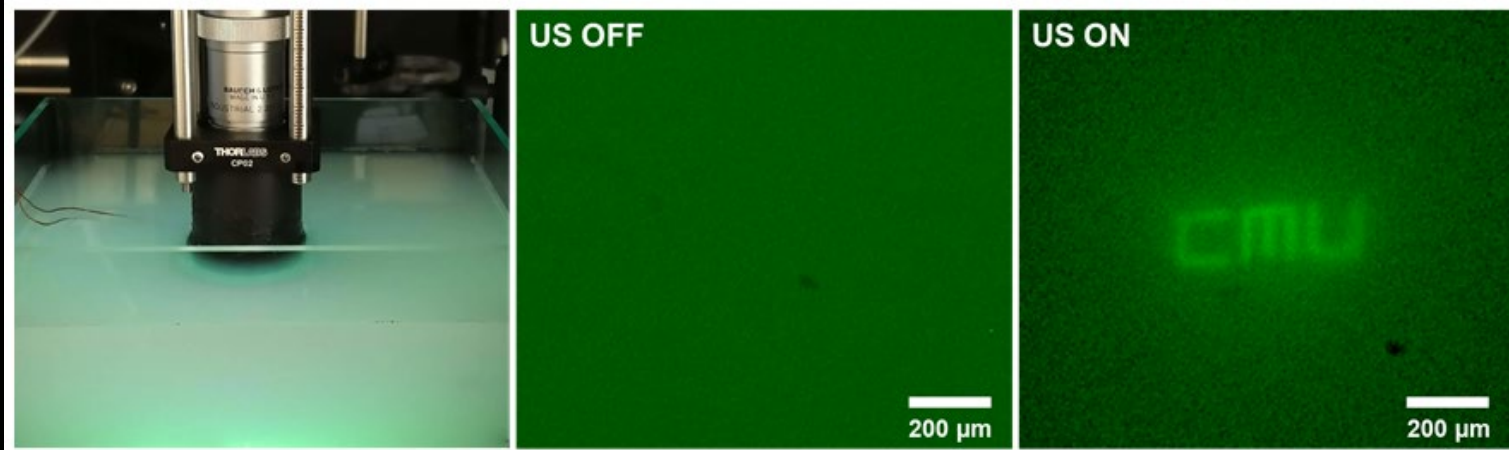
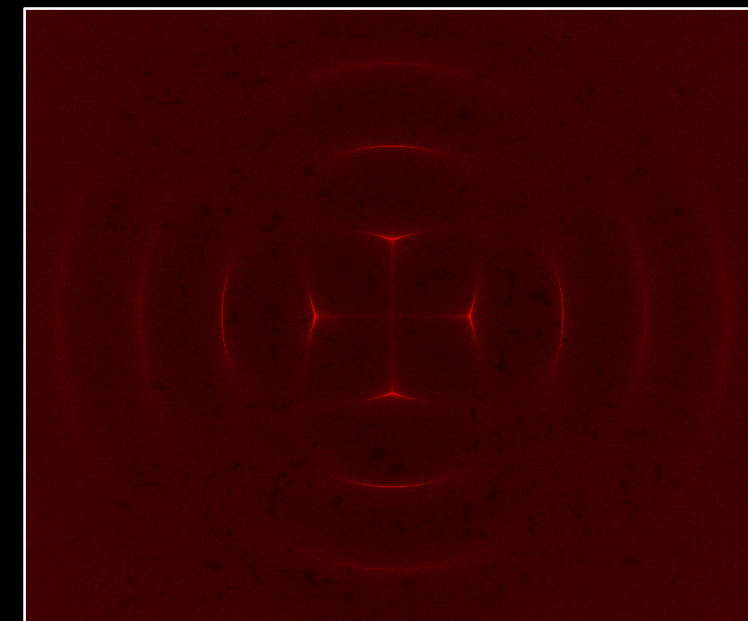
# Application: acousto-optics



