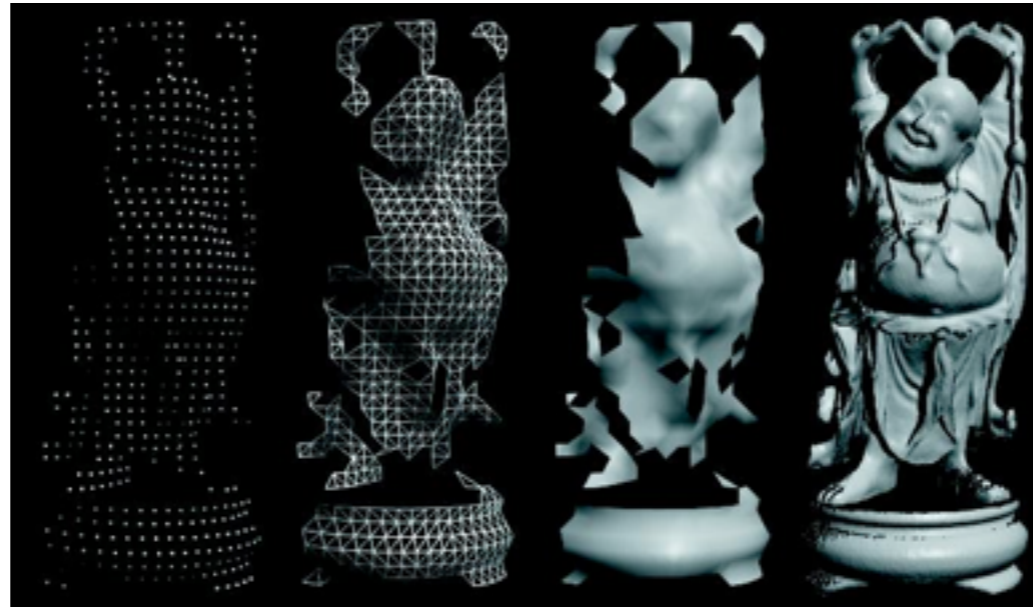


*Spring 2015*

# CSCI 599: **Digital Geometry Processing**



## 4.1 **3D Scanning**



Hao Li

<http://cs599.hao-li.com>

# Administrative

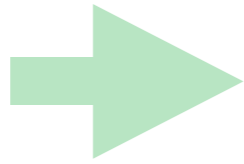
- **Exercise 2:** next tuesday after surface registration



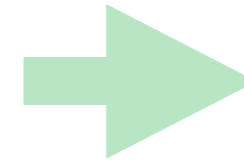
# 2D Imaging Pipeline



2D capture



2D processing/editing

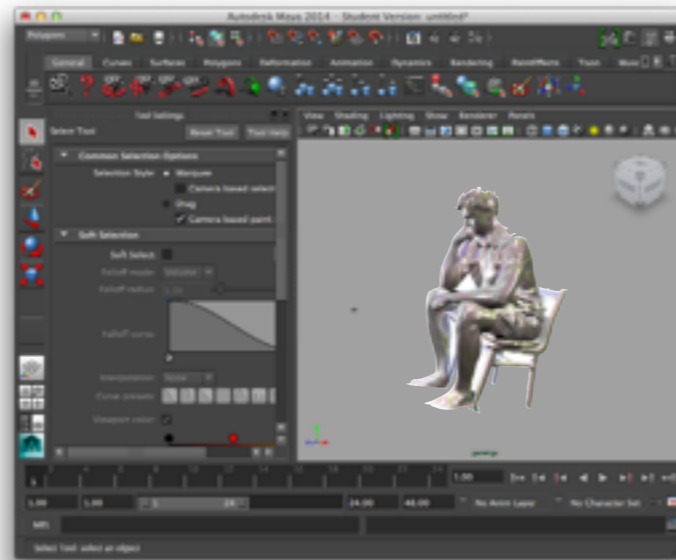
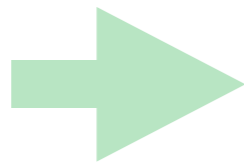


2D printing

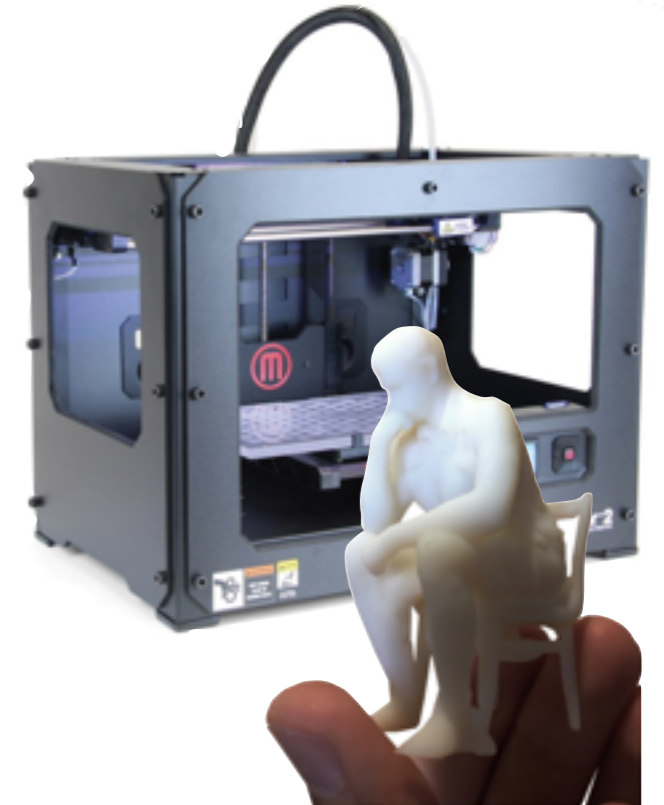
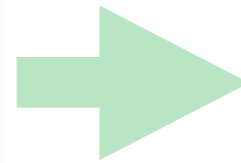
# 3D Scanning Pipeline



3D scanning



3D processing/editing



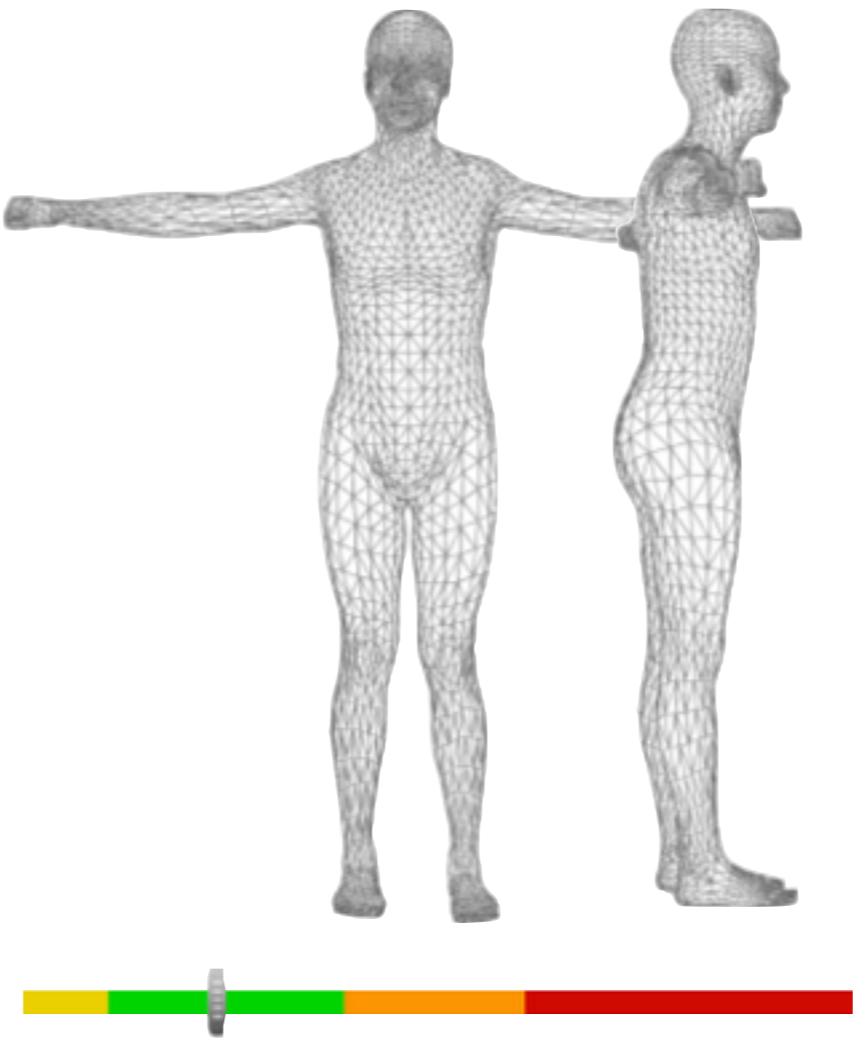
3D printing



# Applications



entertainment



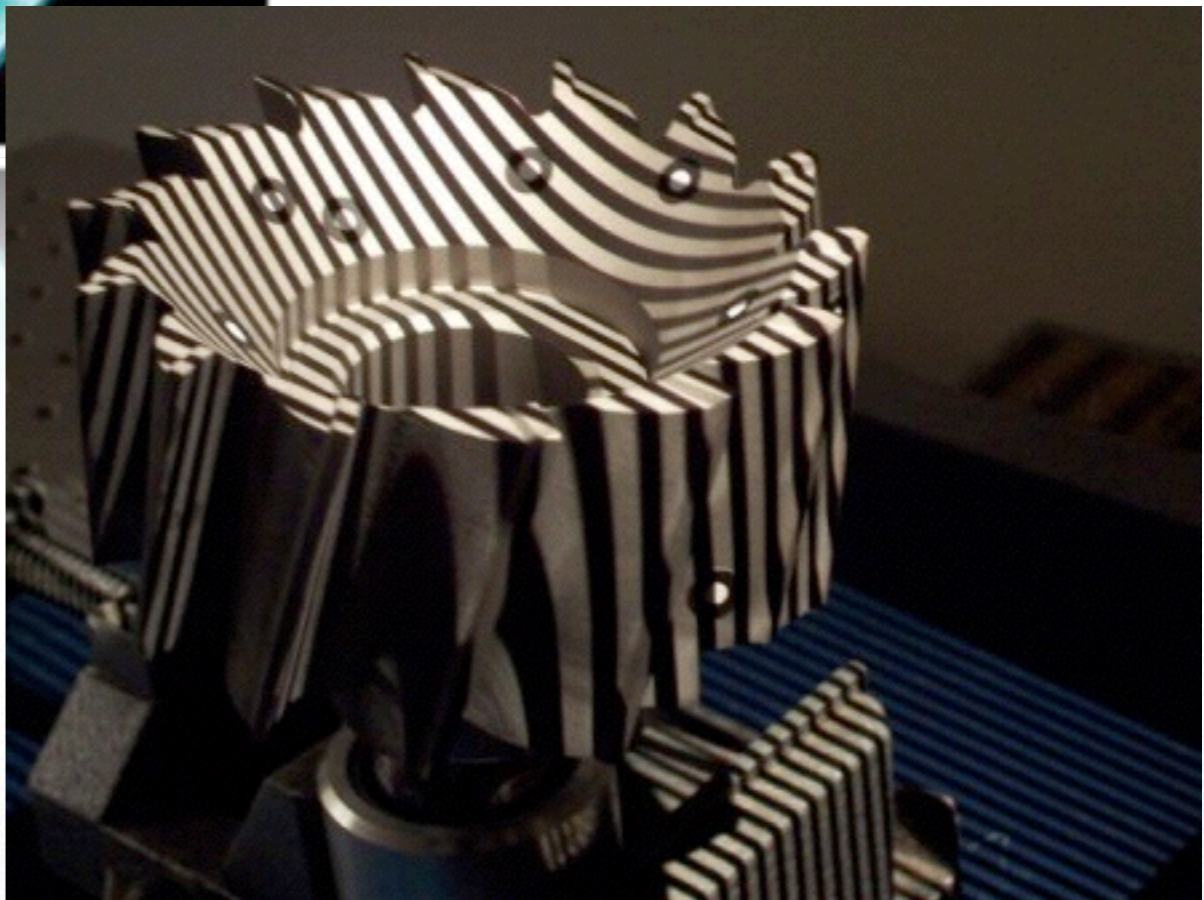
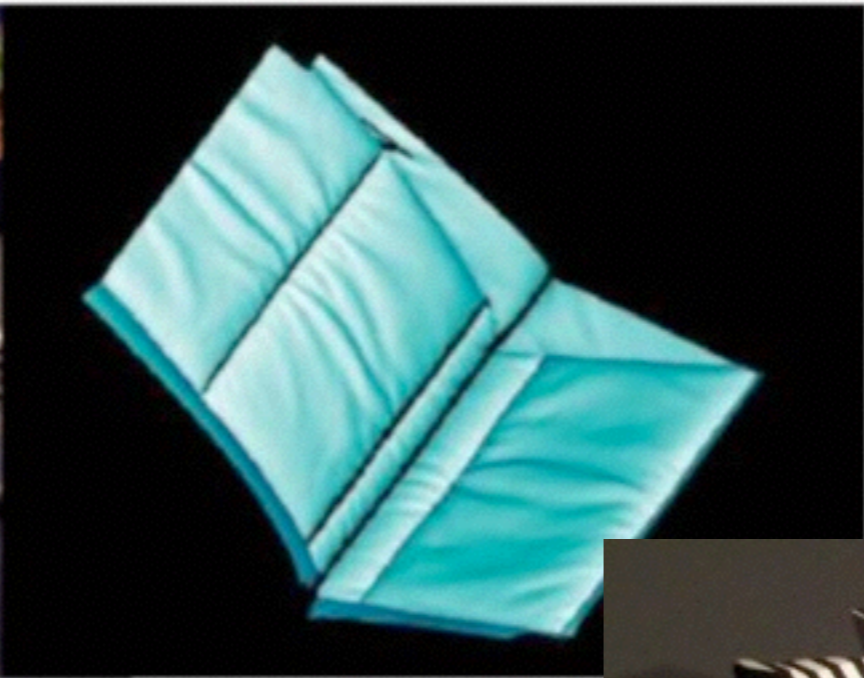
fitness



digital garment

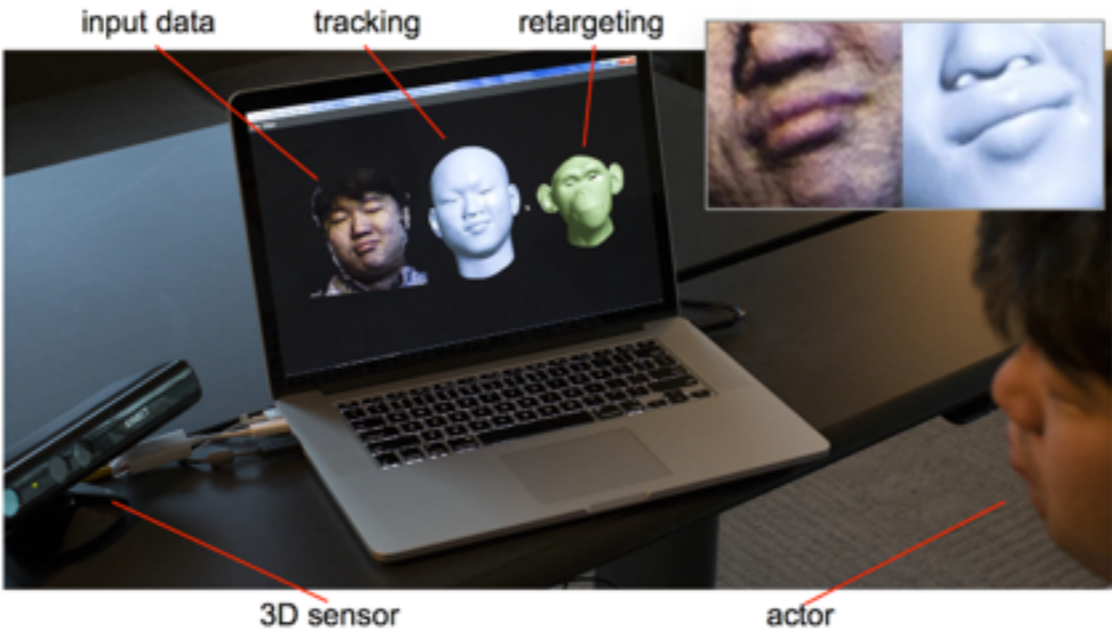
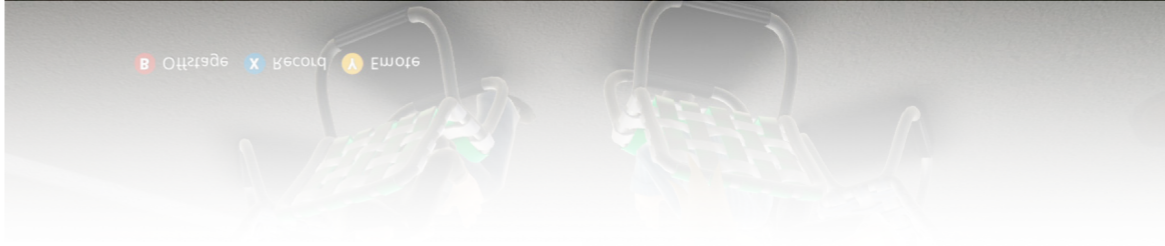