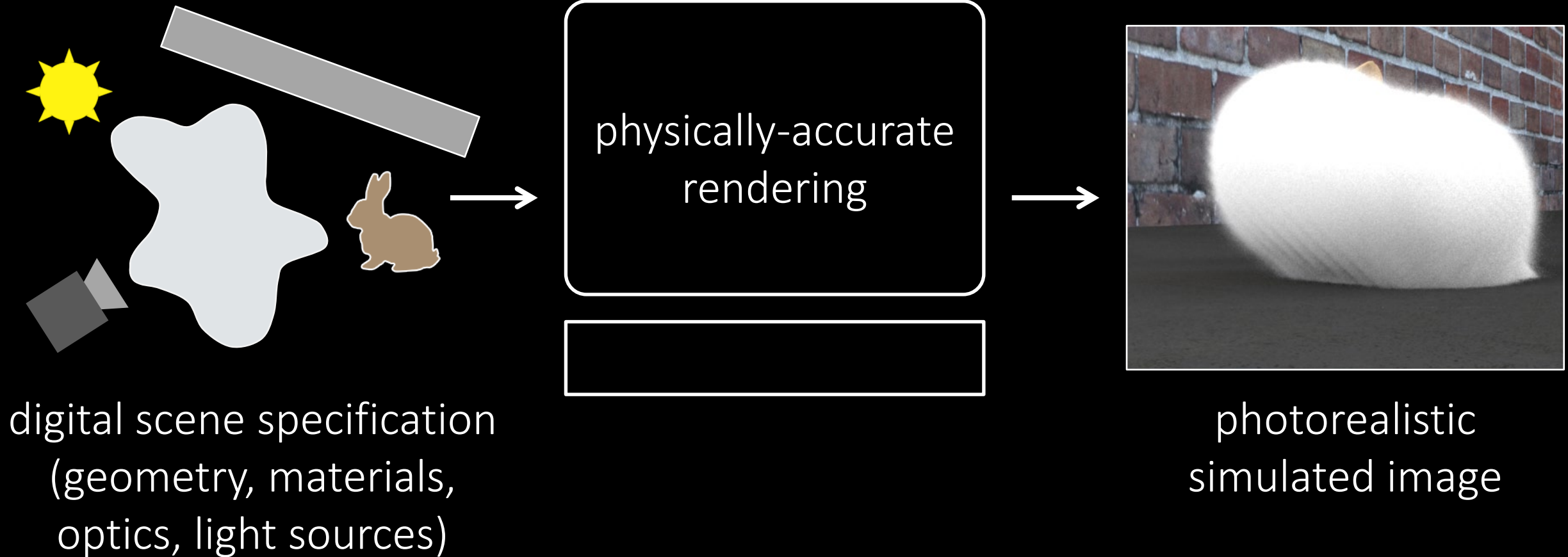
real capture



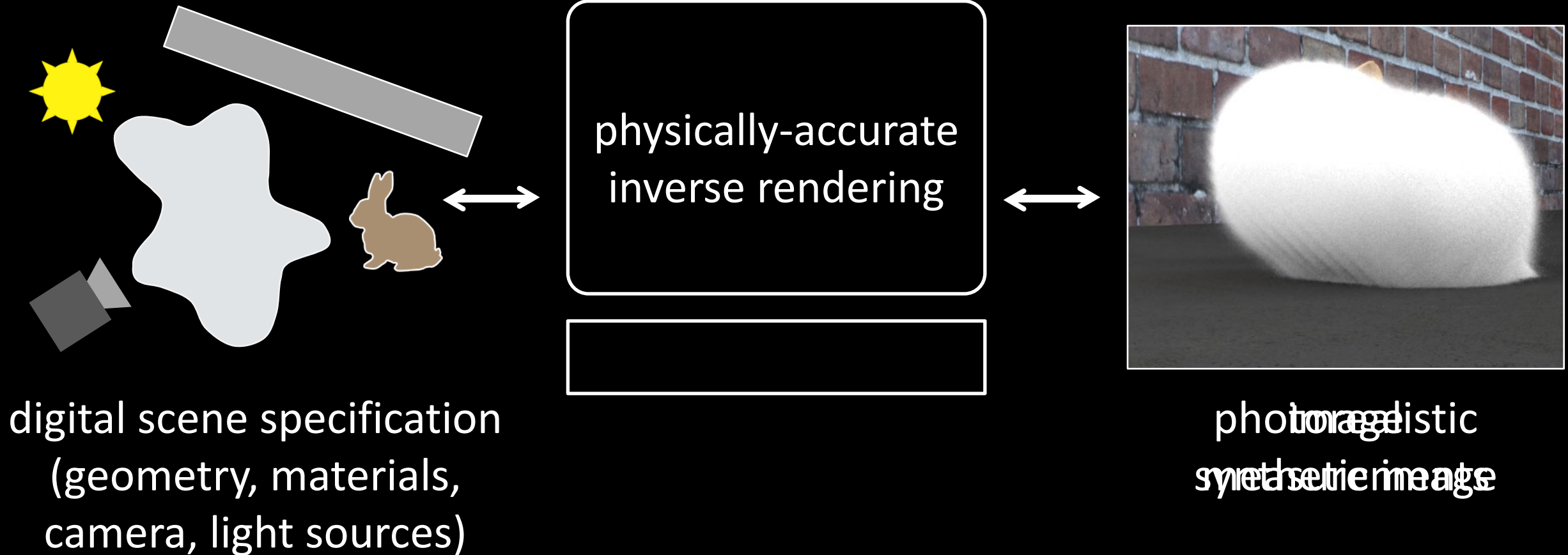
our algorithm



# Forward rendering



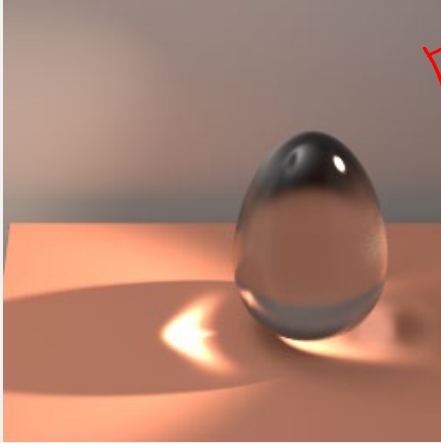
# Inverse rendering



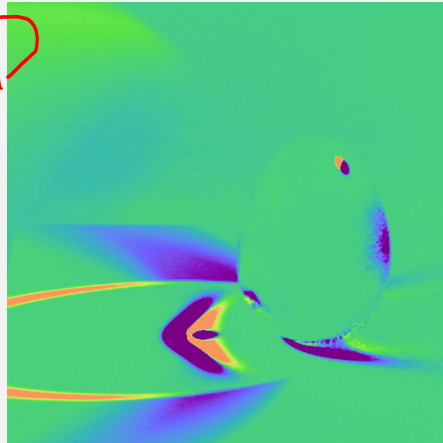


# Differentiable rendering

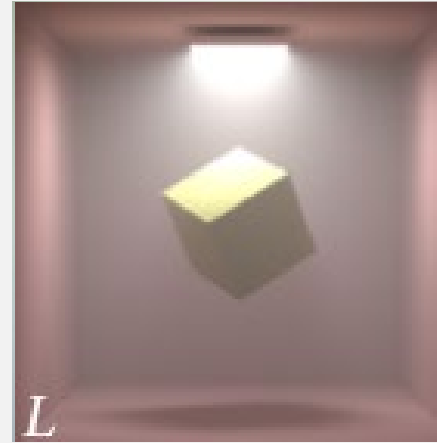
Original image



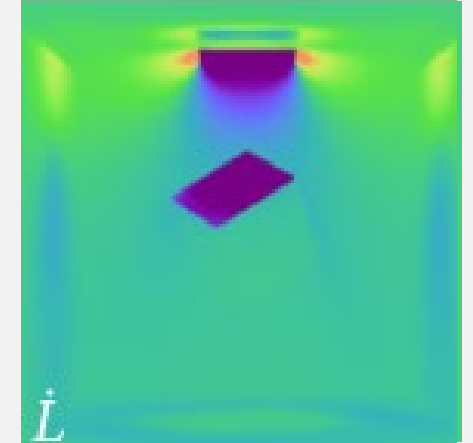
Derivative image



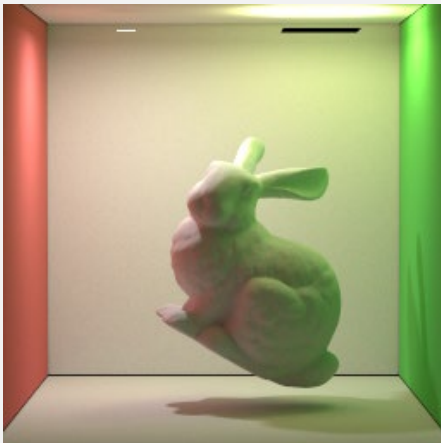
Original image



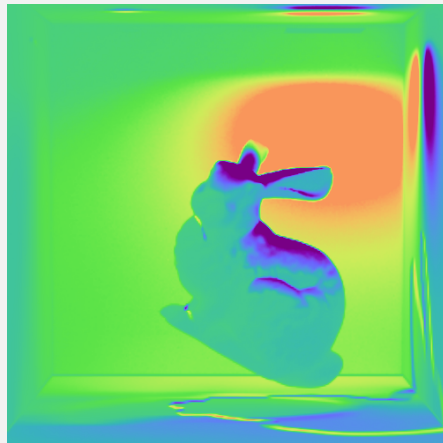
Derivative image