# Applications





# Applications





# Applications: Personalized Games





# Digital Michelangelo Project



1G sample points → 8 M triangles



4G sample points → 8 M triangles



# Commercialization





# Democratization



# 3D Self-Portraits





# Surface Reconstruction Pipeline



physical  
model



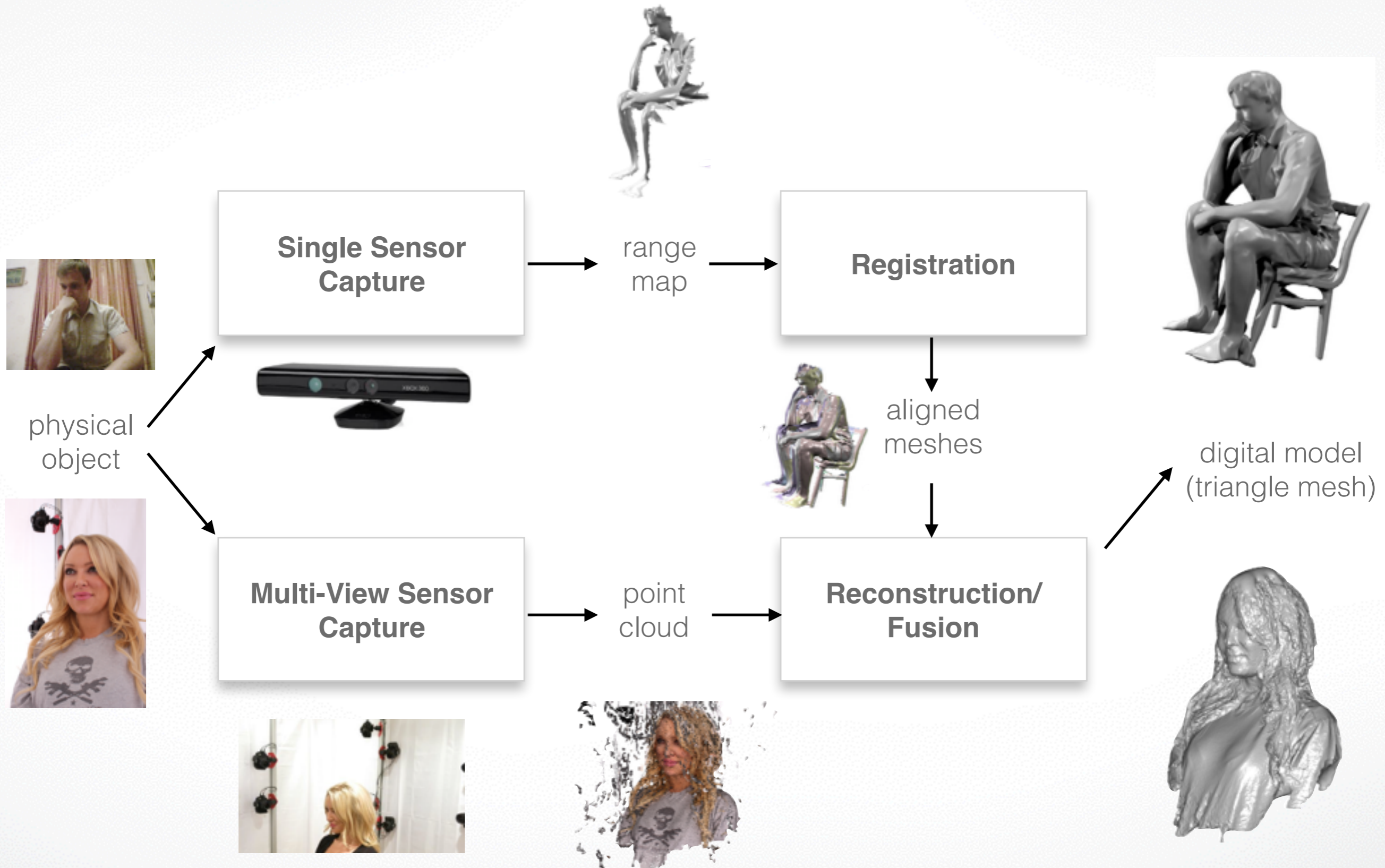
acquired  
point cloud



digitized  
model

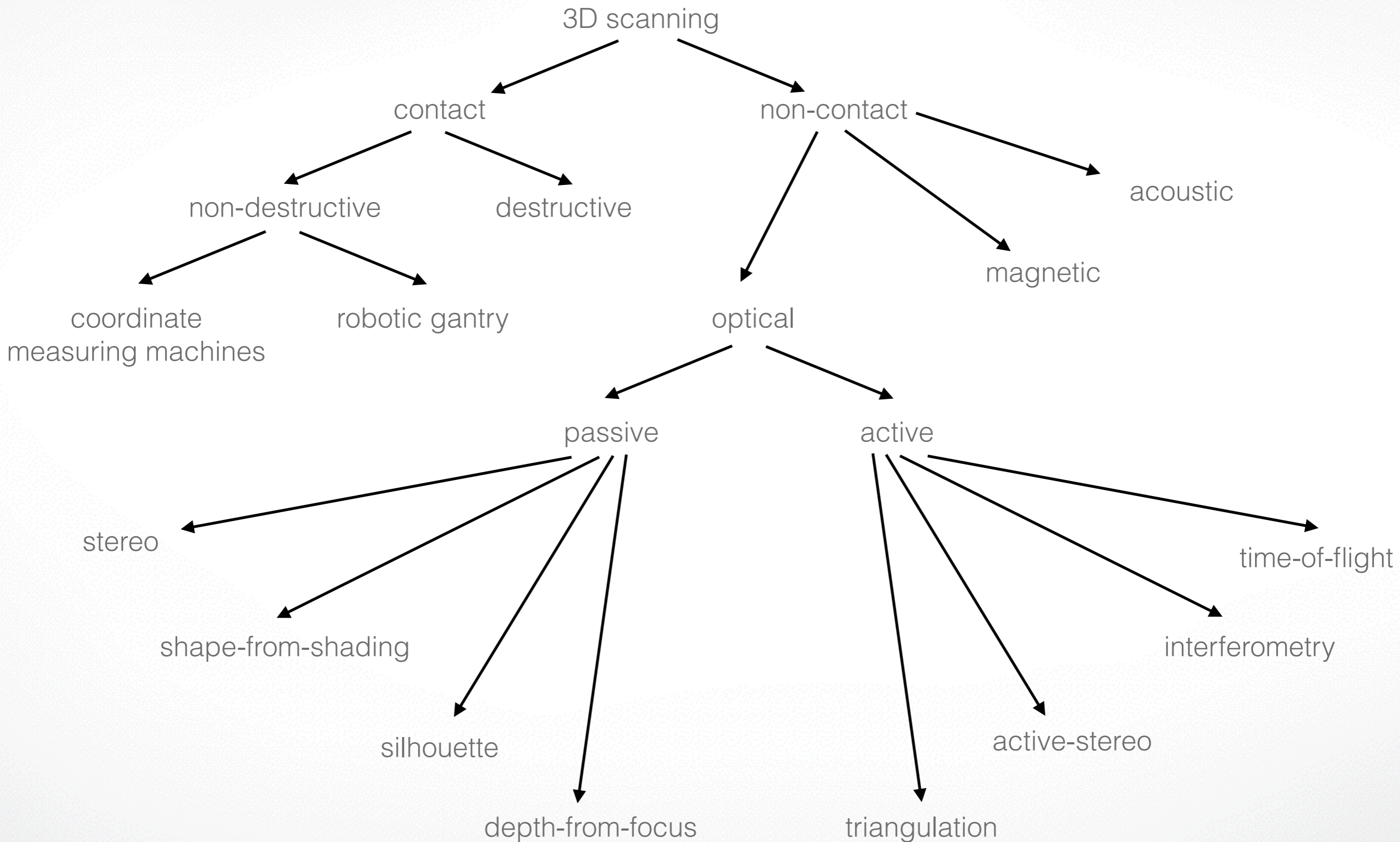


# Two Digitization Approaches



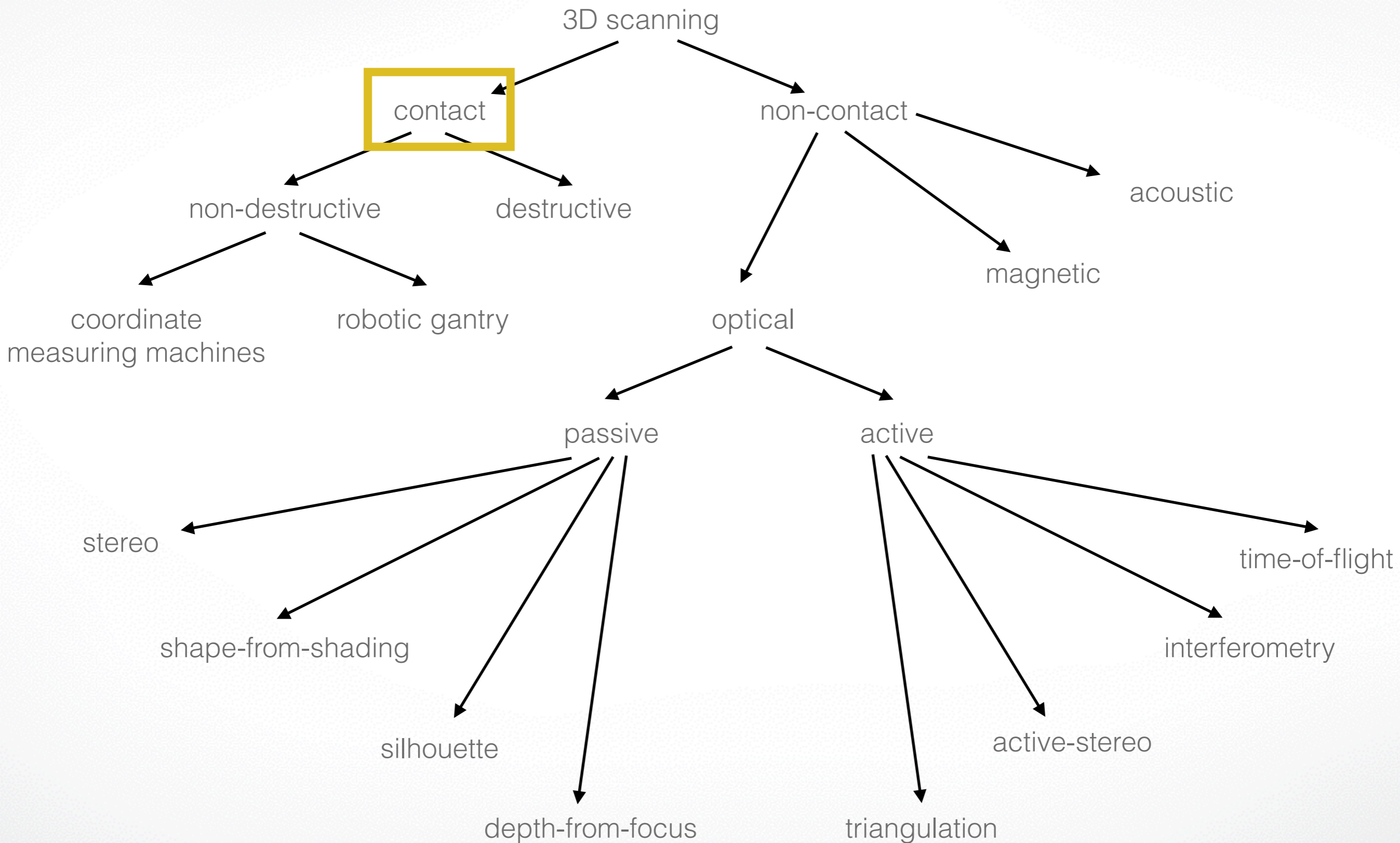


# 3D Scanning Taxonomy



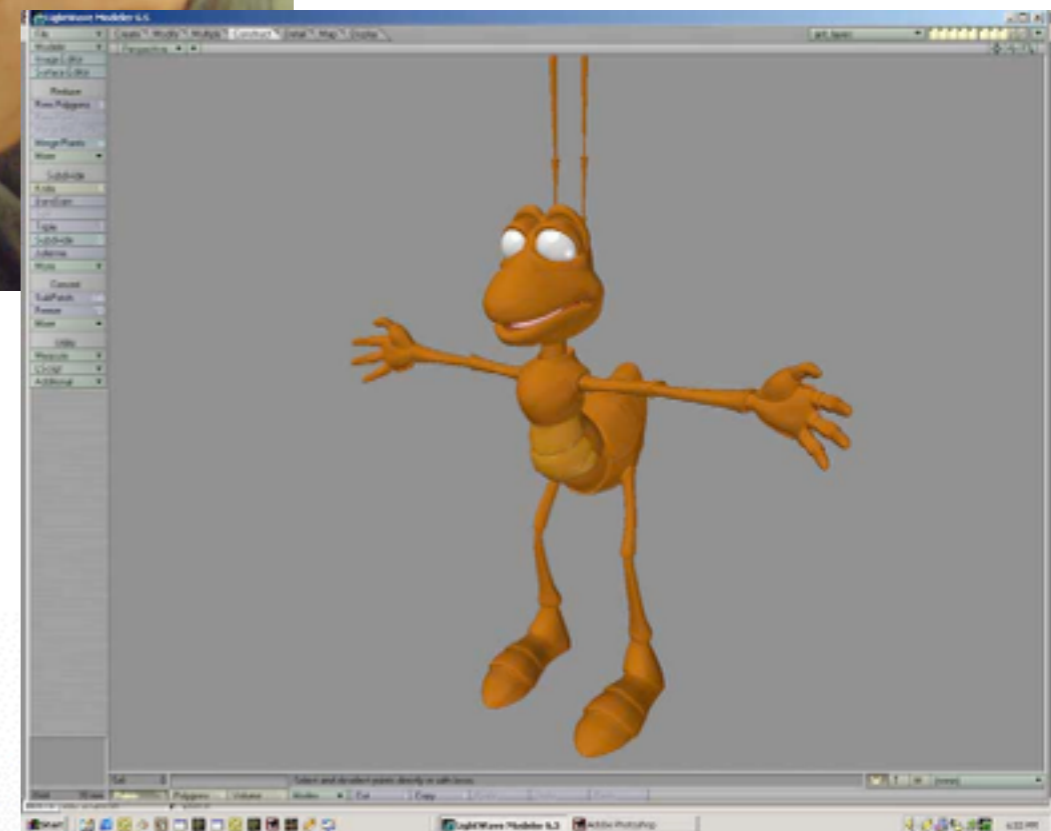
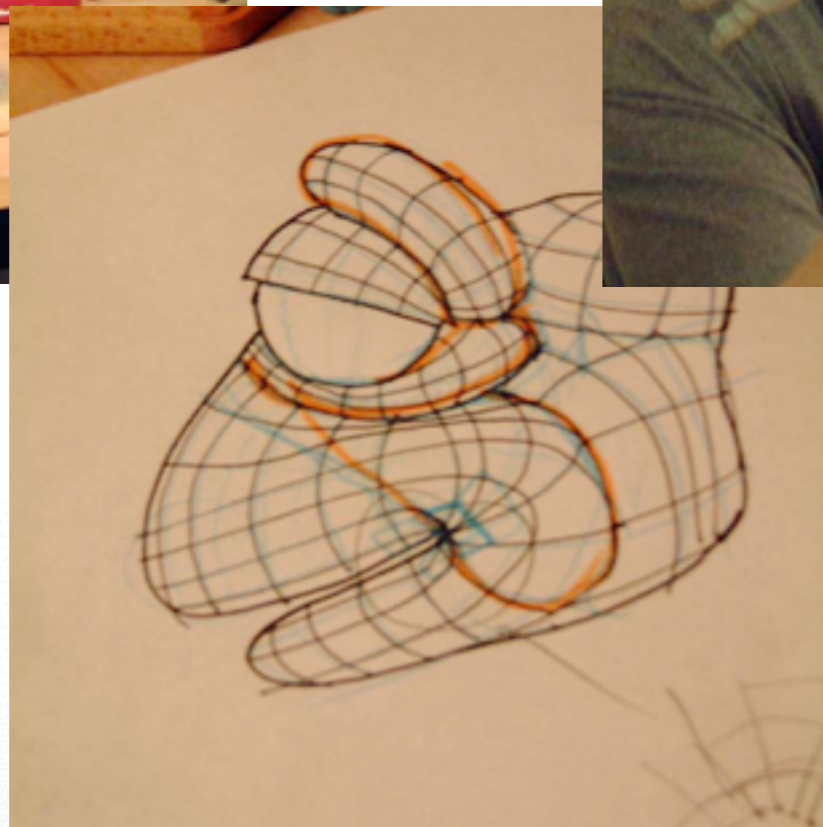
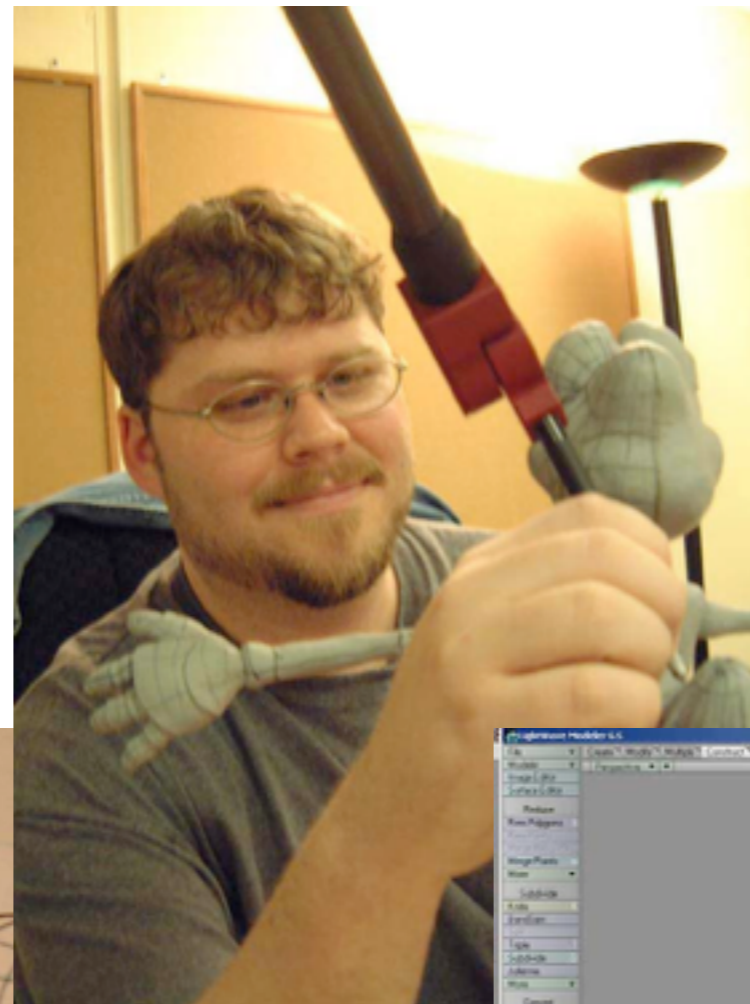


# 3D Scanning Taxonomy





# Contact Scanners



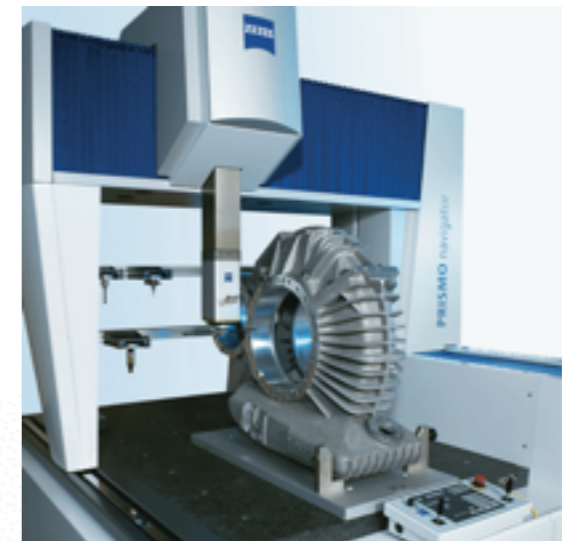
[Immersion Microscribe, Magnetic Dreams]



# Contact Scanners

## Probe object by physical touch

- used in manufacturing control
- highly accurate
- reflectance independent (transparency!)
- slow scanning, sparse set of samples
- for rigid and non-fragile objects



[Zeiss]



# Contact Scanners

## Probe object by physical touch

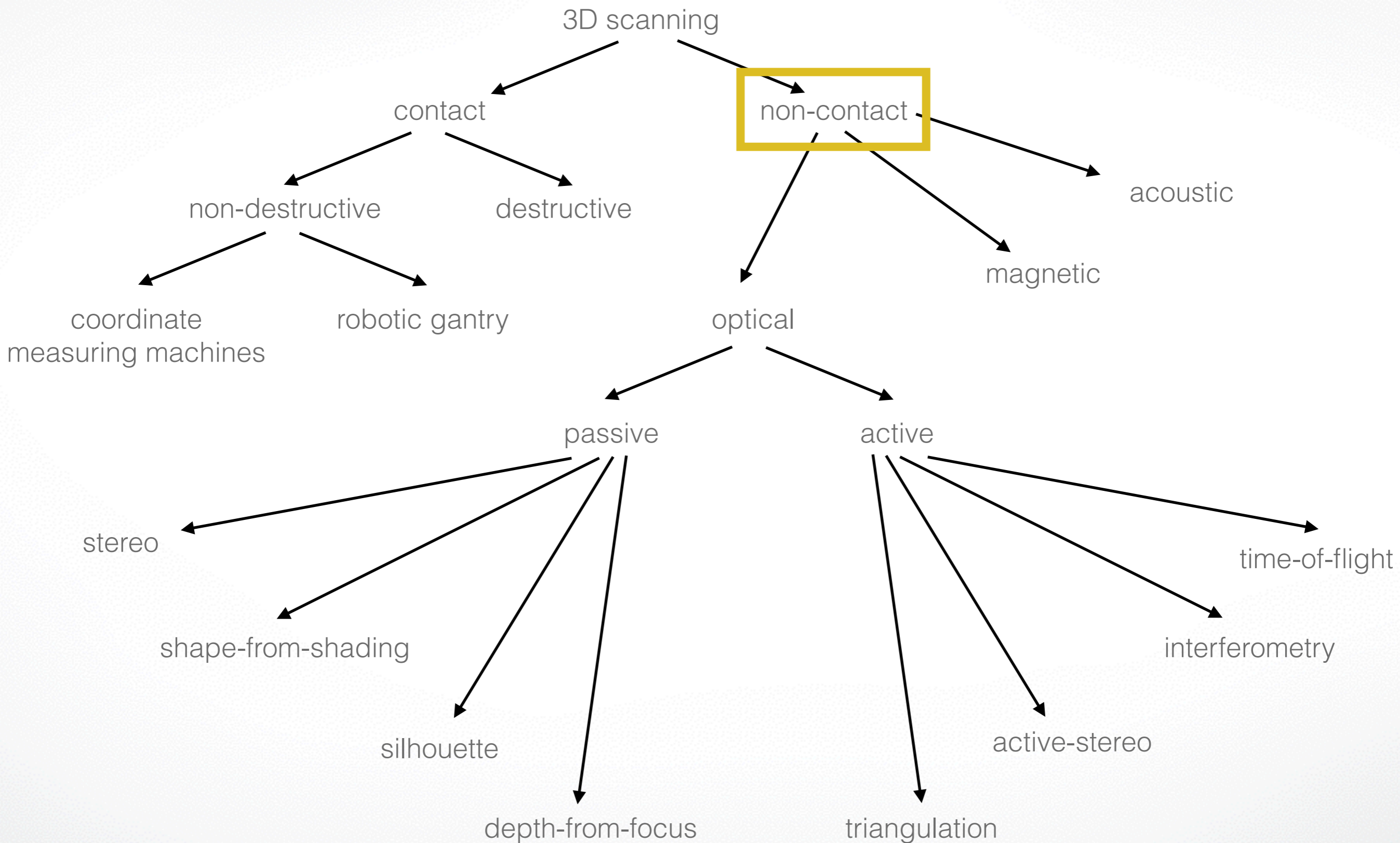
- hand-held scanners
- less accurate
- slow scanning, sparse set of samples



[Immersion Microscribe]



# 3D Scanning Taxonomy





# Non-Contact

## Advantages

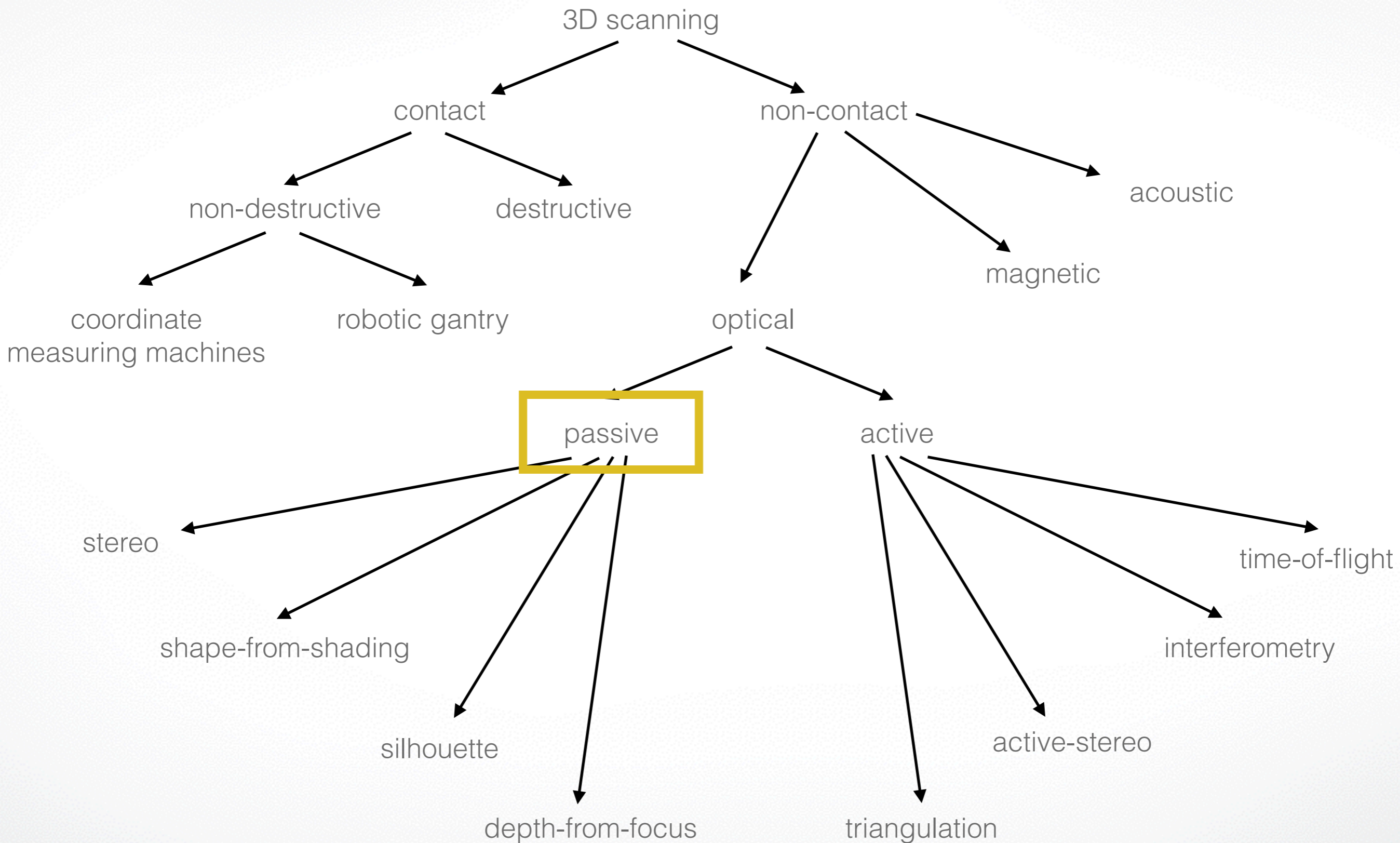
- longer and safer distance capture
- potentially faster acquisition
- more automated

## Optical Approaches

- most relevant and used (no special hardware requirements)
- highly flexible
- most accurate
- **passive** and **active** approaches



# 3D Scanning Taxonomy



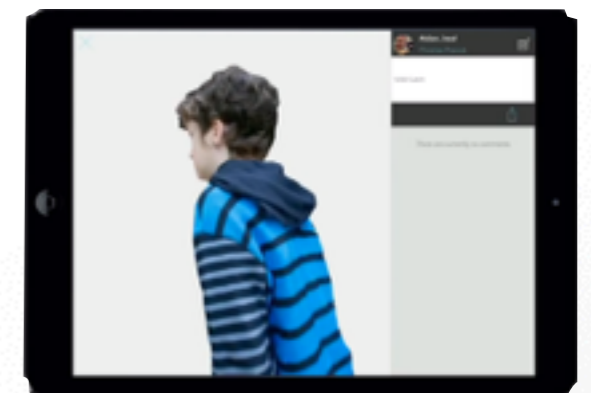


# Passive

- exclusively based on **sensor(s)**
- computer vision-driven (stereo, multi-view stereo, structure from motion, scene understanding, etc.)
- main challenges: **occlusions** and **correspondences**
- typically assumes a **2D manifold** with **Lambertian reflectance**