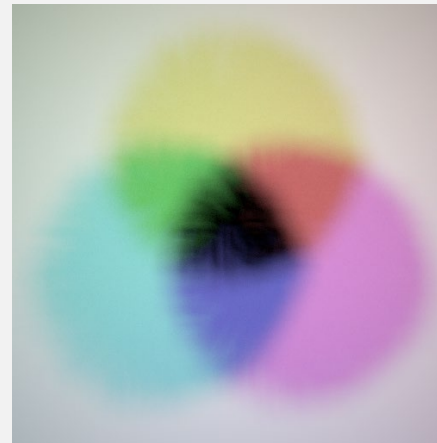
Original image



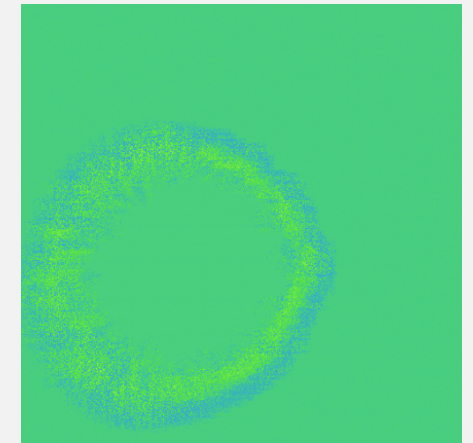
Derivative image



Original image

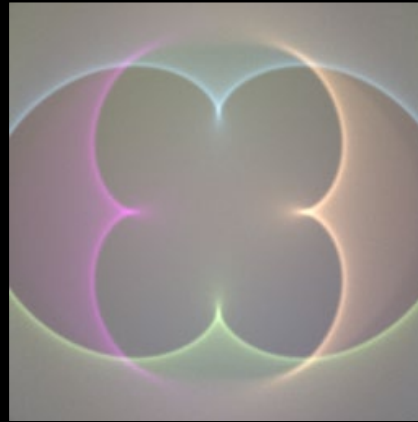


Derivative image

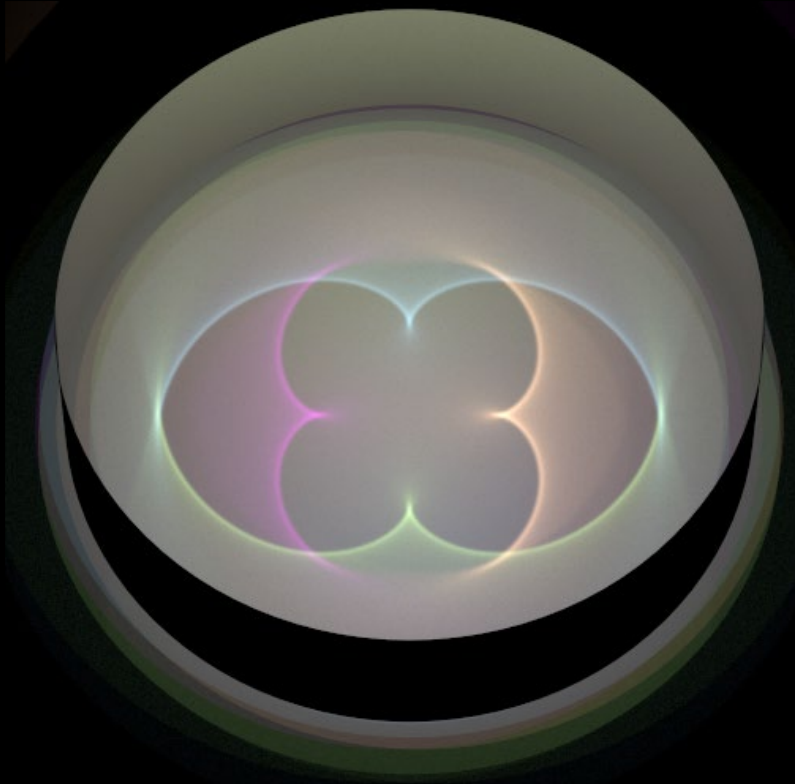
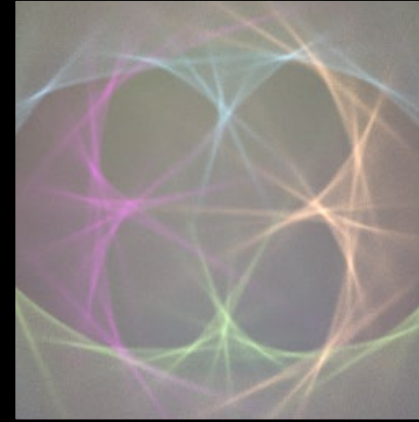


# Application: shape optimization

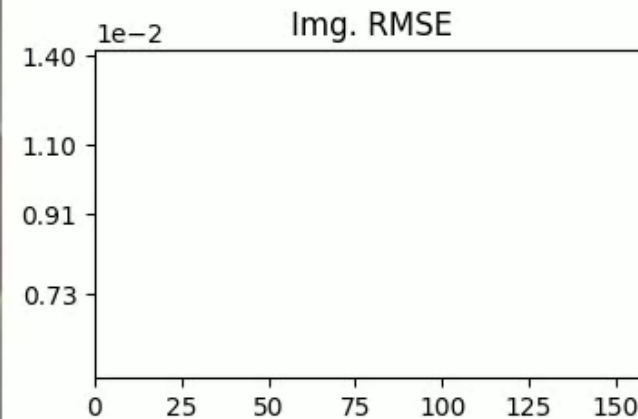
Initial



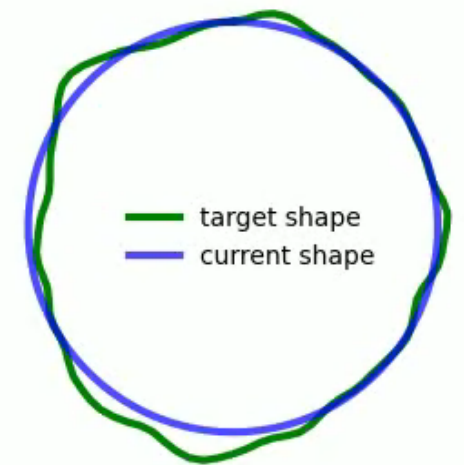
Target image



Iter #0

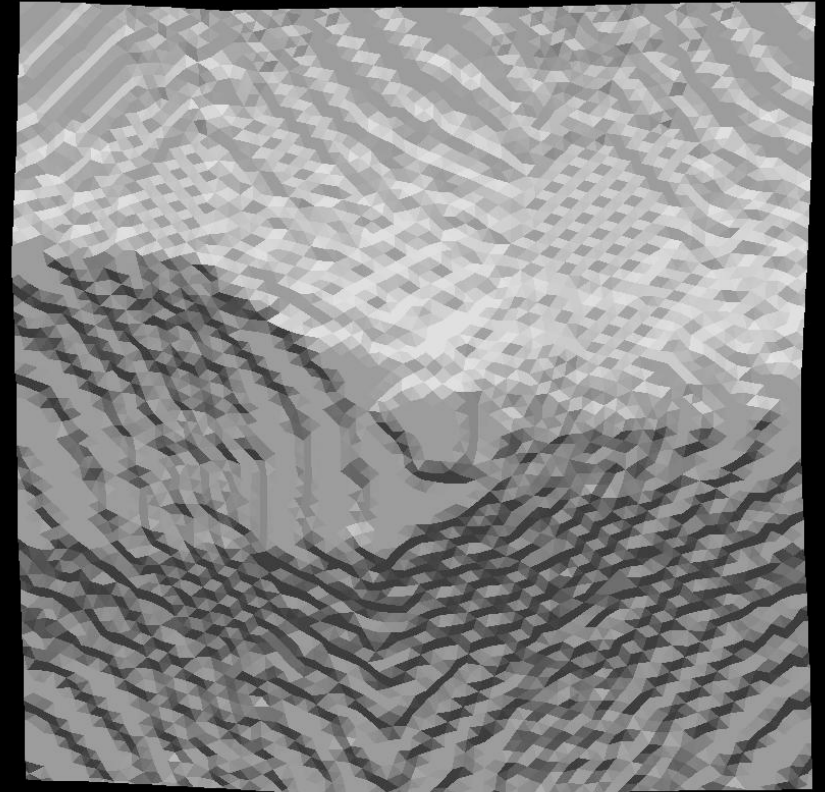
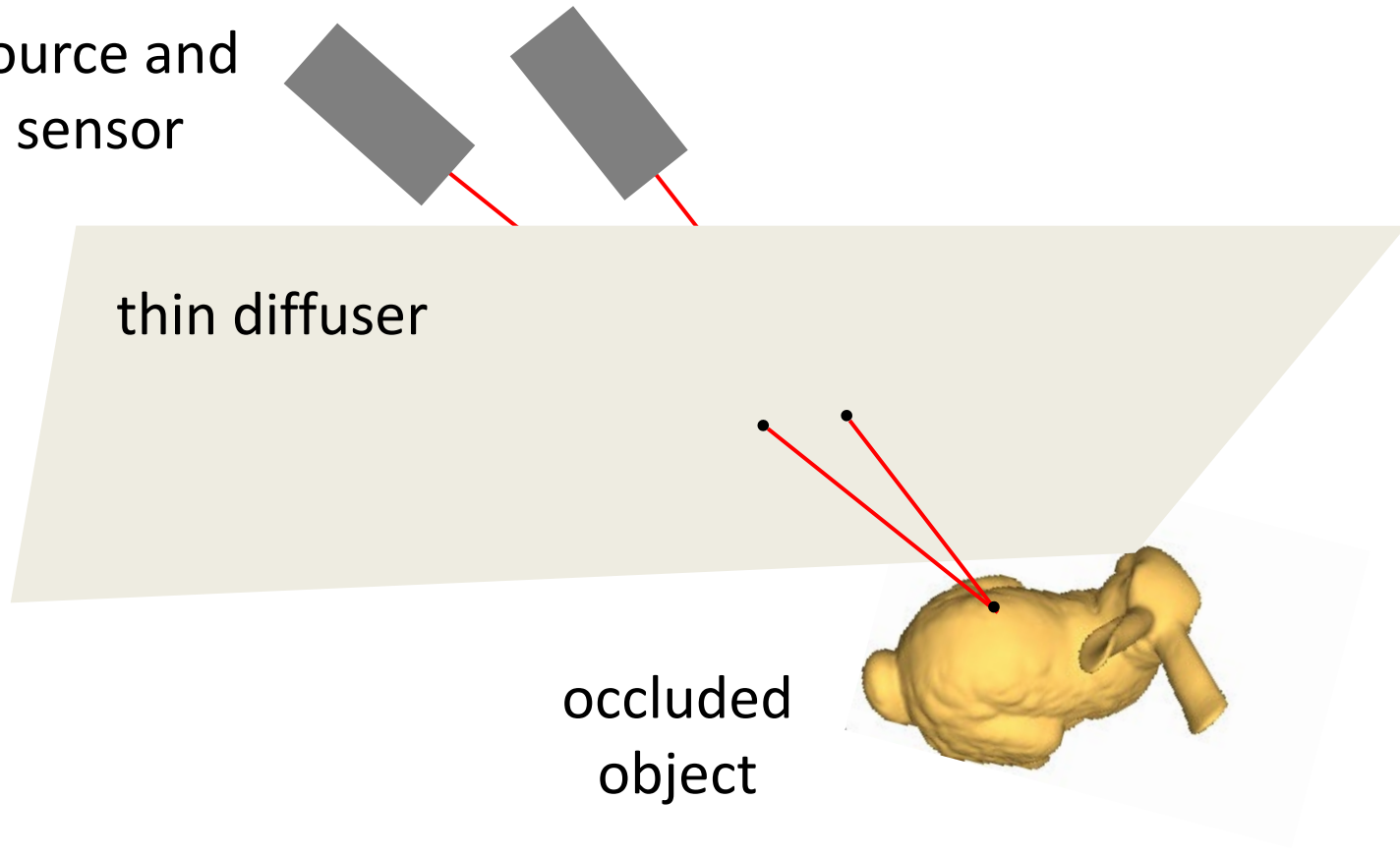


Cross-sectional shape  
(displacement x 20)



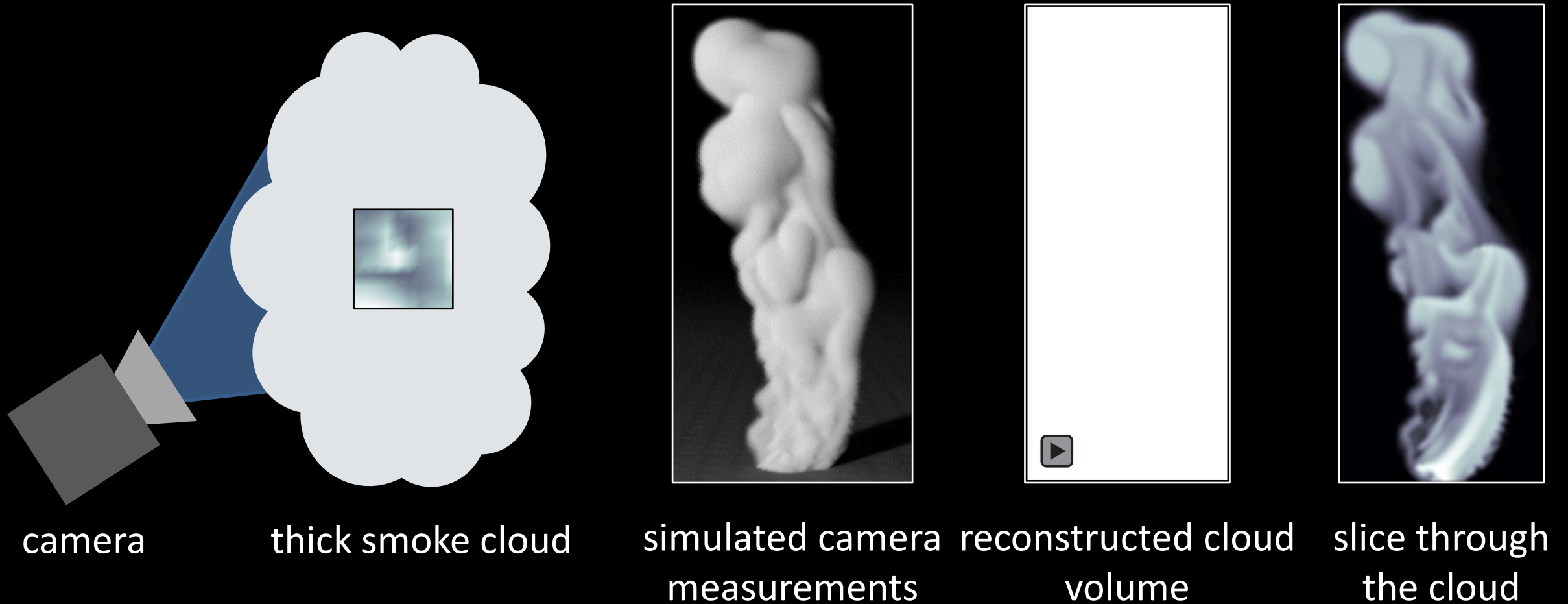
# Application: non-line-of-sight imaging