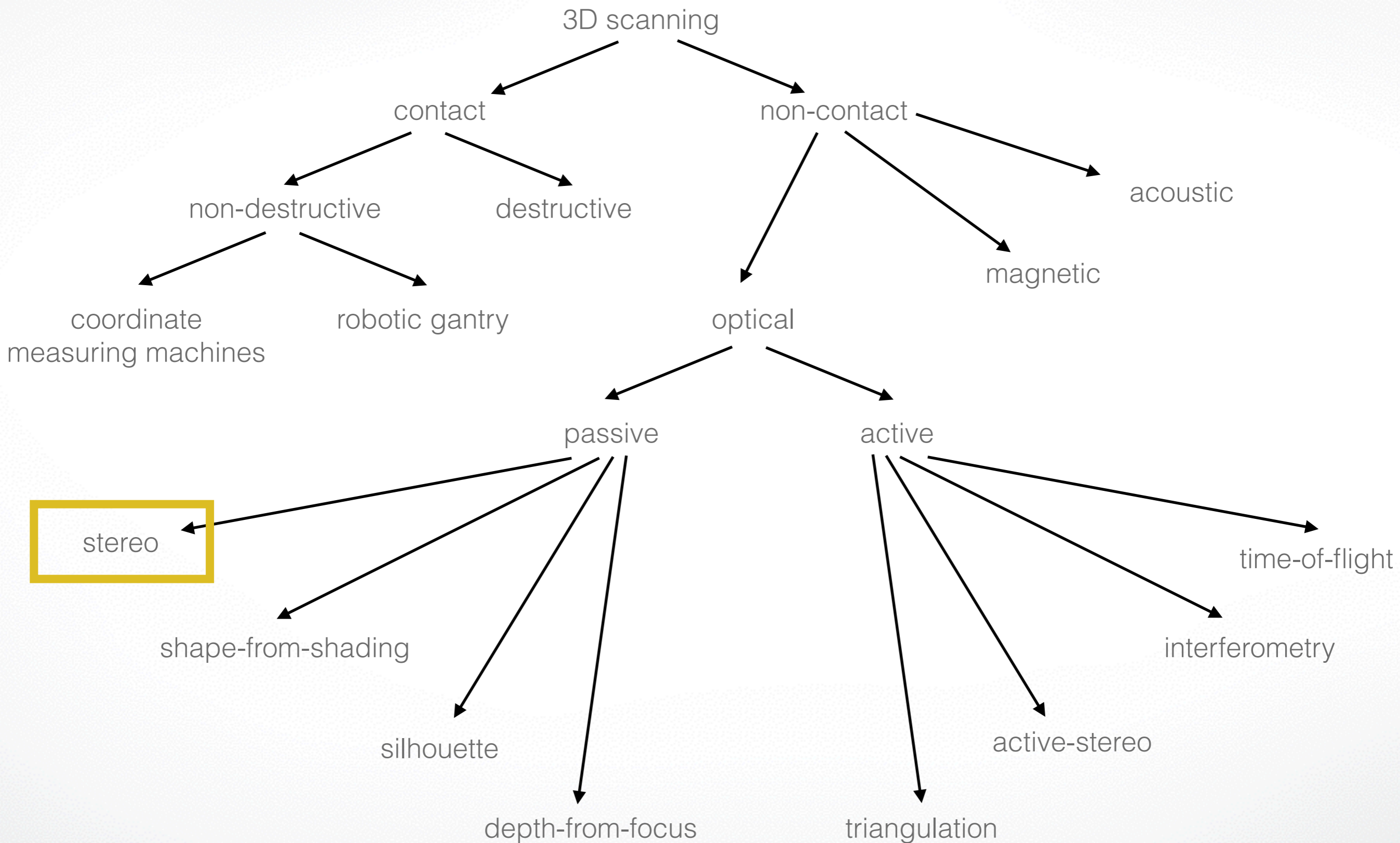


Autodesk 123D Catch



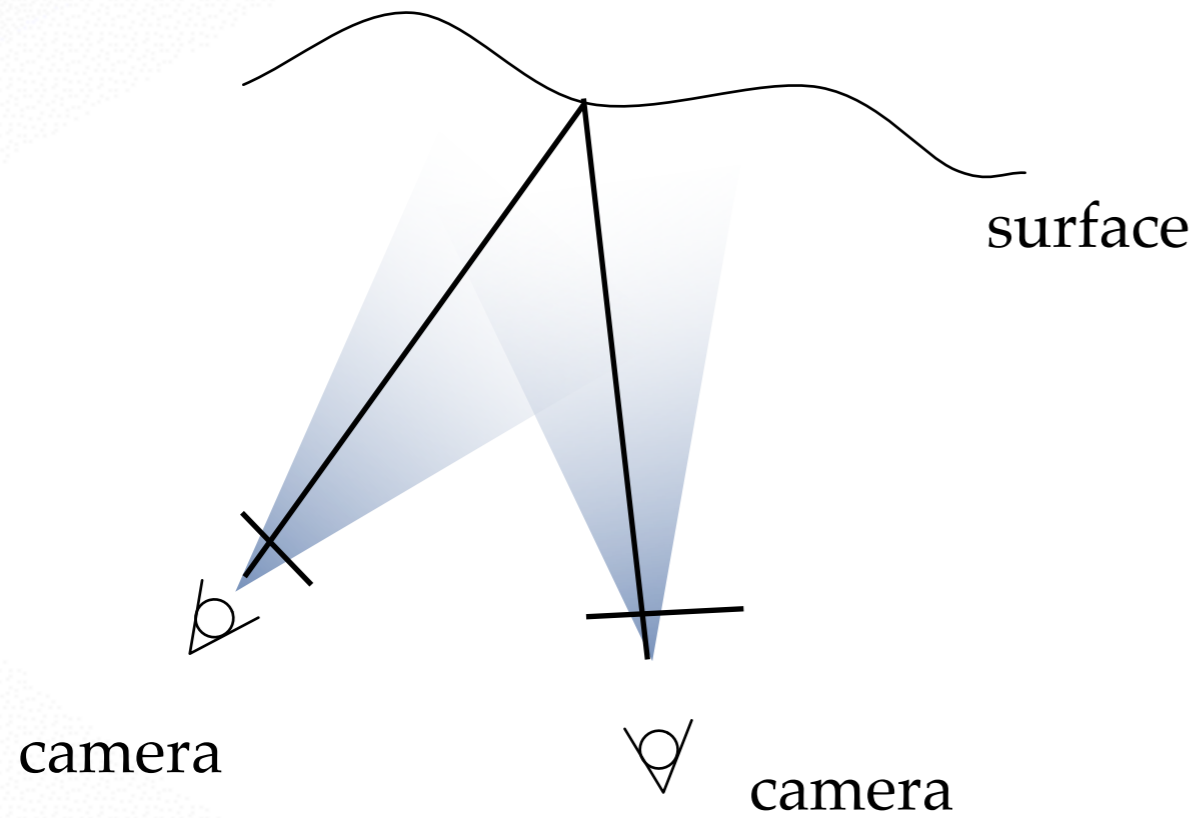


# 3D Scanning Taxonomy





# Stereo

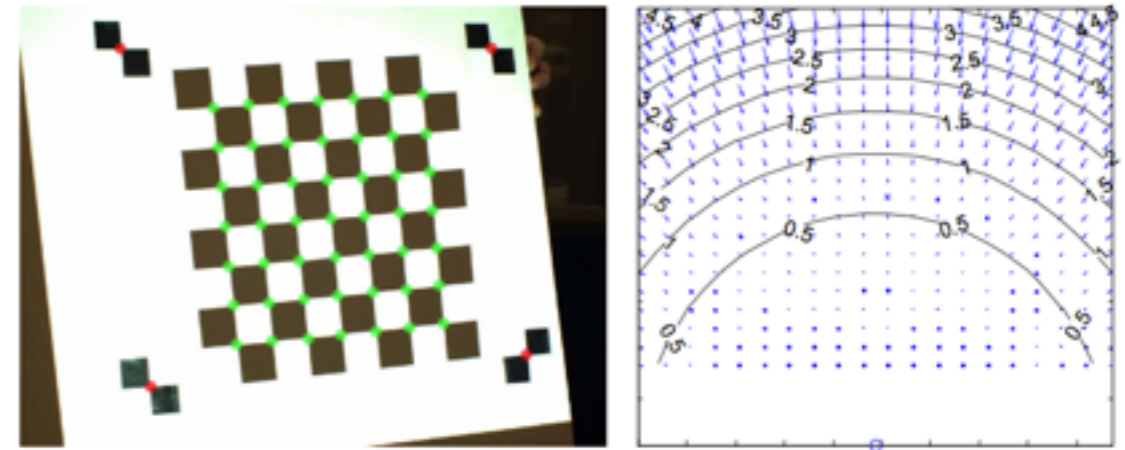
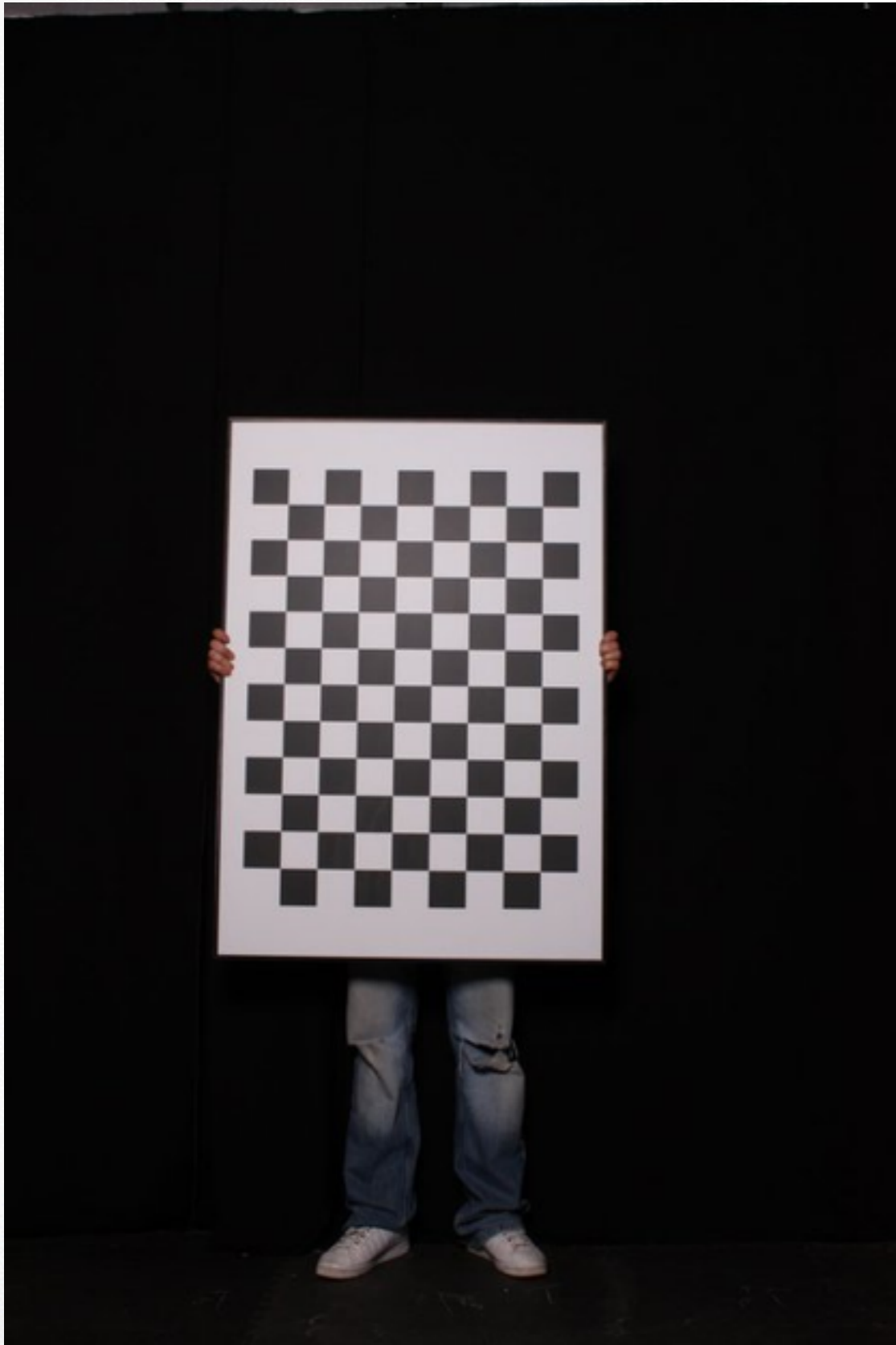


triangulation



image rectification

# Calibration



extrinsics and intrinsics (pinhole model)      lens distortion

camera calibration toolbox



# Stereo



input



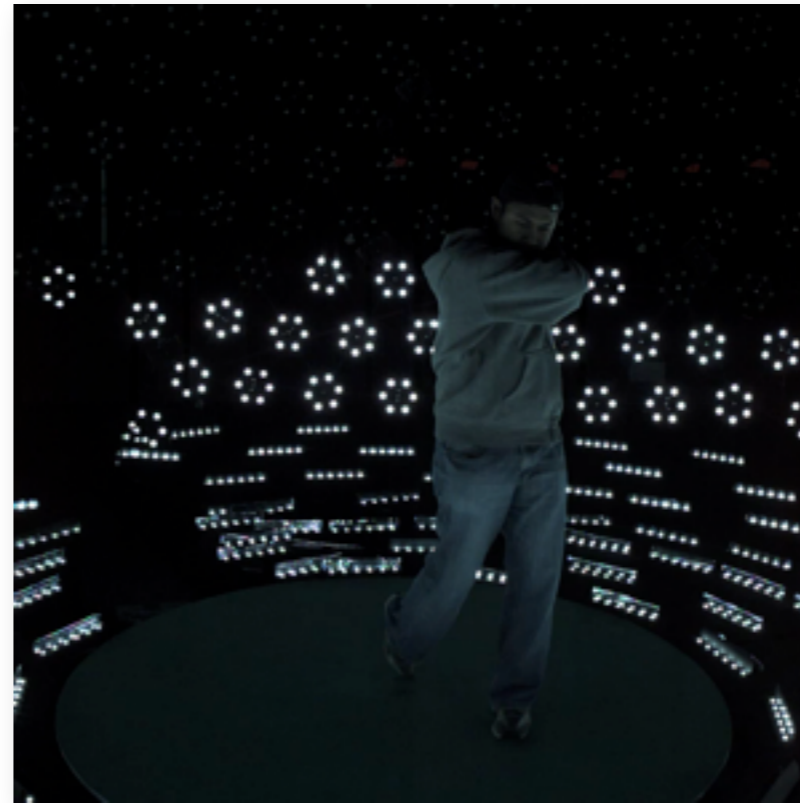
output



# Multi-View Stereo



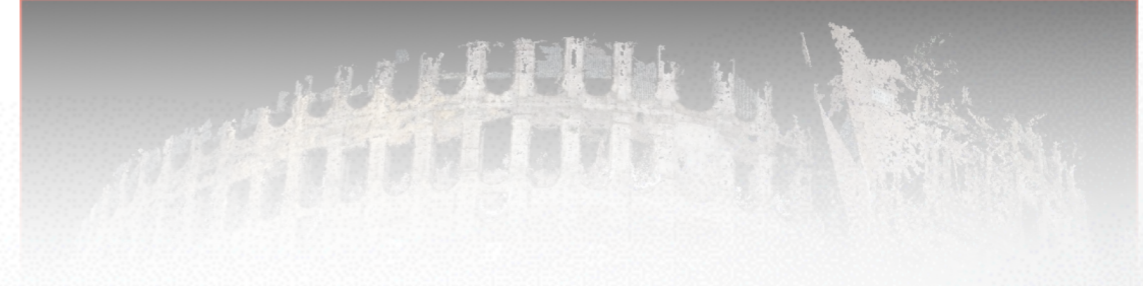
multi-view stereo



multi-view photometric stereo



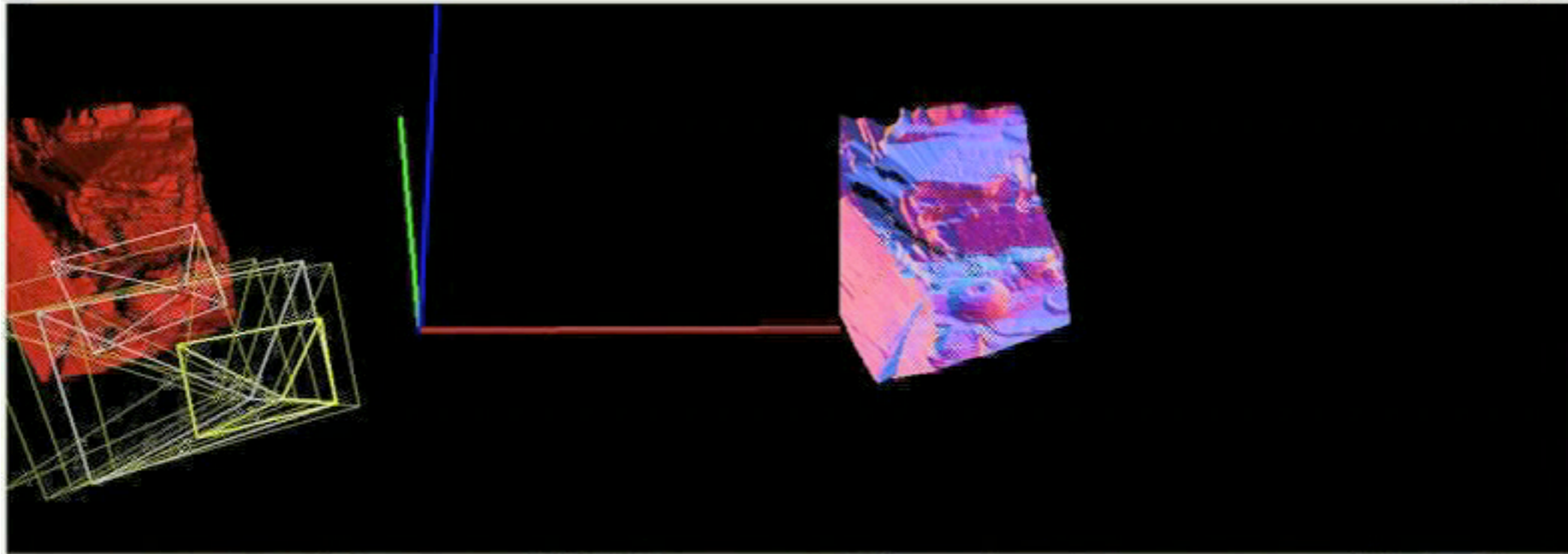
# Multi-View Stereo





# Dense Structure from Motion

As the camera browses the scene, local reconstruction results are fused, live, into the global surface model.

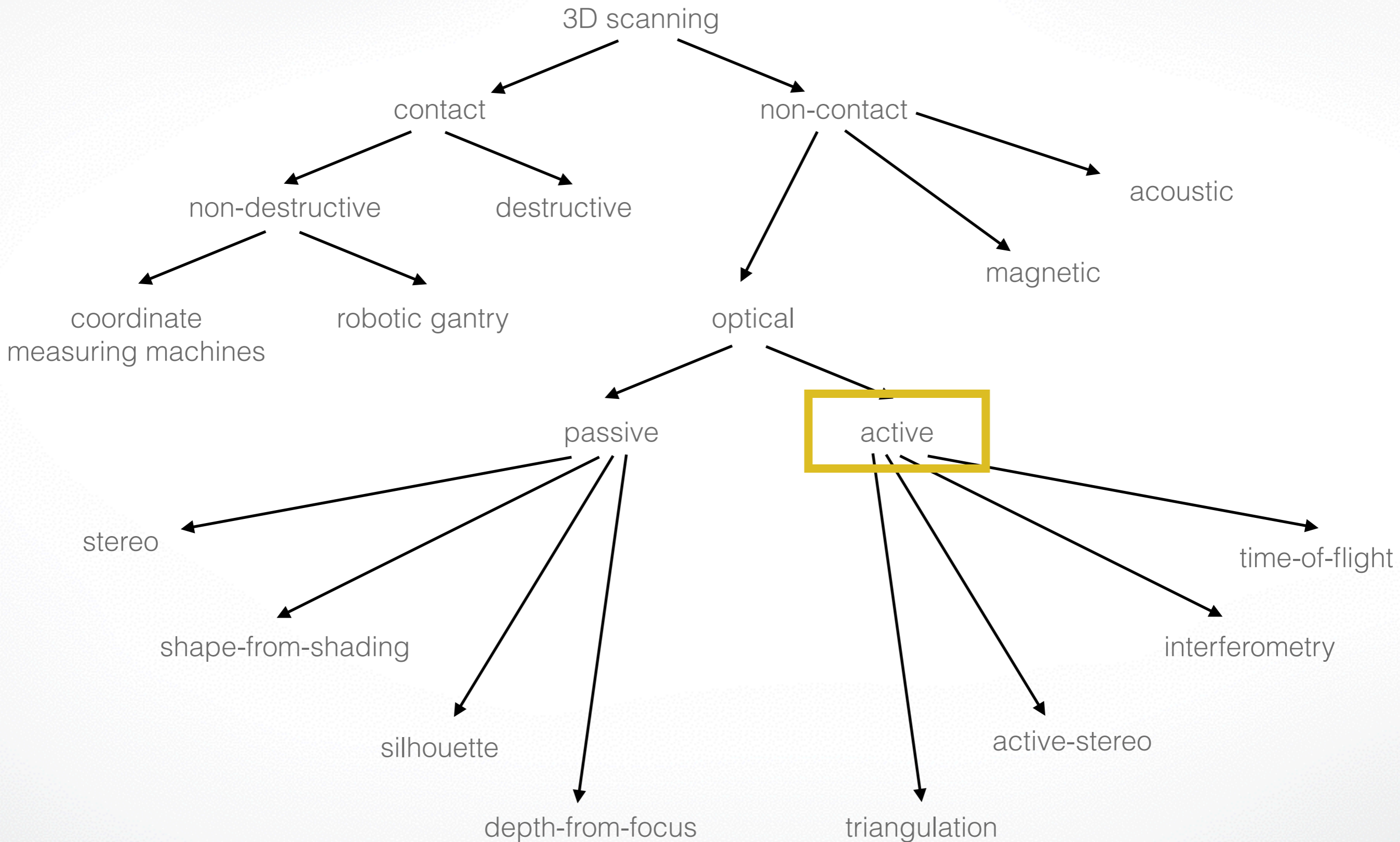


Fused local  
reconstructions

Surface normal  
rendering



# 3D Scanning Taxonomy

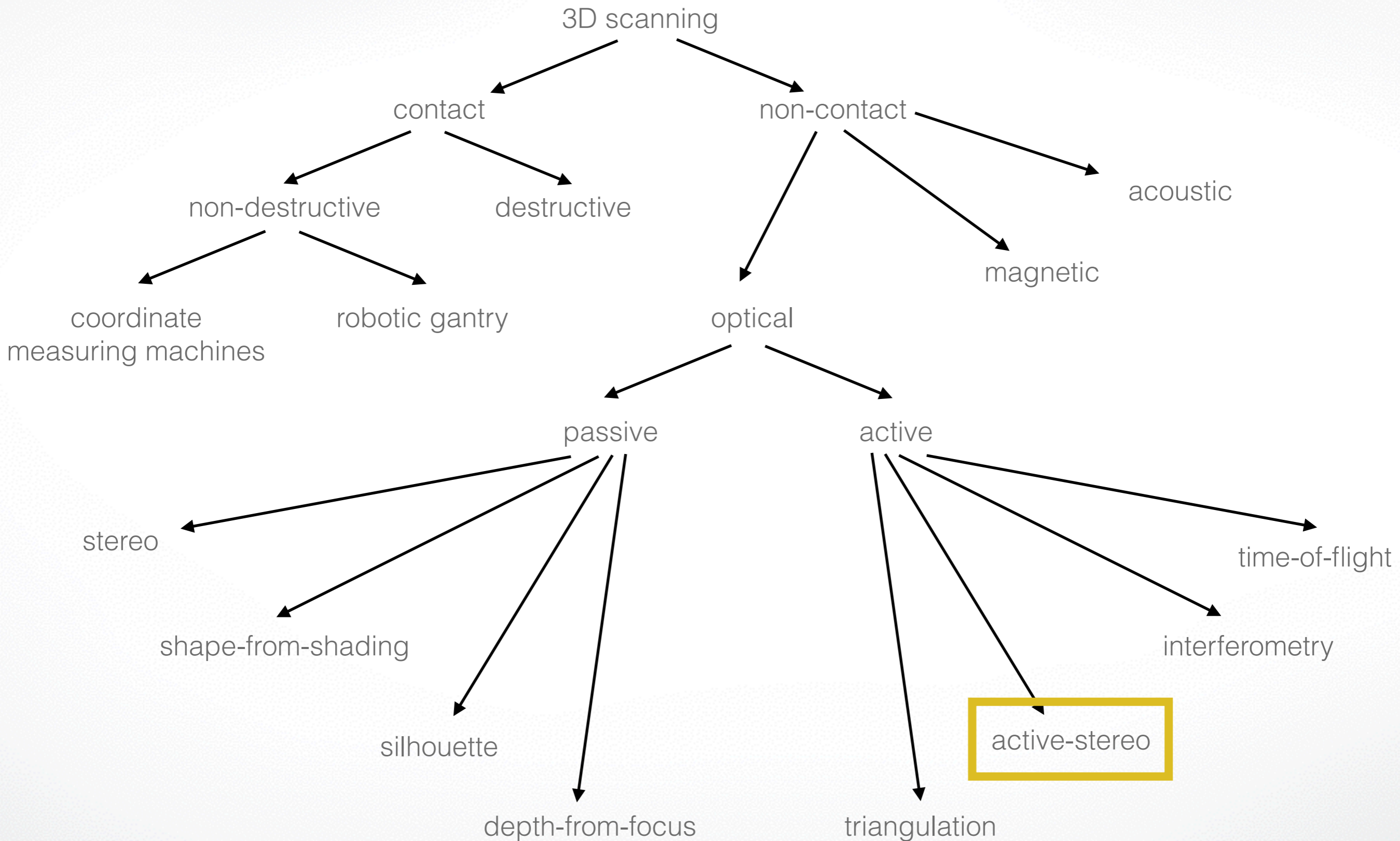


# Active

- based on **sensor** and **emitter** (controlled EM wave)
- influence of surface reflectance to emitted signal
- **correspondence** problem simplified (via known signal) → less computation (realtime?)
- examples (laser, structured light, photometric stereo)
- high resolution and dense capture possible, even for texture poor regions
- more sensitive to surface reflection properties (mirrors?)



# 3D Scanning Taxonomy





# Active Stereo

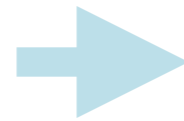




# Photometric Stereo

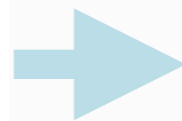


Lightstage 6 (USC-ICT)



8 Normal Maps / Frame

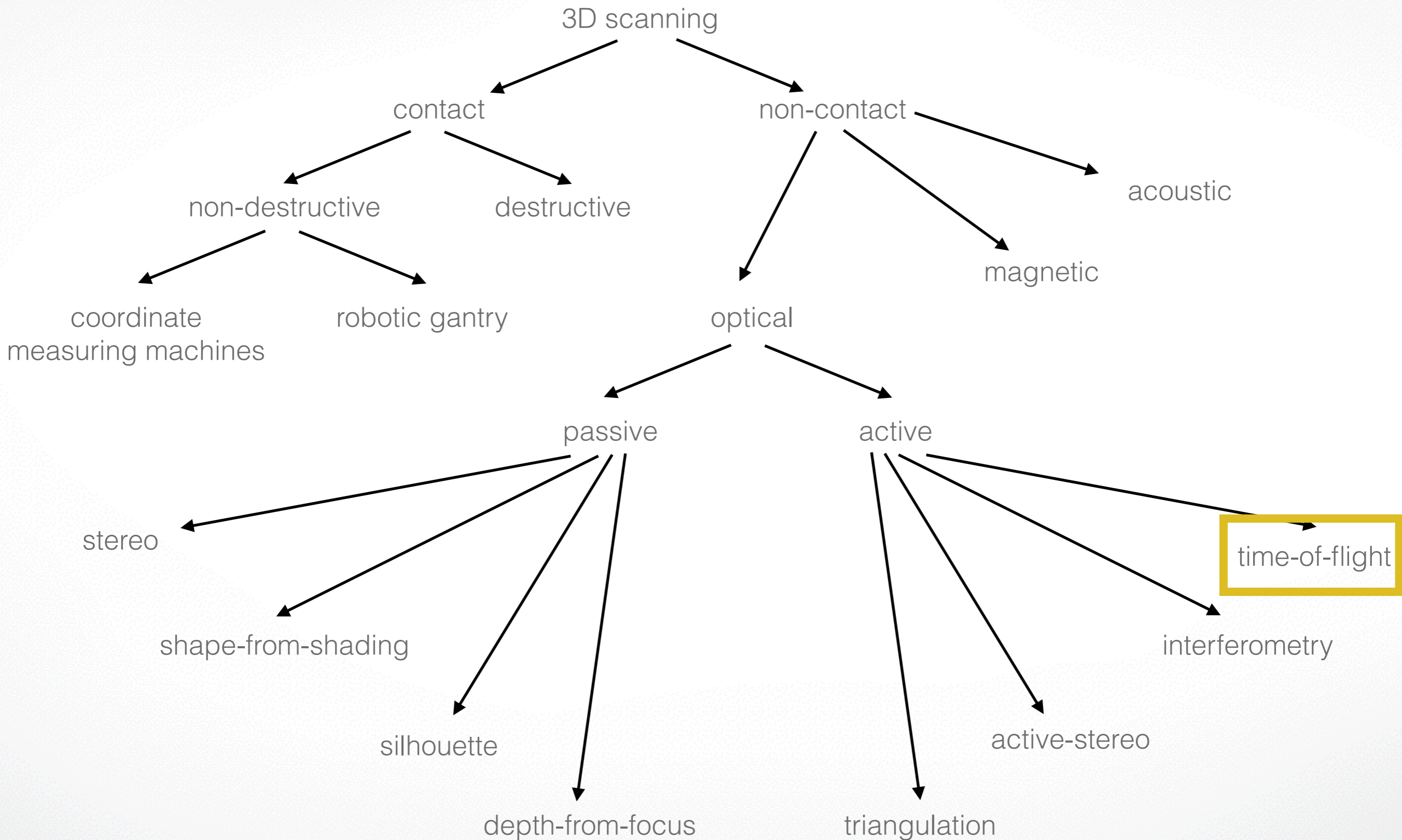
# Photometric Stereo



Integrated surfaces



# 3D Scanning Taxonomy



# Time-of-Flight Cameras

## Probe object by laser or infrared light

- Emit pulse of light, measure time till reflection from surface is seen by a detector
- Known speed of light & round-trip time allows to compute distance to surface

## Laser LIDAR

- **L**ight **D**etection **a**nd **R**anging
- Good for long distance scans
- 6mm accuracy at 50 m distance



[Leica]



# Time-of-Flight Cameras

## Probe object by laser or infrared light

- Emit pulse of light, measure time till reflection from surface is seen by a detector
- Known speed of light & round-trip time allows to compute distance to surface

## Infrared light

- 176x144 pixels, up to 50 fps
- 30 cm to 5 m distance
- 1 cm accuracy
- technology is improving drastically



[Mesa Imaging]

# Kinect One

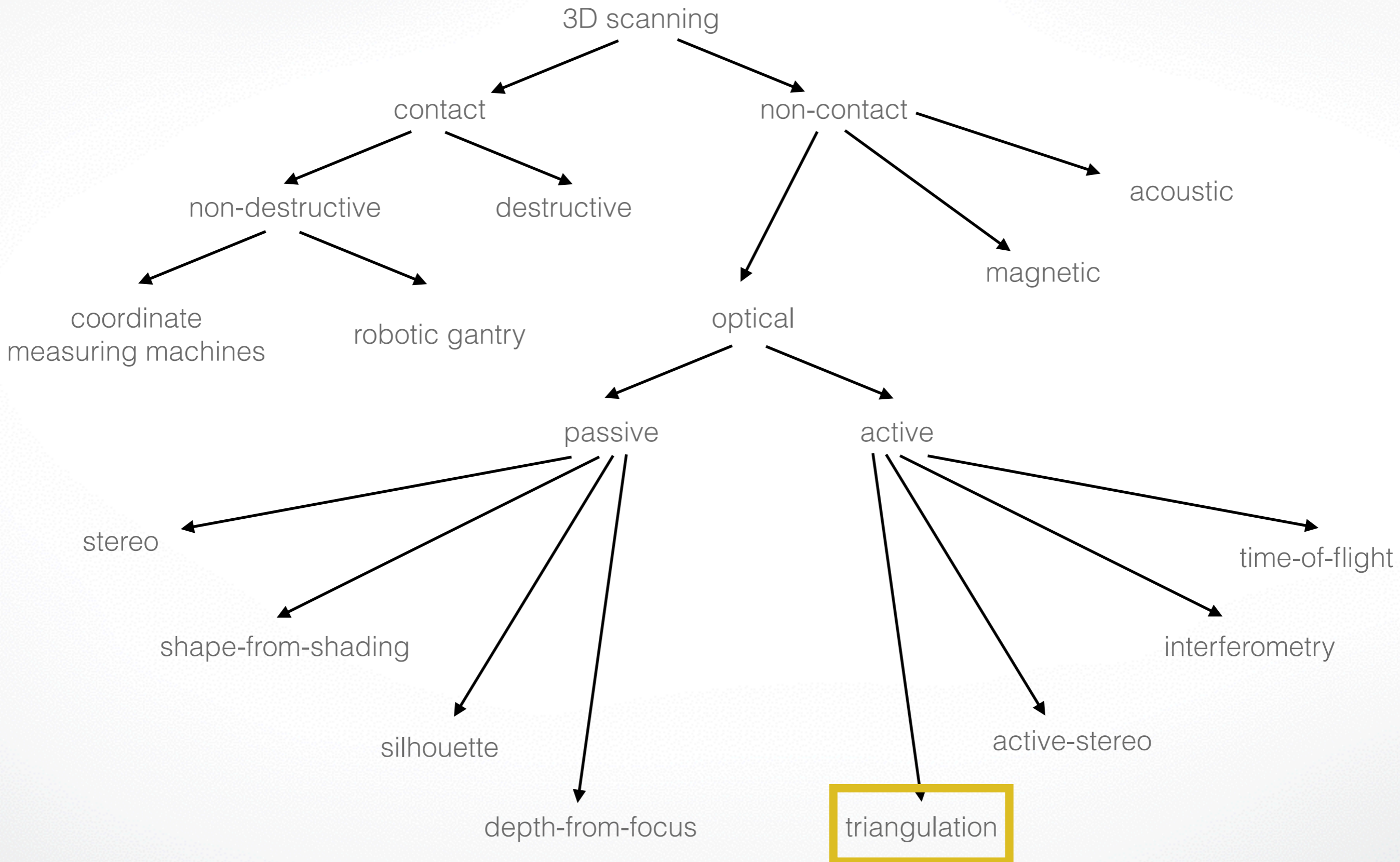
## Kinect One (= second gen Kinect)

- Time-of-Flight Technology
- 30 fps
- Depth map x/y resolution: 512 x 424
- z-resolution 1 mm & accuracy:
  - < 1.5 mm (depth < 50 cm)
  - < 3.9 mm (depth < 180 cm)
  - < 17.6 mm (depth < 450 cm)
- 1080 HD for RGB input
- uses Kinect2 SDK