source and  
sensor

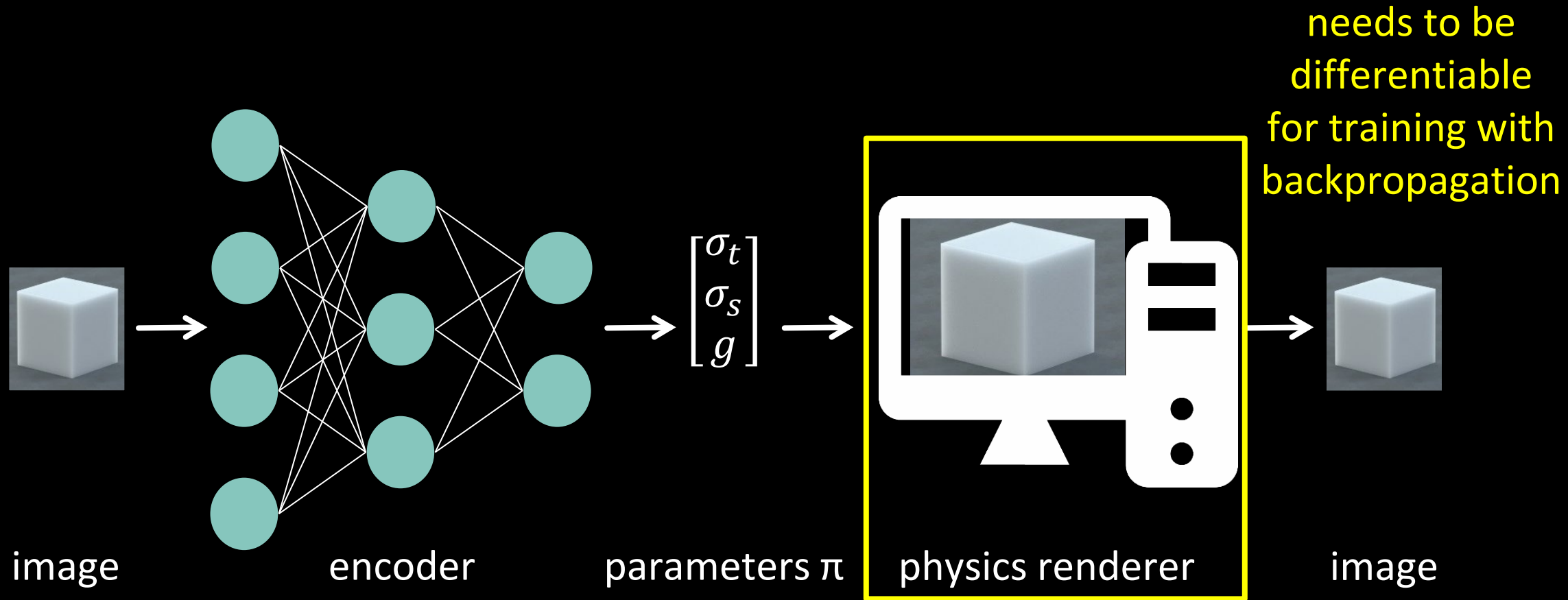


reconstruction evolution

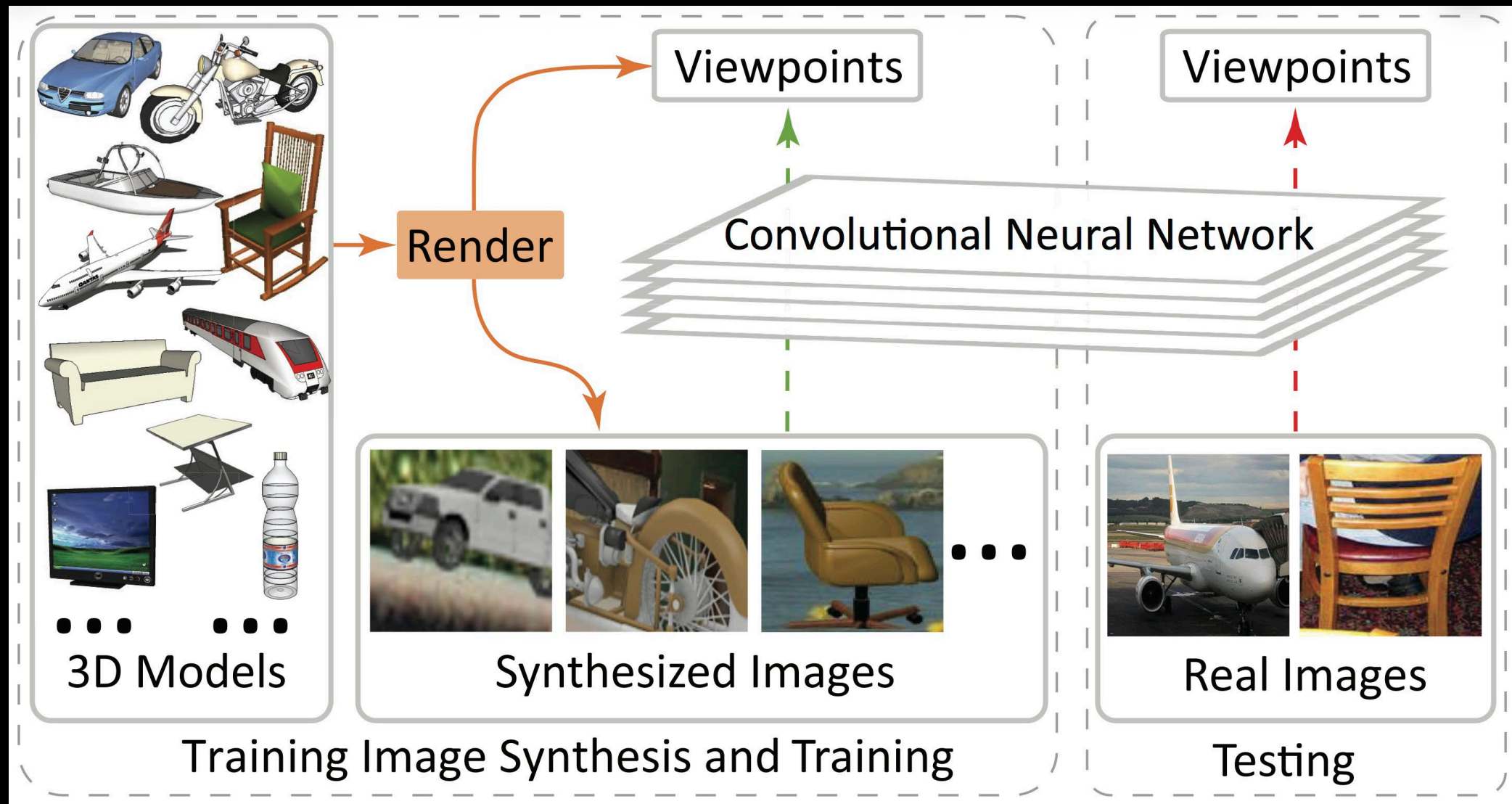
# Application: non-invasive tomography



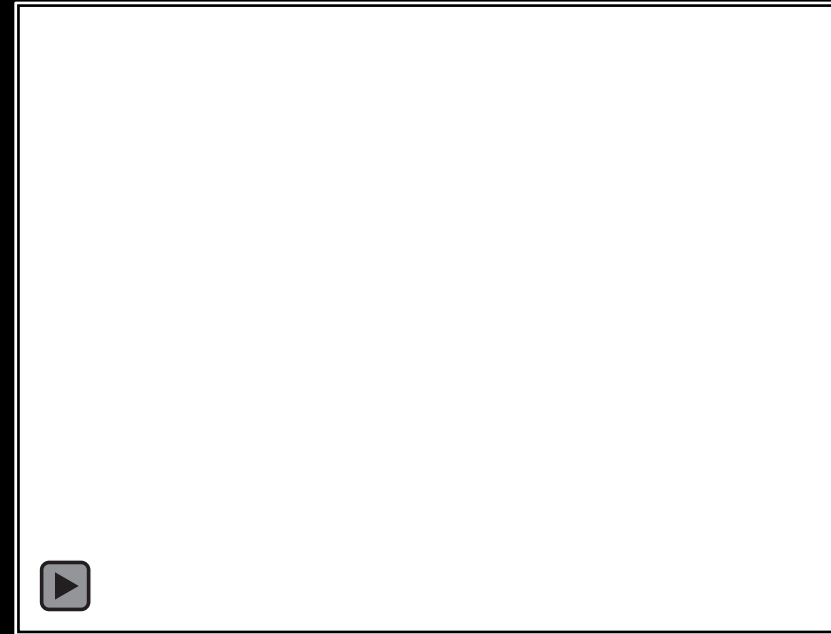
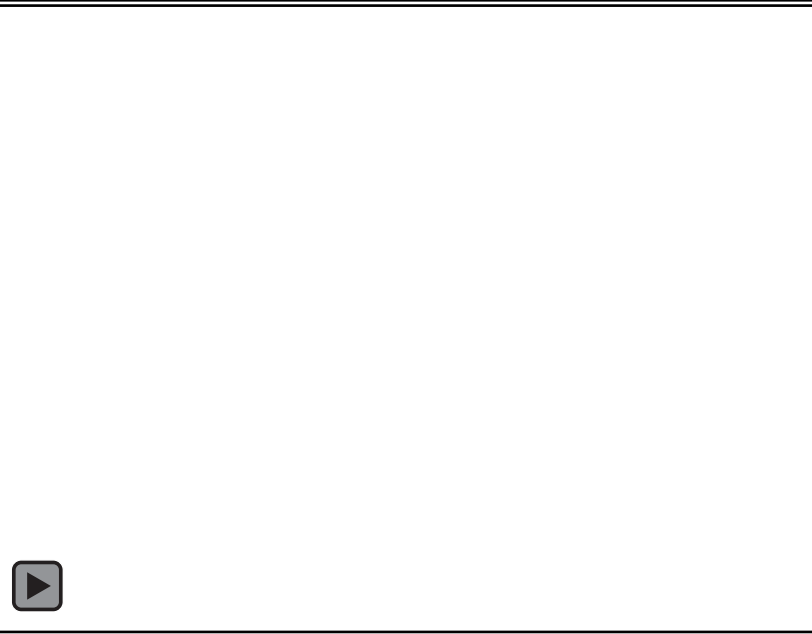
# Application: vision and machine learning



# Application: vision and machine learning



# Application: neural rendering



# What is this class about?

Producing realistic images by:

- *simulating* light transport (global illumination)
- *simulating* light-material interactions (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

# Please take the start-of-semester survey!

- Posted on Piazza as well:

[https://docs.google.com/forms/d/e/1FAIpQLSdZONUsOzpfkLGTcpuc8nIHRx7EkVIL\\_yGzXZt5xdwTsDlzxw/viewform](https://docs.google.com/forms/d/e/1FAIpQLSdZONUsOzpfkLGTcpuc8nIHRx7EkVIL_yGzXZt5xdwTsDlzxw/viewform)

# Course logistics

- Course website:

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

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

<https://piazza.com/class/ky96bnus9u54ul>

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

<https://canvas.cmu.edu/courses/27795>

- Slack server for real-time discussion:

See Piazza for the invite link

# Course fast-forward

Tentative syllabus at:

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

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

# Topics to be covered

Basics of ray tracing:

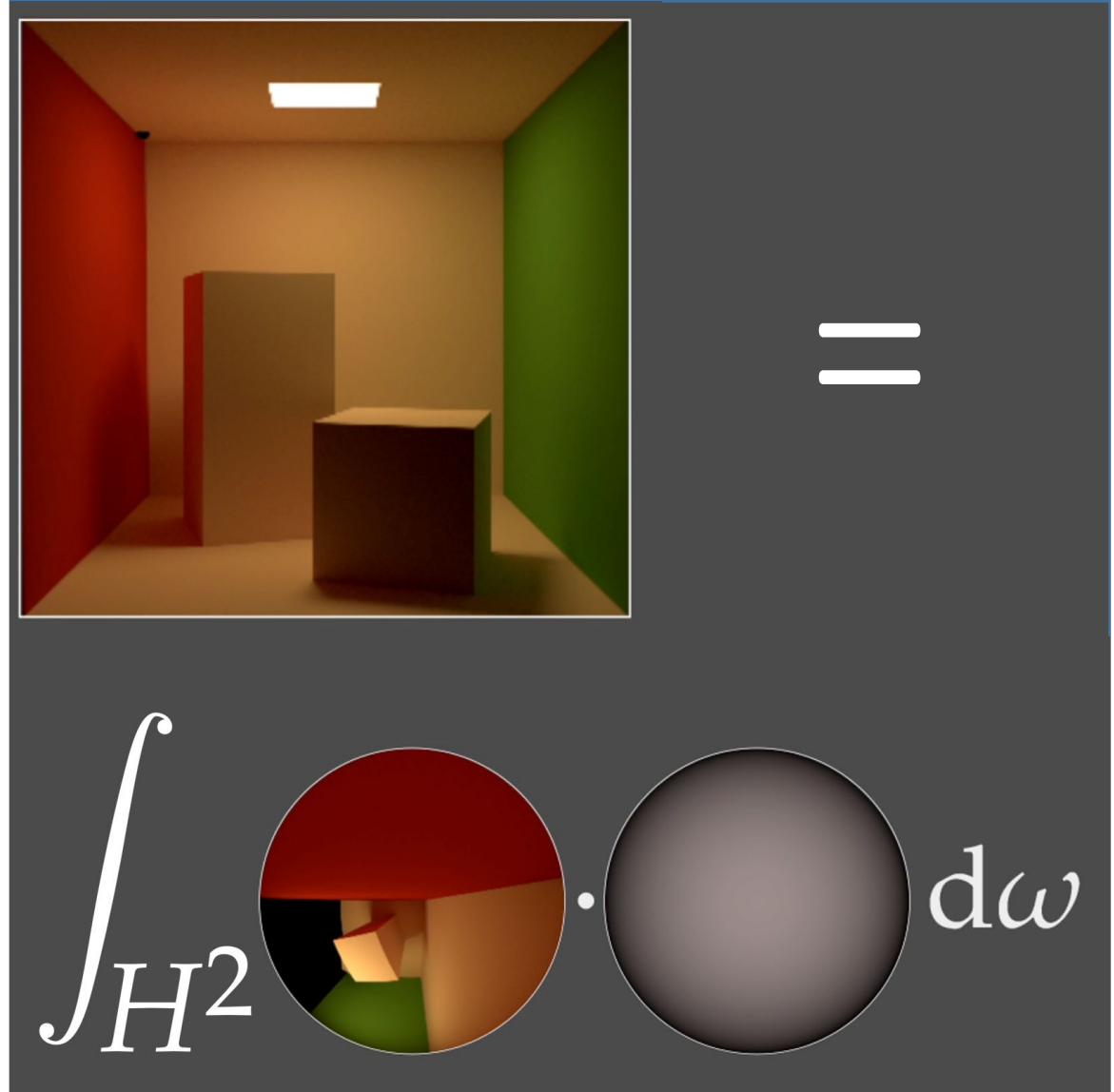
- trace-intersect recursions
- basic camera and illumination models
- shading
- intersection queries
- texture mapping



# Topics to be covered

Theory of light transport and materials:

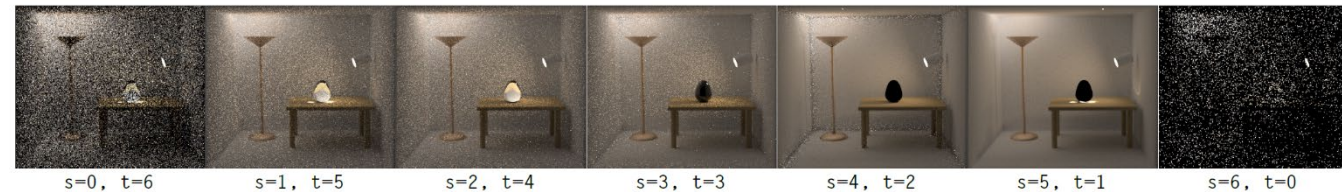
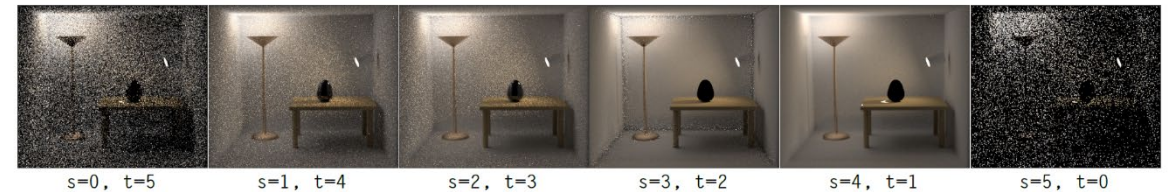
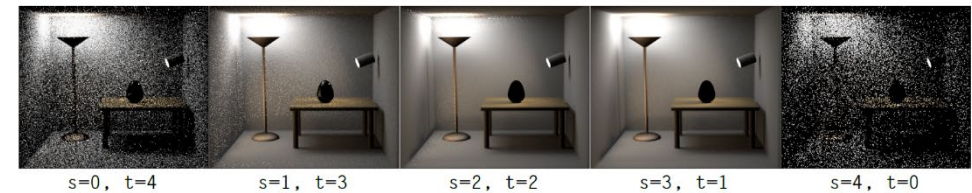
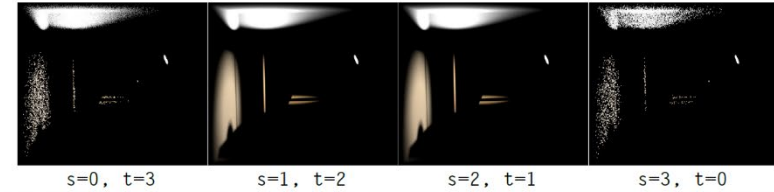
- rendering equation
- radiative transfer equation
- path integral formulations
- microfacet reflectance models
- statistical scattering models



# Topics to be covered

Monte Carlo rendering algorithms:

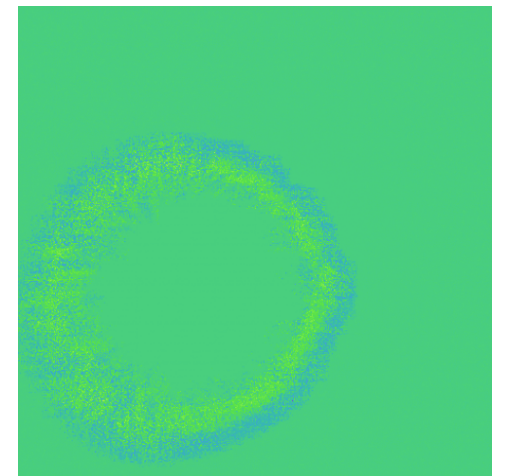
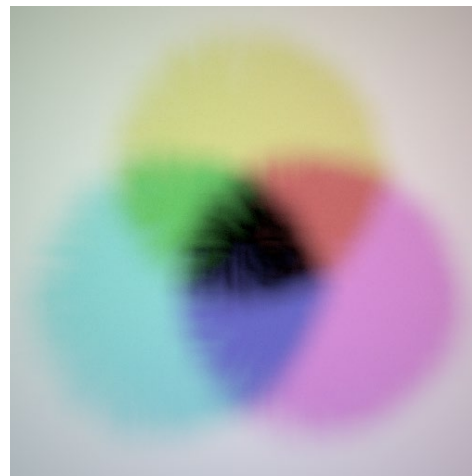
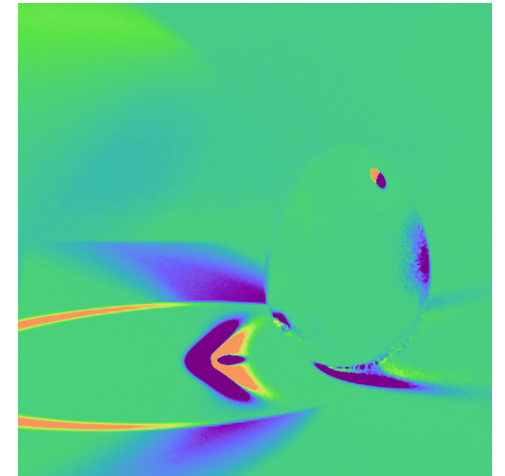
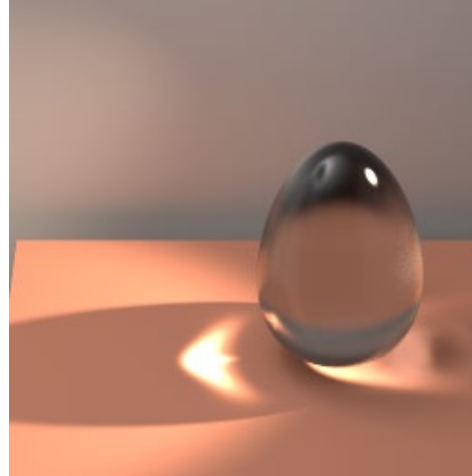
- unidirectional and bidirectional estimators
- Markov chain Monte Carlo techniques
- volumetric rendering
- importance sampling techniques
- quasi-Monte Carlo techniques