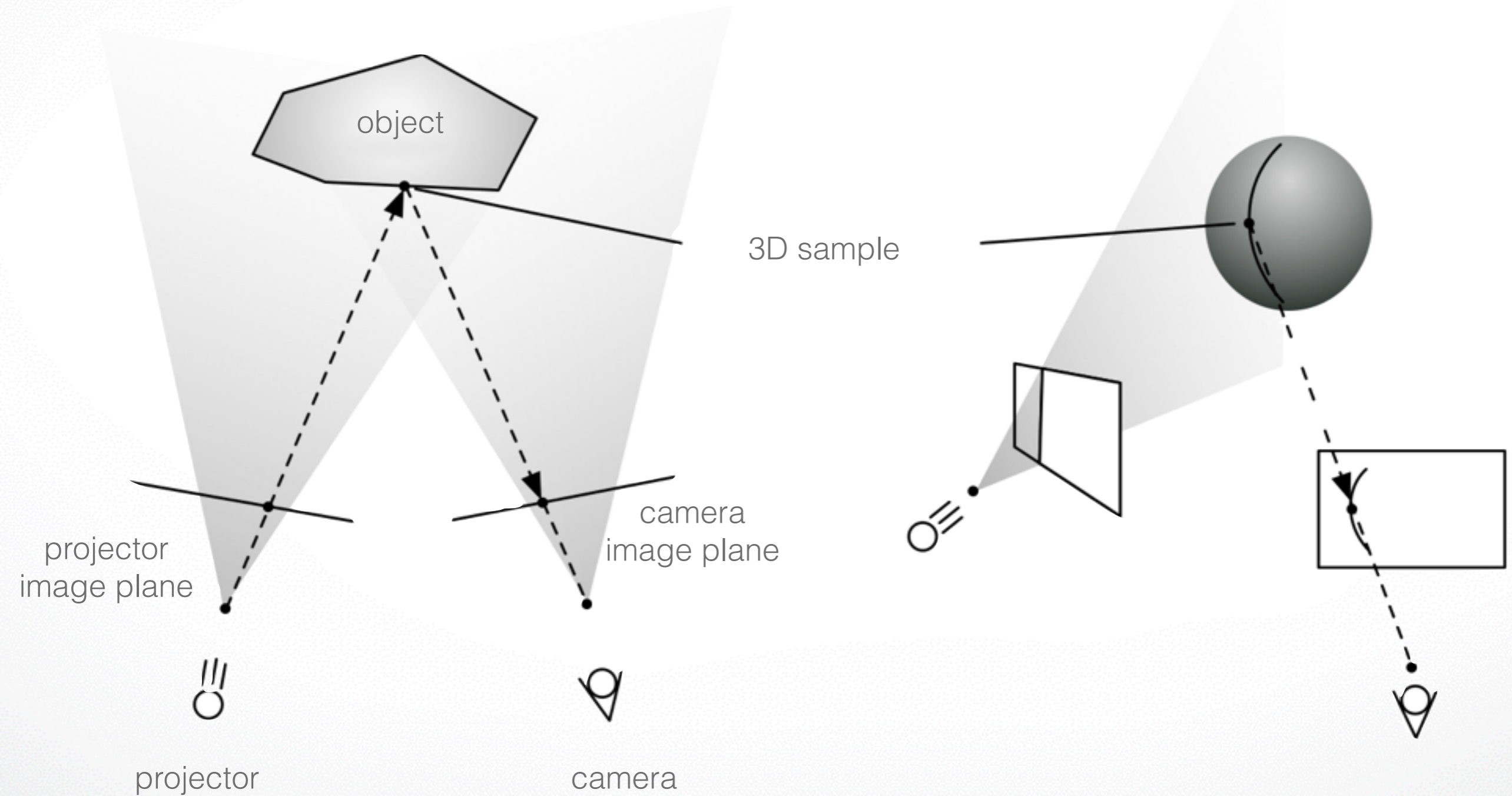
# 3D Scanning Taxonomy



# Optical Triangulation

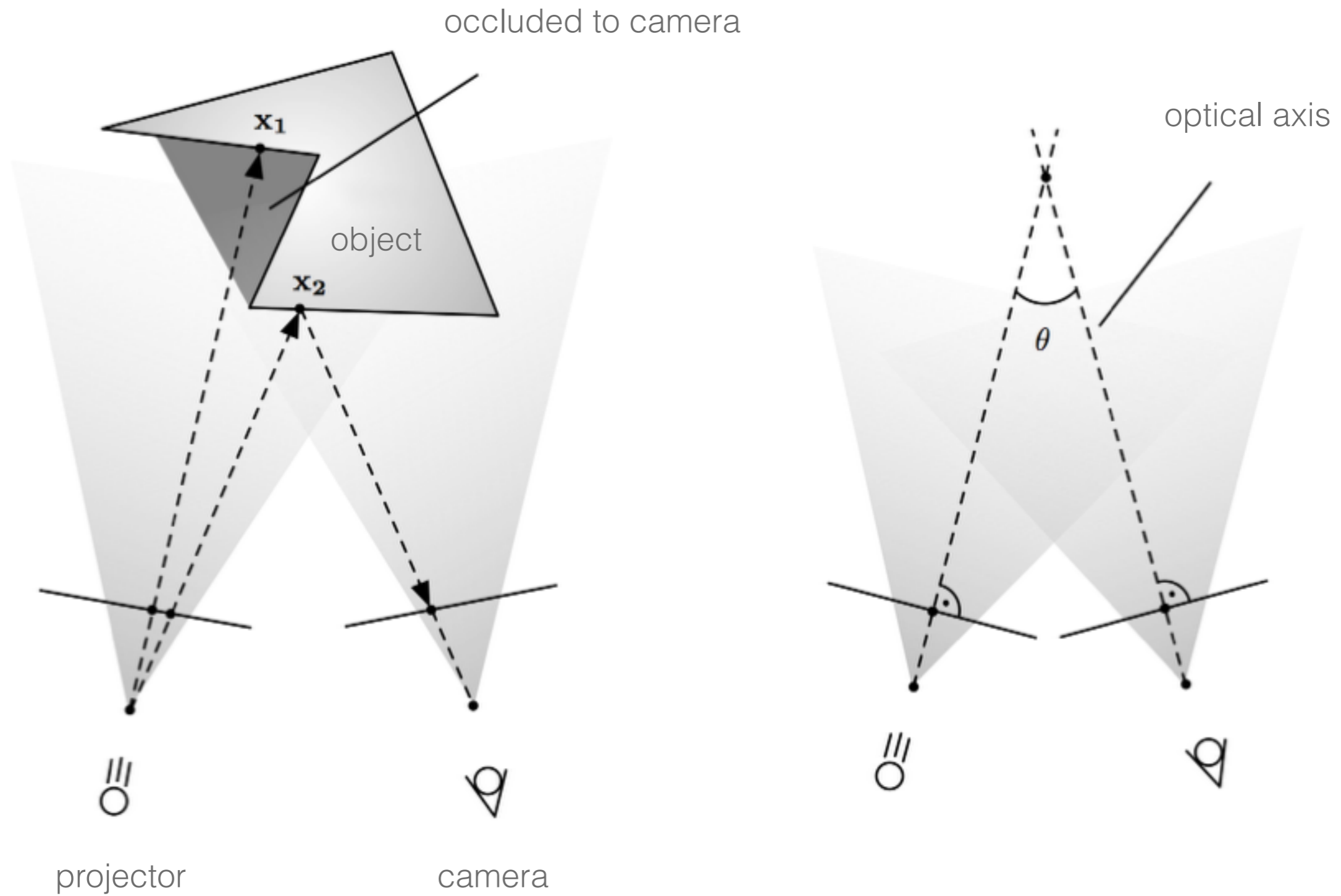
2D View

3D View

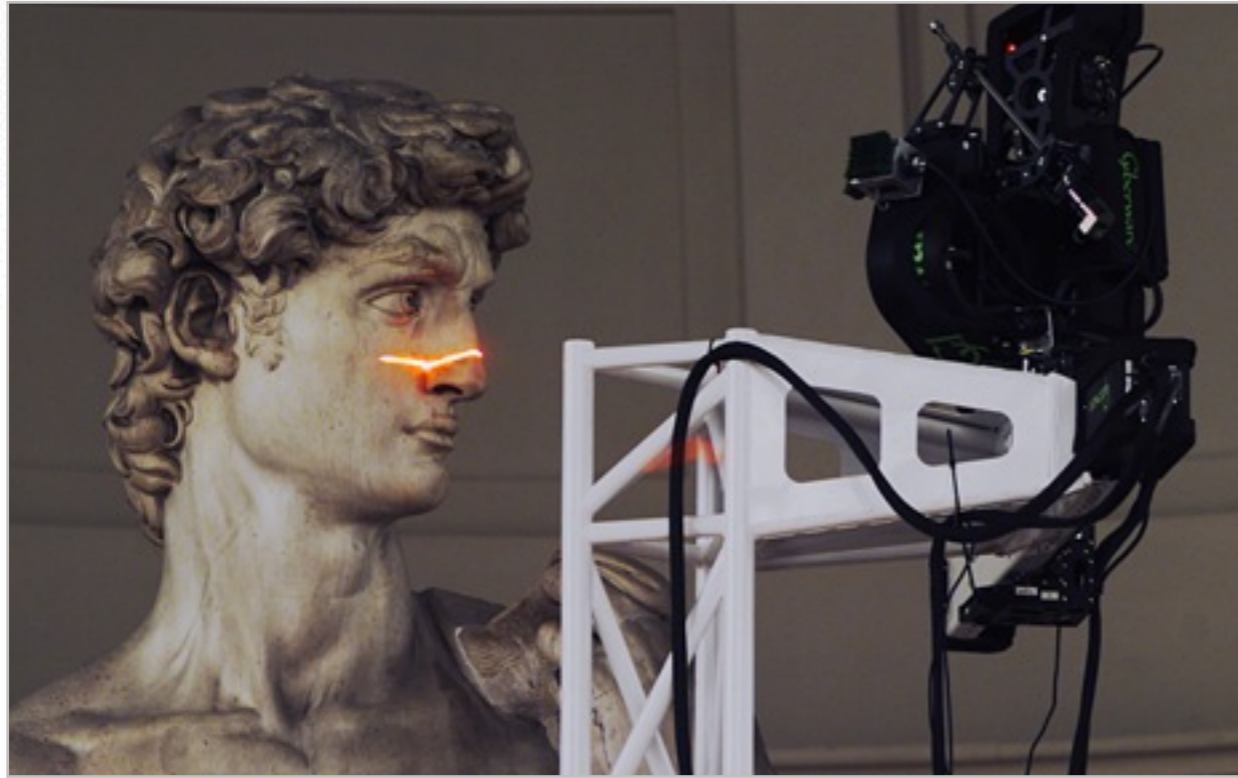




# Geometric Constraints



# Laser-Scanning



Digital Michelangelo Project



Cyberware



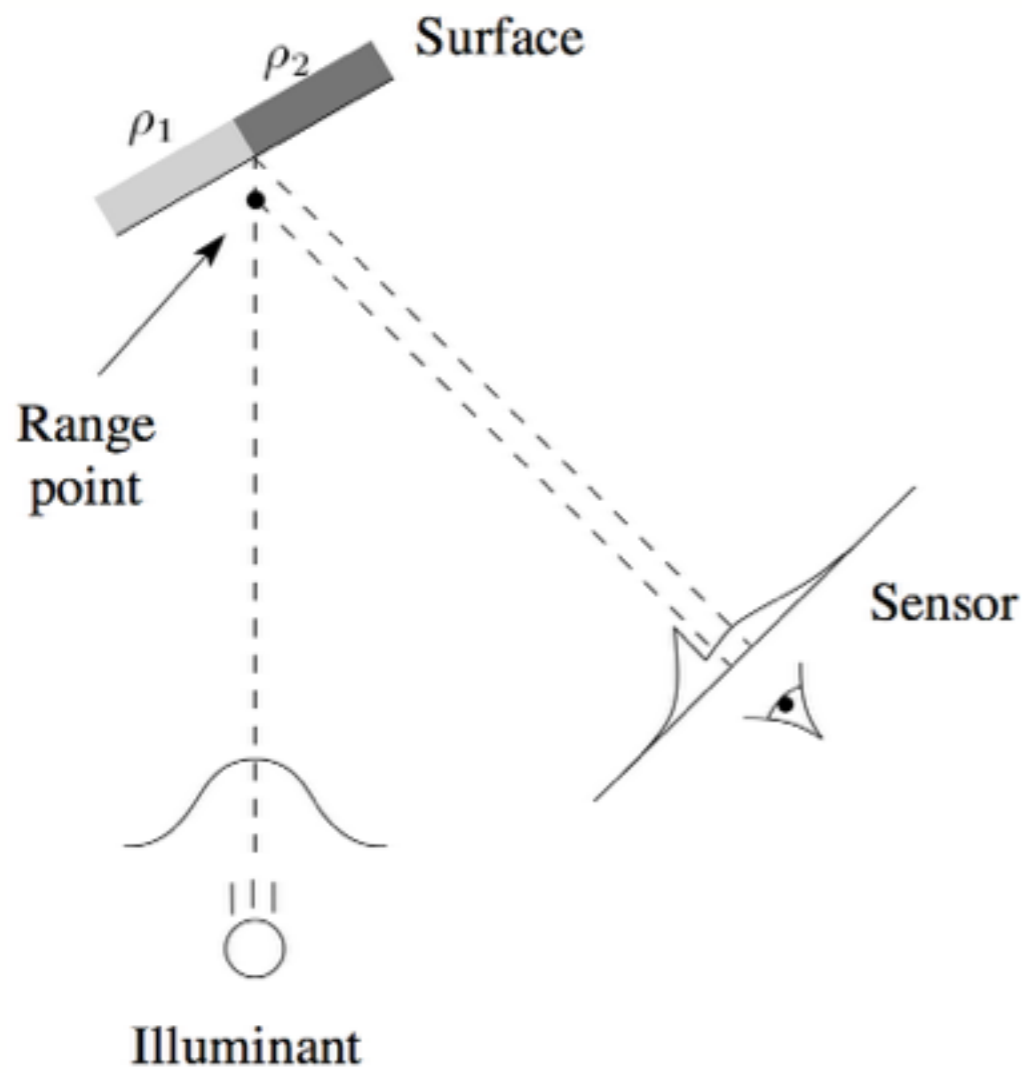
Konica Minolta



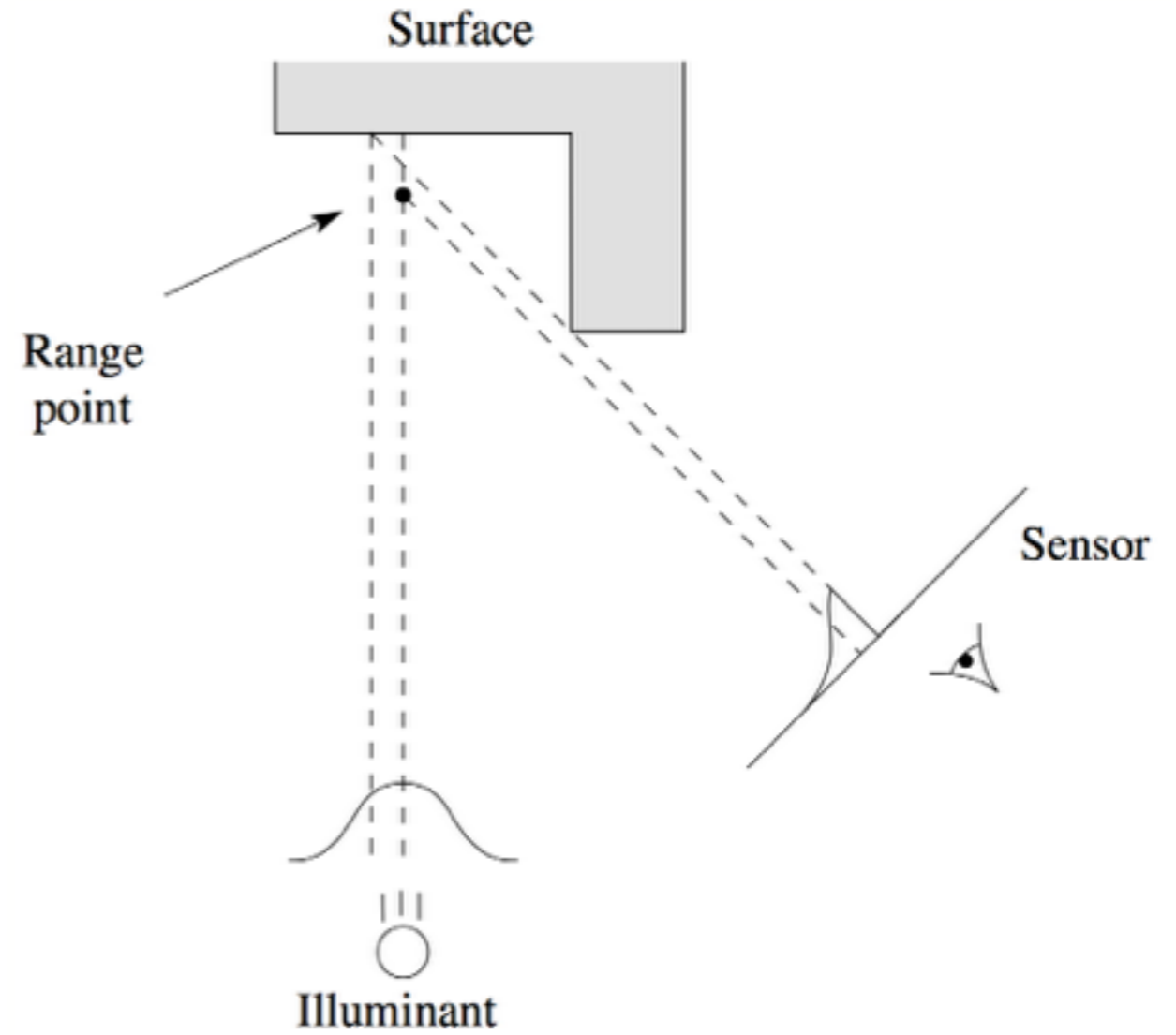
# Laser-Based Optical Triangulation

- gained popularity for high accuracy capture ( $< 1\text{mm}$ )
- professional solutions are still expensive
- long range
- very insensitive to object's color (e.g. black) and lighting conditions
- may lead to laser speckle on rough surface  $\rightarrow$  space time analysis
- slow process (plane-sweep)  $\rightarrow$  no suitable for dynamic objects