# Topics to be covered

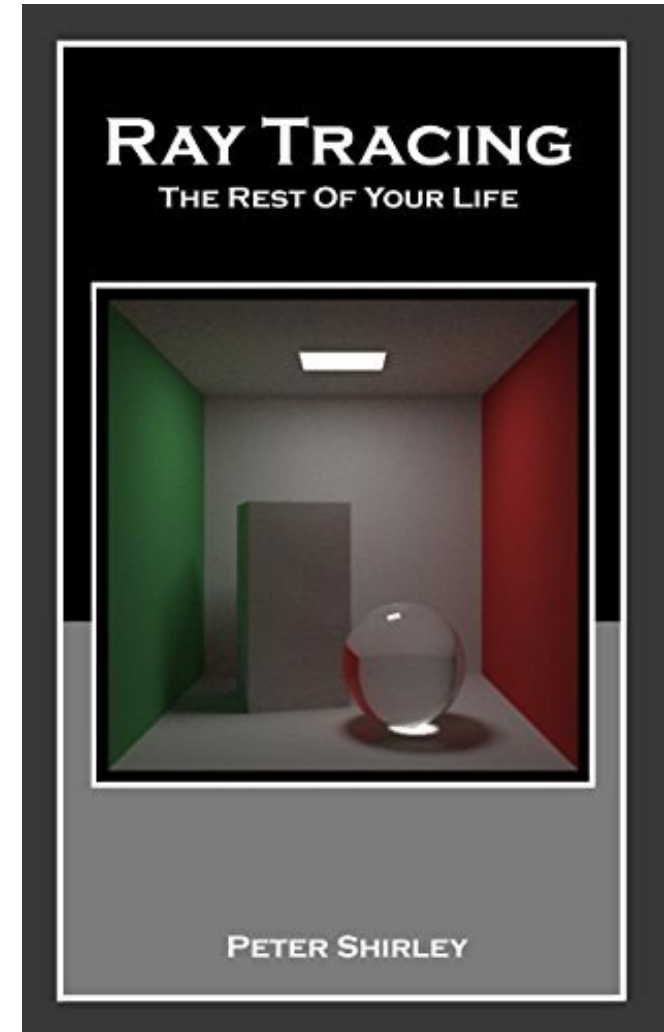
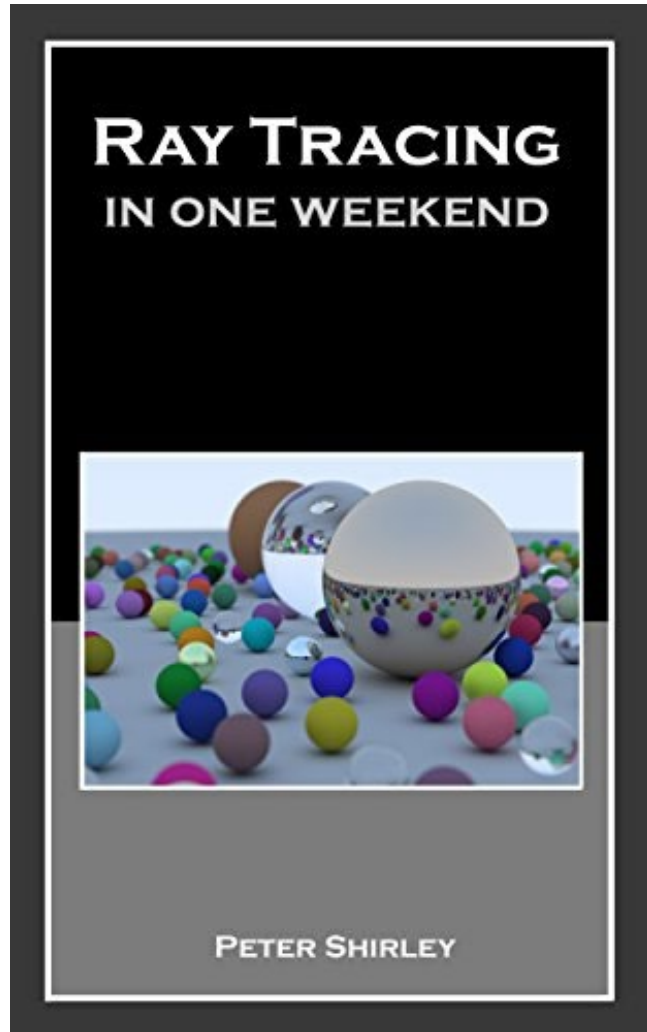
Advanced topics:

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





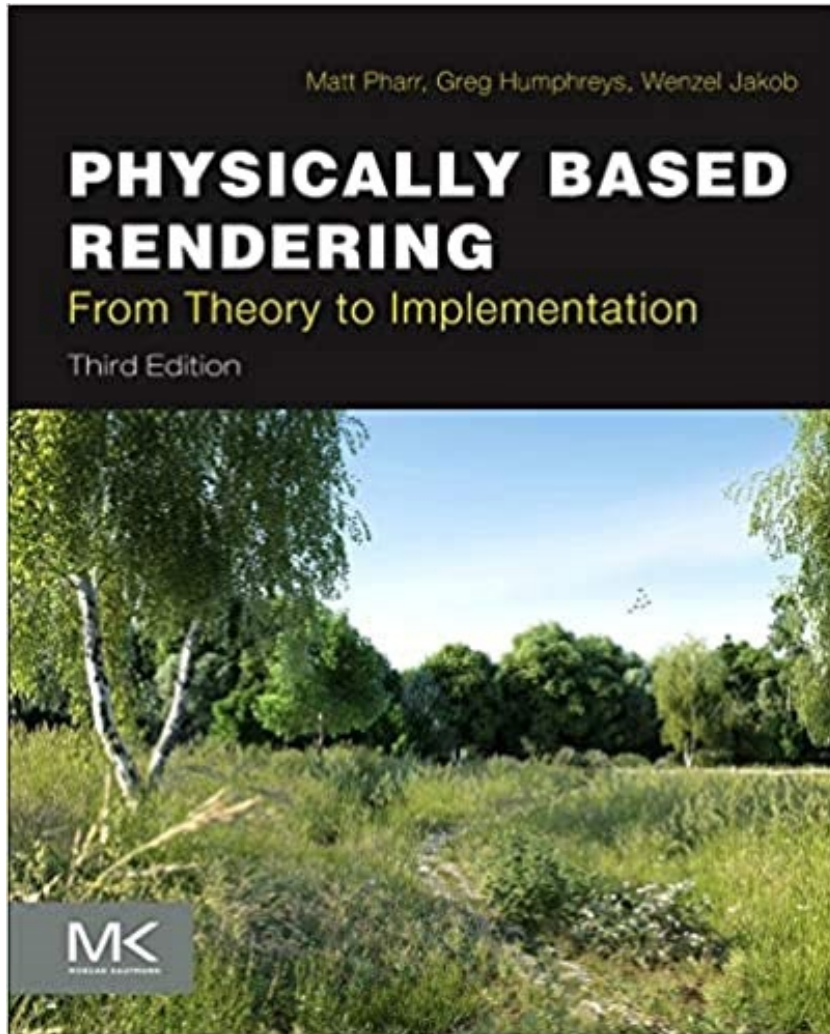
# Books



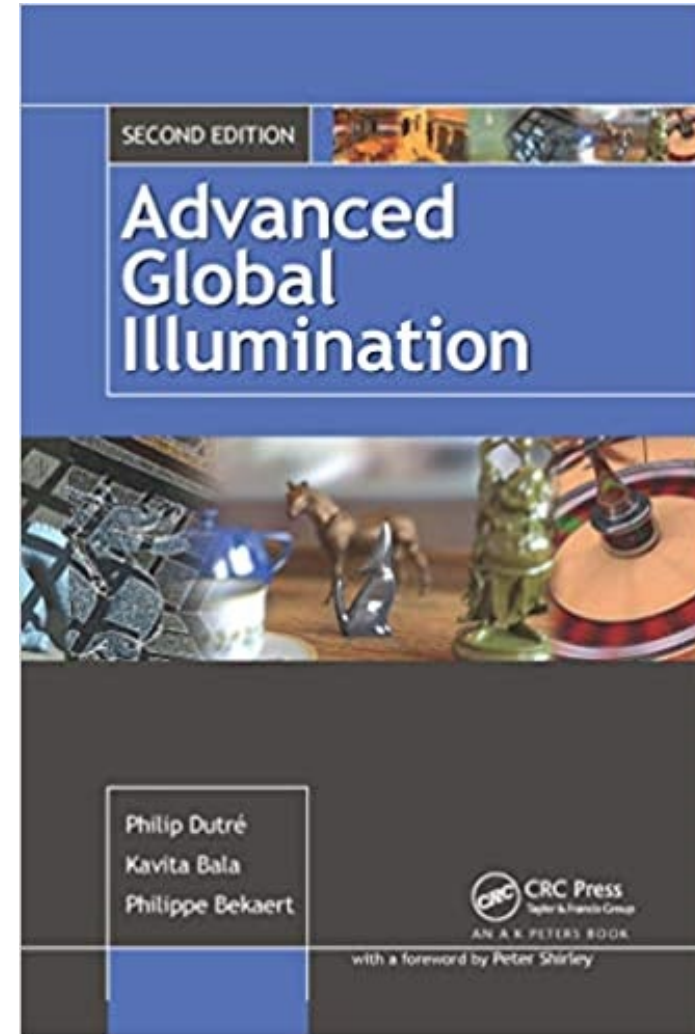
Peter Shirley's "Ray Tracing" series.

- Great reference material for first programming assignment.

# Books



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



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

# 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 15-462/15-662.
- A computational photography course at the level of 15-463/15-663/15-862.

# Pop quiz

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

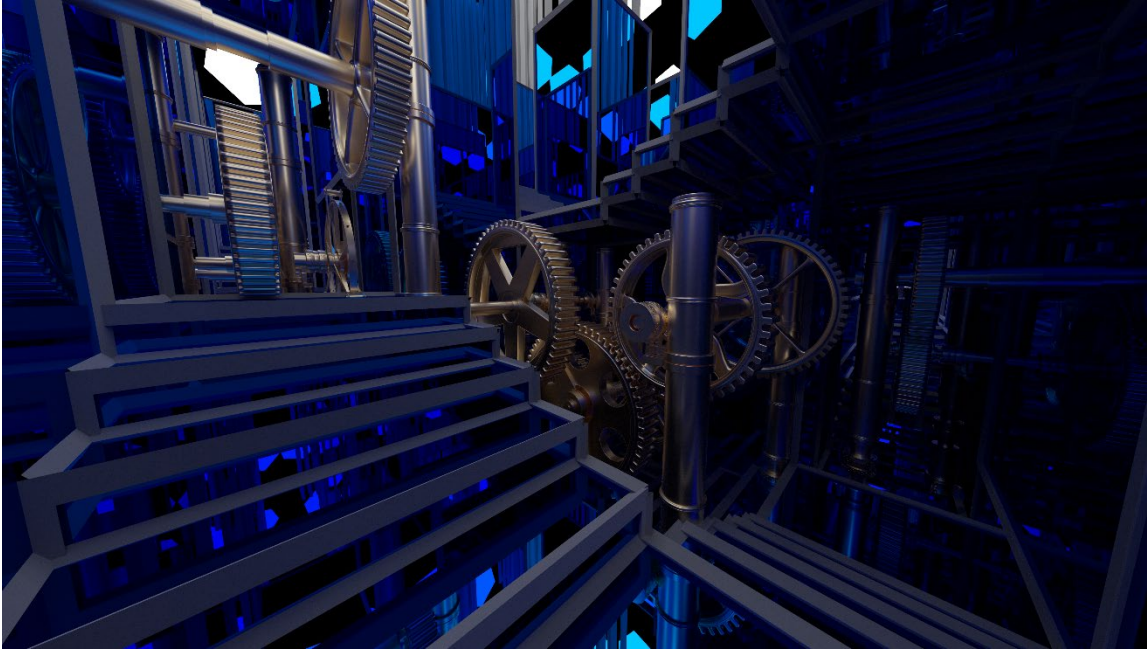
- Gaussian and box filtering.
- Convolution and Fourier transform.
- Aliasing and anti-aliasing.
- Homogeneous coordinates.
- Affine transforms and homographies.
- Pinhole, perspective, and orthographic camera.
- Triangular mesh.
- Ray-mesh intersections.
- Texture mapping.
- Radiometry and radiance.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

# Evaluation

- Four 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](#).
  - five late days, no more than three per assignment, 10% penalty per additional late day.
- 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 recitations.**
  - you can skip two out of ten quizzes without penalty.
- 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 towards the end of February.
  - 15-668, 15-868 require more substantive project.
  - **no exam, but final project presentations are during the exam period.**
- Class, Piazza, and Slack participation (5%):
  - be around for lectures, office hours, reading groups (lenient this semester).
  - participate in Piazza and Slack discussions.
  - ask questions and answer other people's questions.

Submission deadlines will be enforced strictly!

# Final project competition, Spring 2021



Technical award winner: Max Slater



Art award winner: Arpit Agarwal

- All of last year's final projects:
  - presentations - [https://docs.google.com/presentation/d/1qeFYNXn3Z\\_pbmVTCtEUOtU8JGy1v8zeaQ9MIUJgCP-8/edit](https://docs.google.com/presentation/d/1qeFYNXn3Z_pbmVTCtEUOtU8JGy1v8zeaQ9MIUJgCP-8/edit)
  - renderings - [http://graphics.cs.cmu.edu/courses/15-468/2021\\_spring/rendering\\_competition.html](http://graphics.cs.cmu.edu/courses/15-468/2021_spring/rendering_competition.html)

# Rendering competitions elsewhere

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](#).

# Wednesday recitations

- Every Wednesday, there will be a recitation, where we go over the solutions to that week's take-home quiz.
- Typically, recitations take the form of whiteboard derivations, and free-form discussion.
- **Participation is completely optional.** Recitations will be recorded.
- Time will be decided by vote in the start-of-semester survey.



# Friday reading groups

- Every second Friday, there will be a reading group to cover in detail an advanced topic selected by students and instructors.
- Typically, reading groups take the form of a review of a group of papers, whiteboard derivations, and free-form discussion.
- **Participation is completely optional.** Reading groups will be recorded.
- Time will be decided by vote in the start-of-semester survey.
- Topics covered last year: specular next-event estimation, Metropolis light transport, optimal multiple importance sampling, ReSTIR, BRDF acquisition, path guiding, transmittance, neural field representations.

# 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 vote in the start-of-semester survey.
  - office hours will be in person at the Smith Hall (EDSH) graphics lounge (by through Zoom until January 31<sup>st</sup>).
  - feel free to email Yannis about additional office hours.
  - you can also just drop by Yannis' office (Smith Hall (EDSH) Rm 225) after January 31<sup>st</sup>.
  - 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.

# This course is still highly experimental!

- Second 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.

# Please take the start-of-semester survey!

- Posted on Piazza as well:

[https://docs.google.com/forms/d/e/1FAIpQLSdZONUsOzpfkLGTcpuc8nIHRx7EkVIL\\_yGzXZt5xdwTsDlzxw/viewform](https://docs.google.com/forms/d/e/1FAIpQLSdZONUsOzpfkLGTcpuc8nIHRx7EkVIL_yGzXZt5xdwTsDlzxw/viewform)