# Surface Perturbs Laser Shape



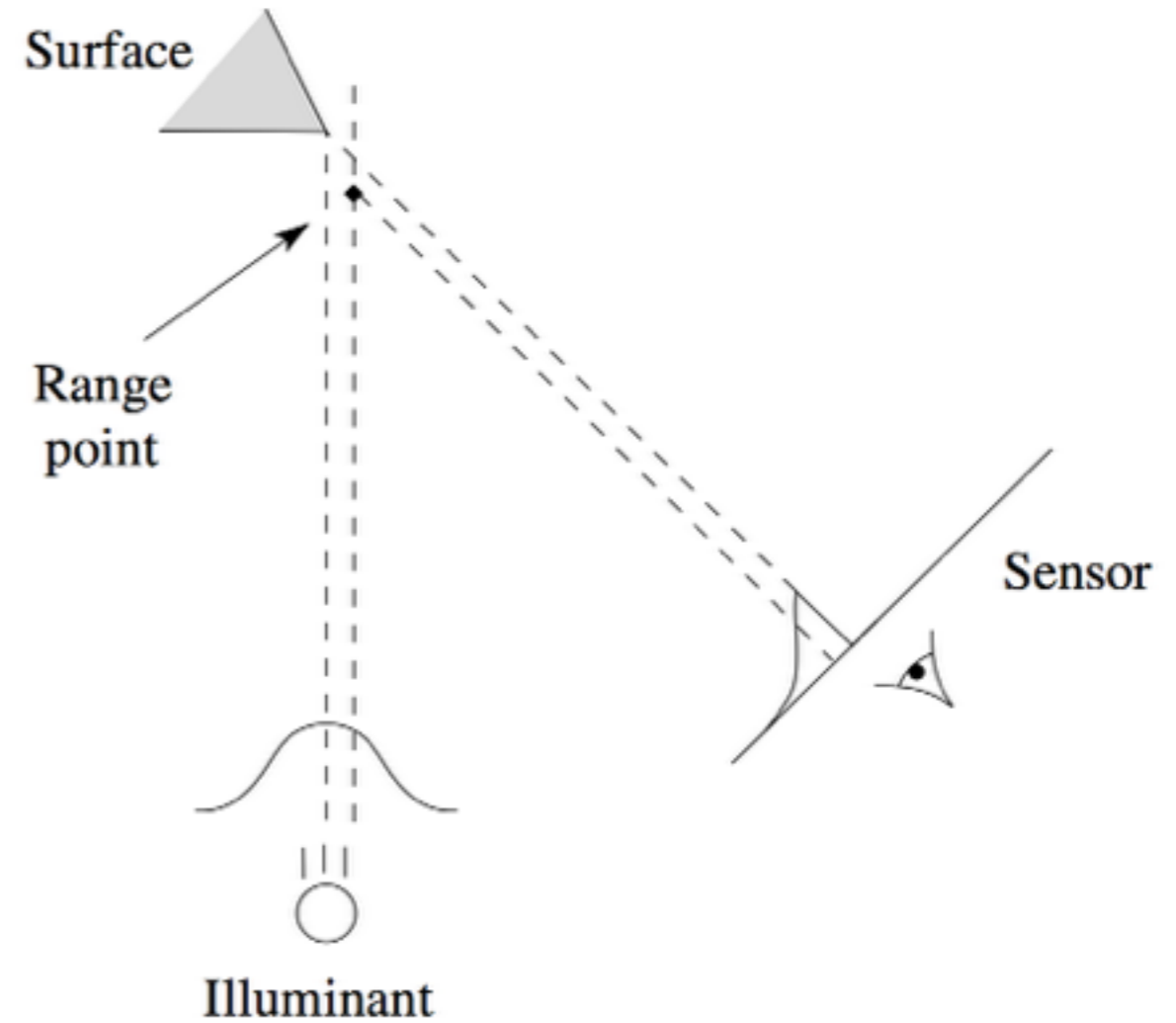
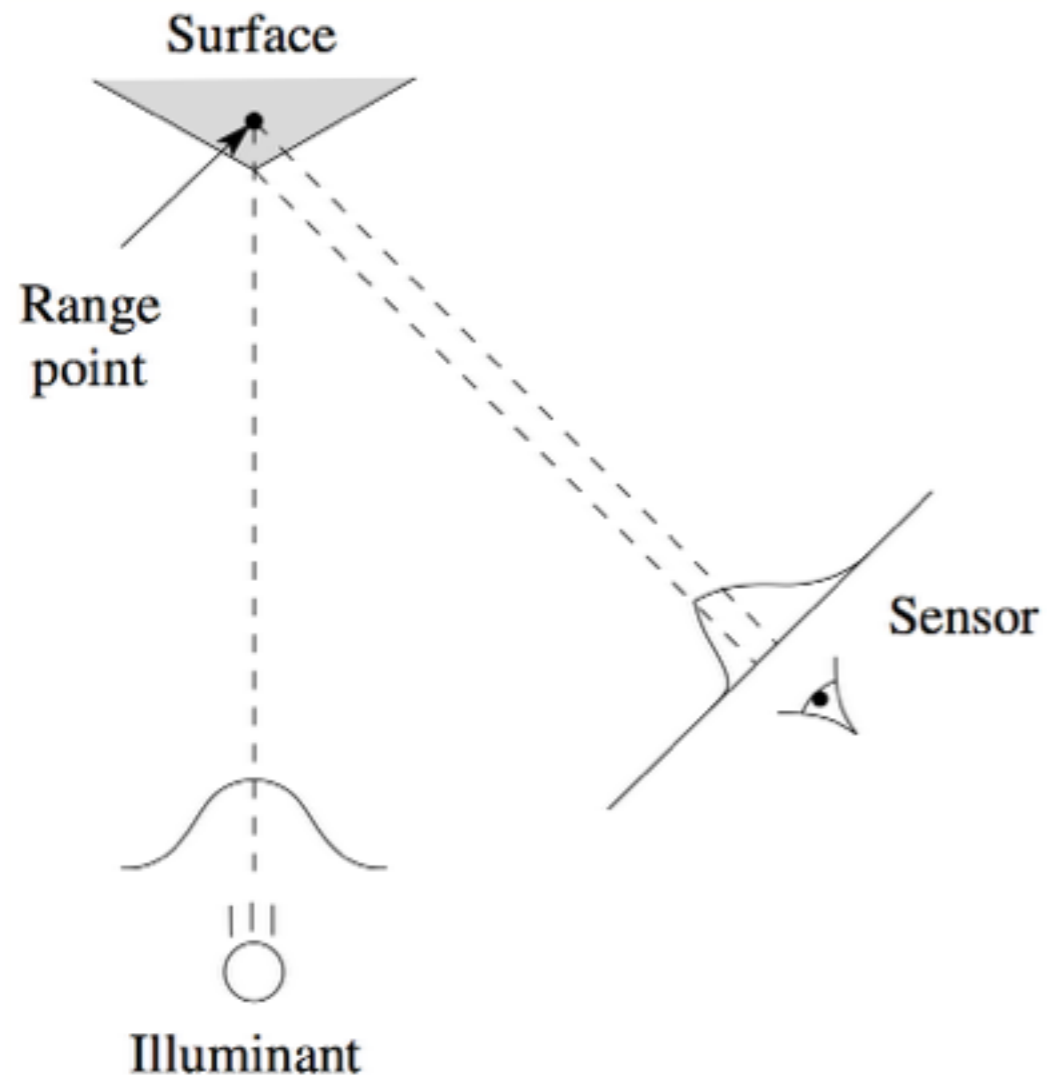
reflectance discontinuity



sensor occlusion

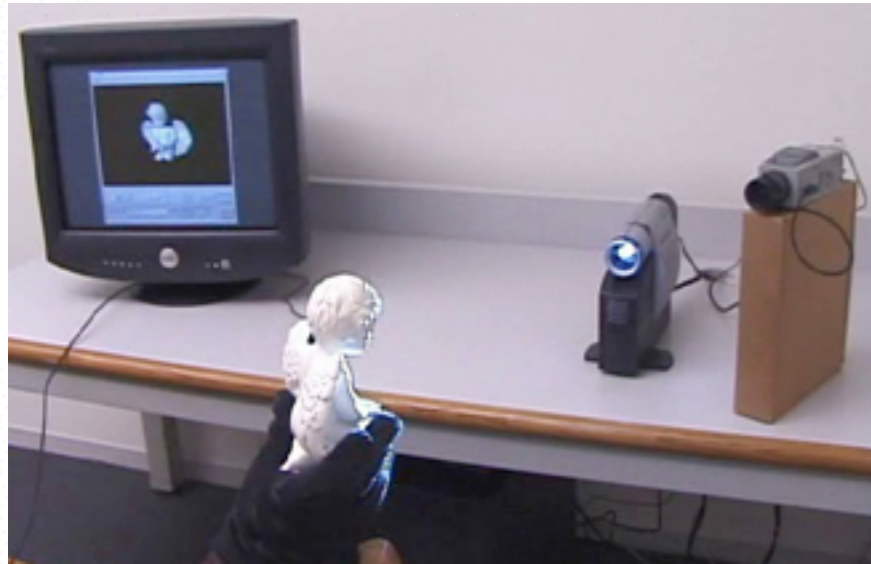


# Surface Perturbs Laser Shape



shape variation

# Single-View Structure Light Scanning



[Rusinkiewicz et al. '02]



Artec Group



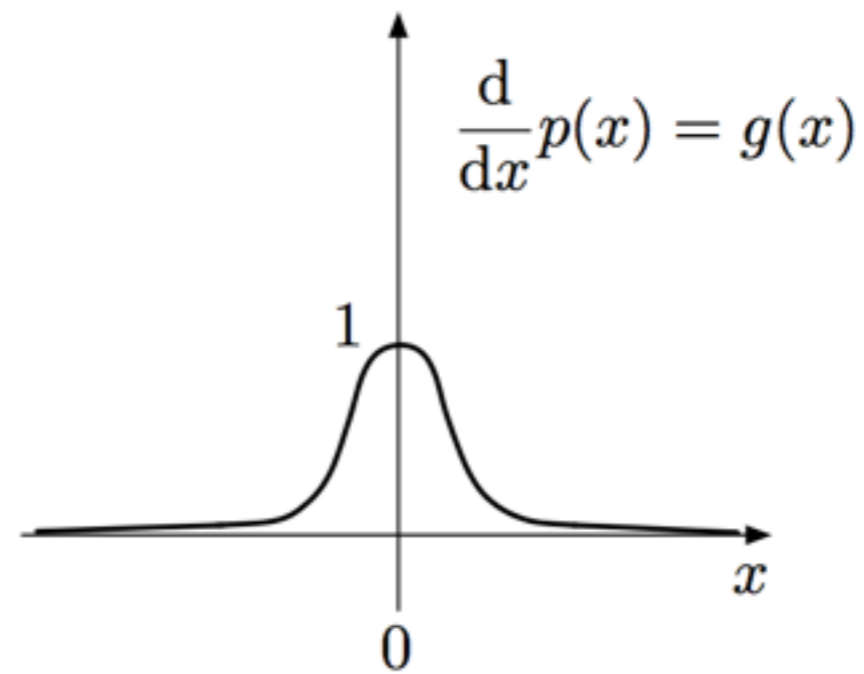
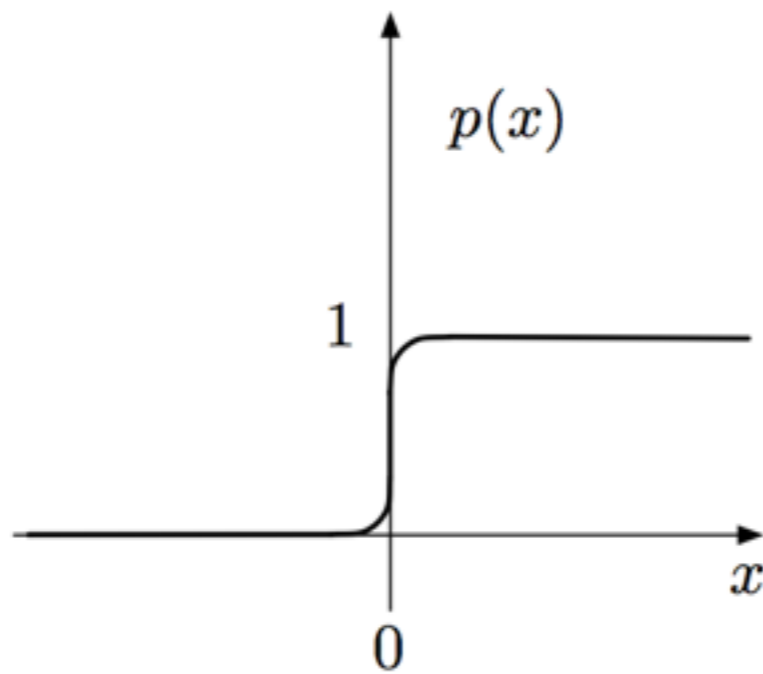
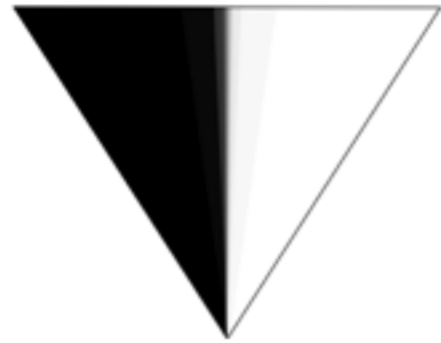
[Newcombe et al. '11]  
KinectFusion



# Structured Light Scanning

- developed to increase capture speed by simultaneously projecting multiple **stripes or dots** at once
- increase accuracy using edge detection
- due to cost and flexibility, based on a **video projector**
- challenge: recognize projected patterns (**correspondence**)
  - under occlusions
  - different surface reflection properties (furry object?)
  - less projections → faster but correspondence harder
- typically assumes a **2D manifold** with **Lambertian reflectance**

# Stripe Edge Detection

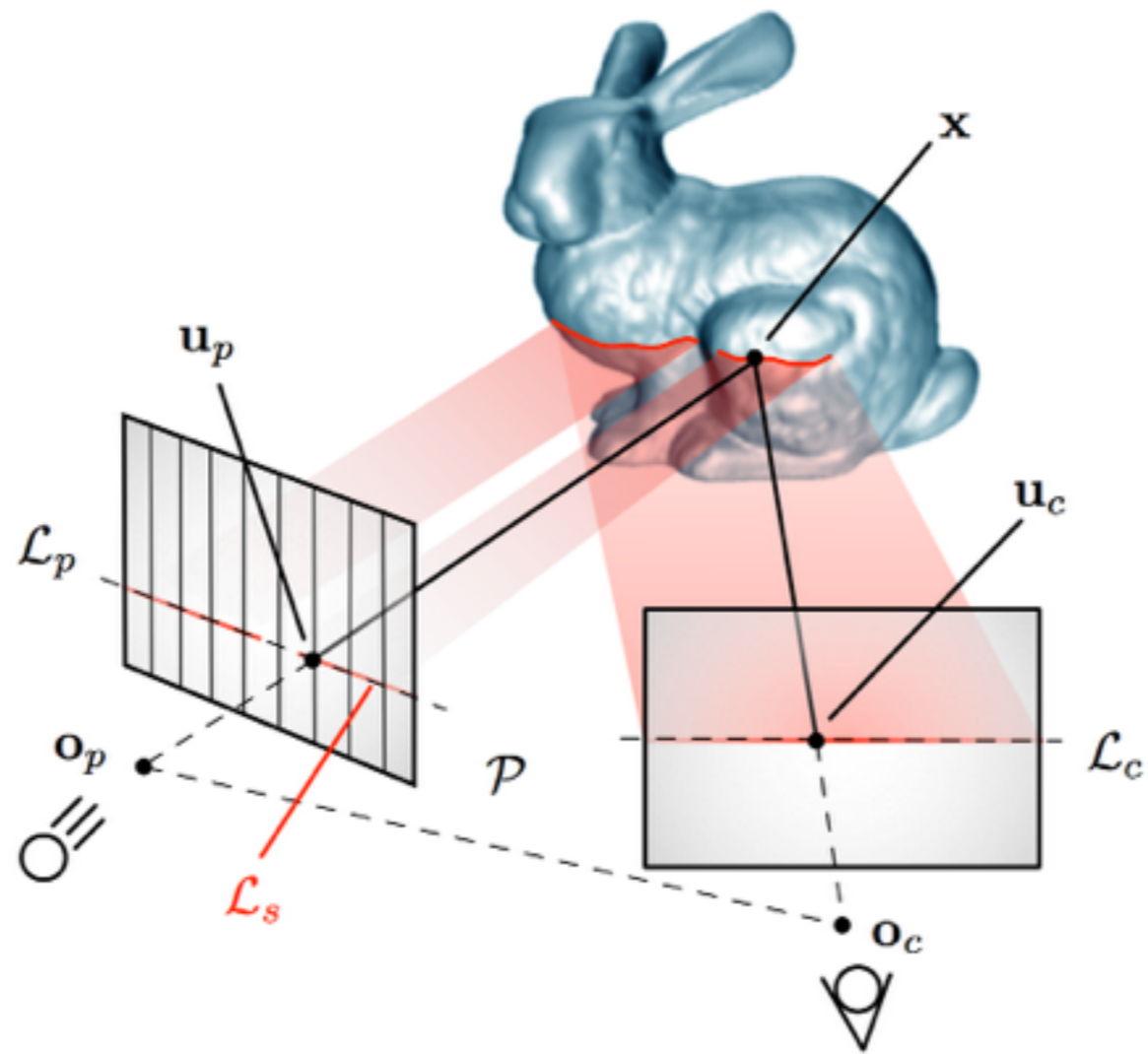




# Epipolar Geometry

## correspondence is a 1D search

- same for passive stereo (but with rectification)

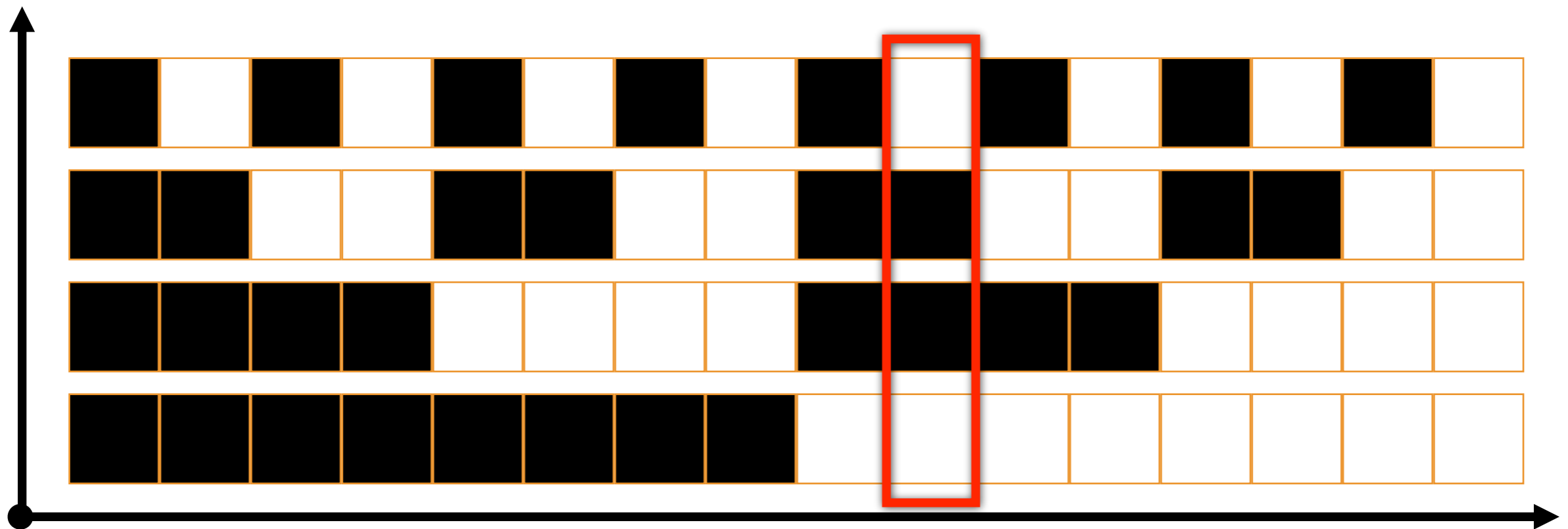


# Time-Coded Light Patterns

## Binary coded pattern

- project several b/w patterns over time
- color patterns identify row/column

Time



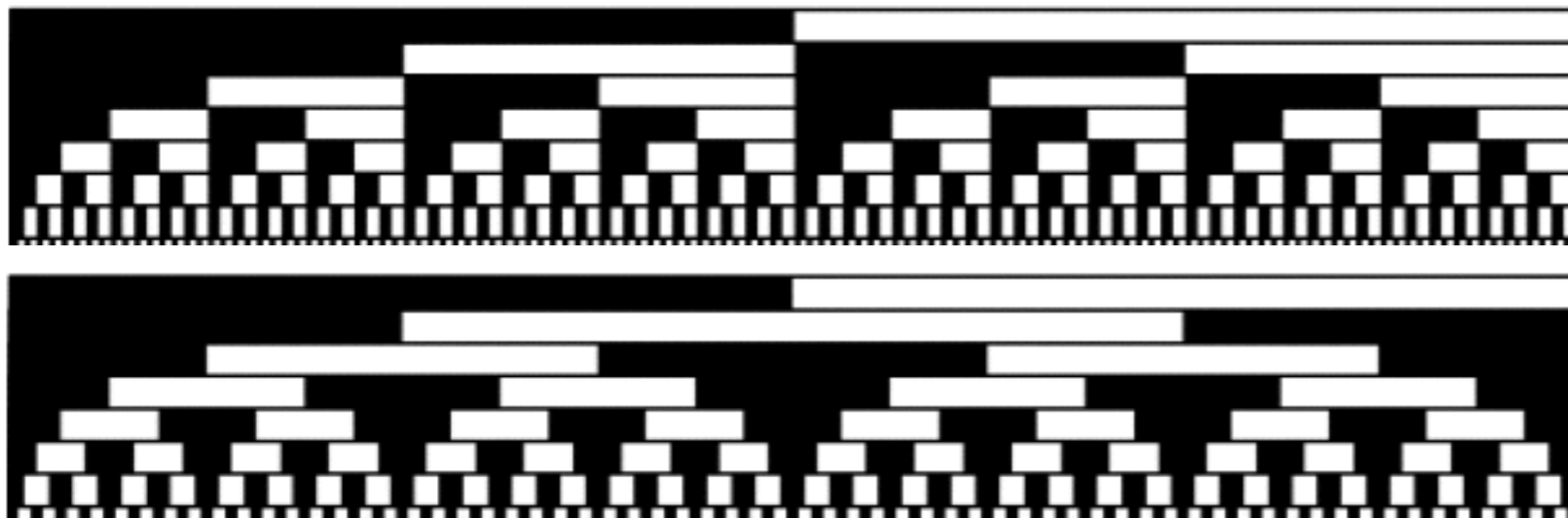
Space



# Time-Coded Light Patterns

## Gray Code Pattern

- Wider stripes than naive binary coding
- While same number of patterns, it performs better



Binary Code

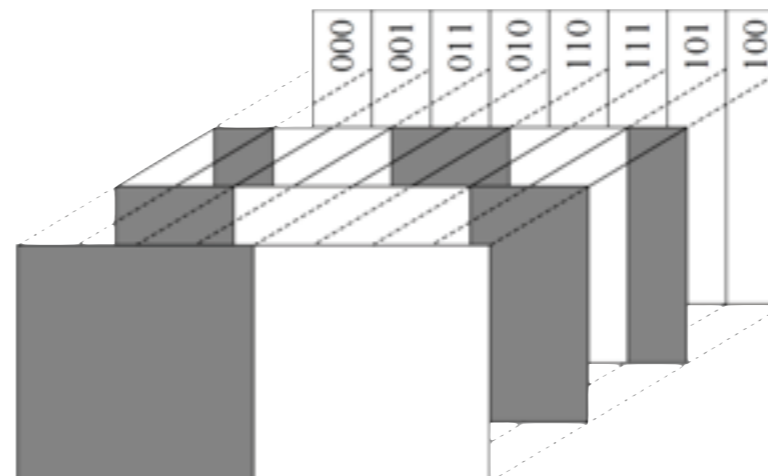
Gray Code

---

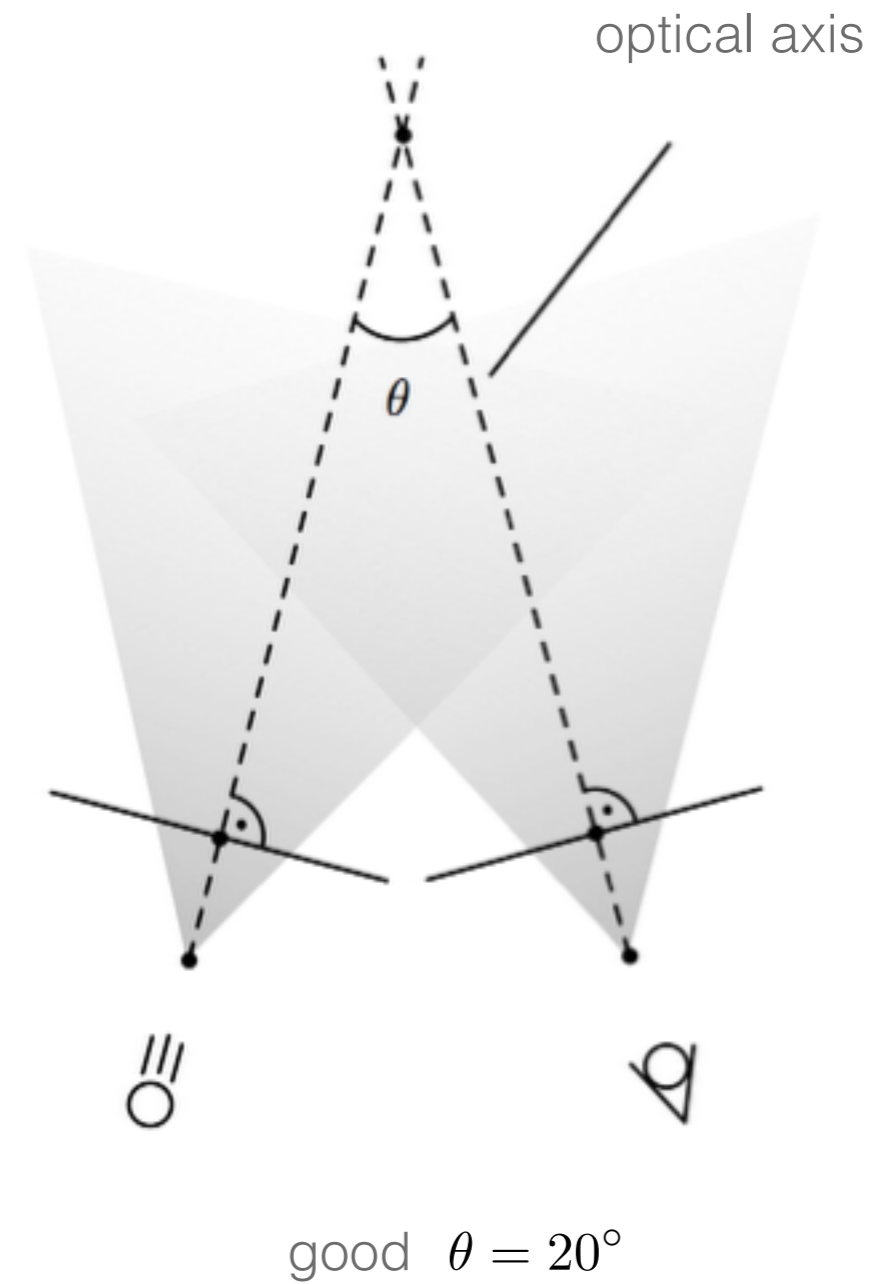
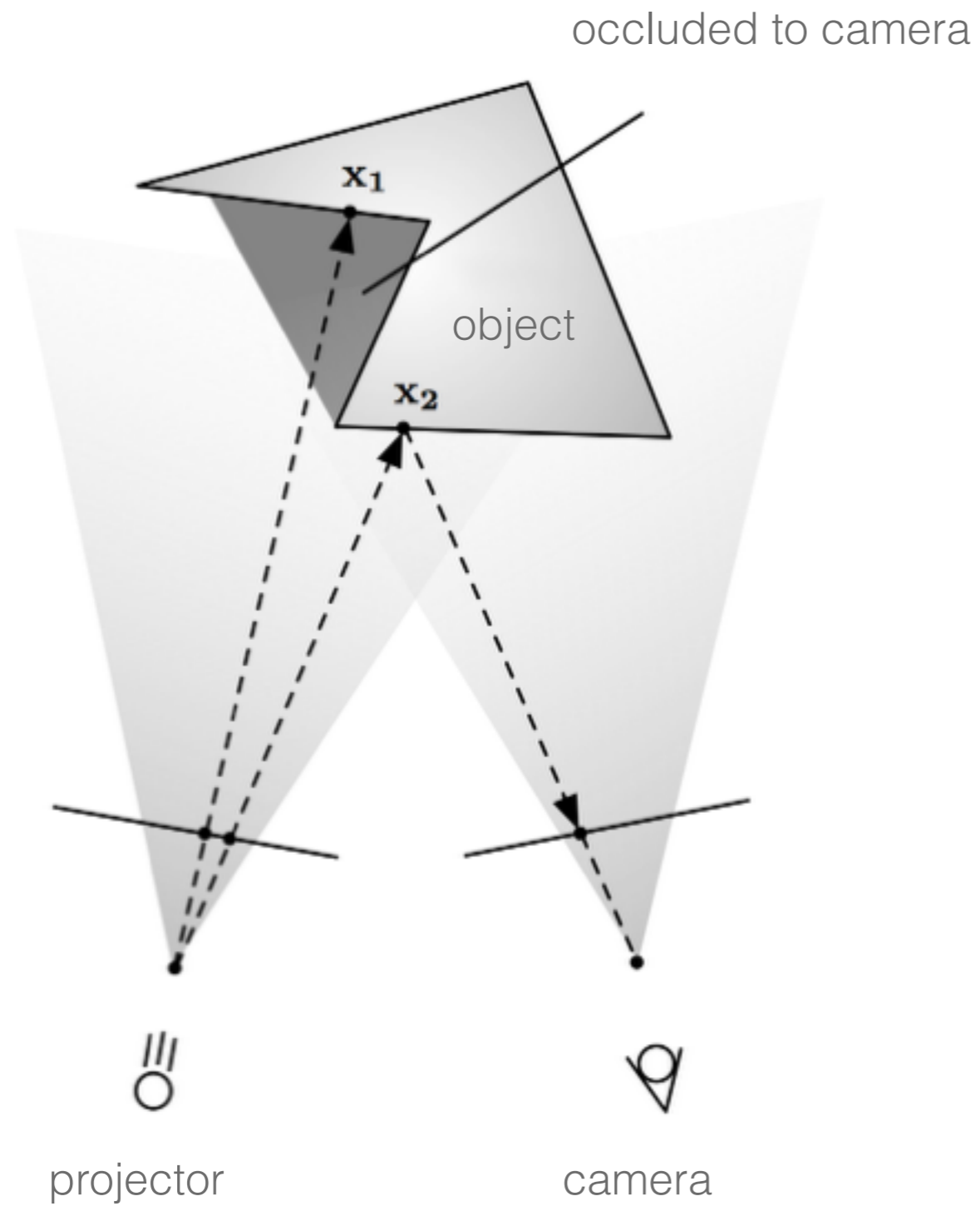
**Bin2Gray(B,G)**

---

```
1  G ← B
2  for i ← n-1 downto 0
3    G[i] ← B[i+1] xor B[i]
```

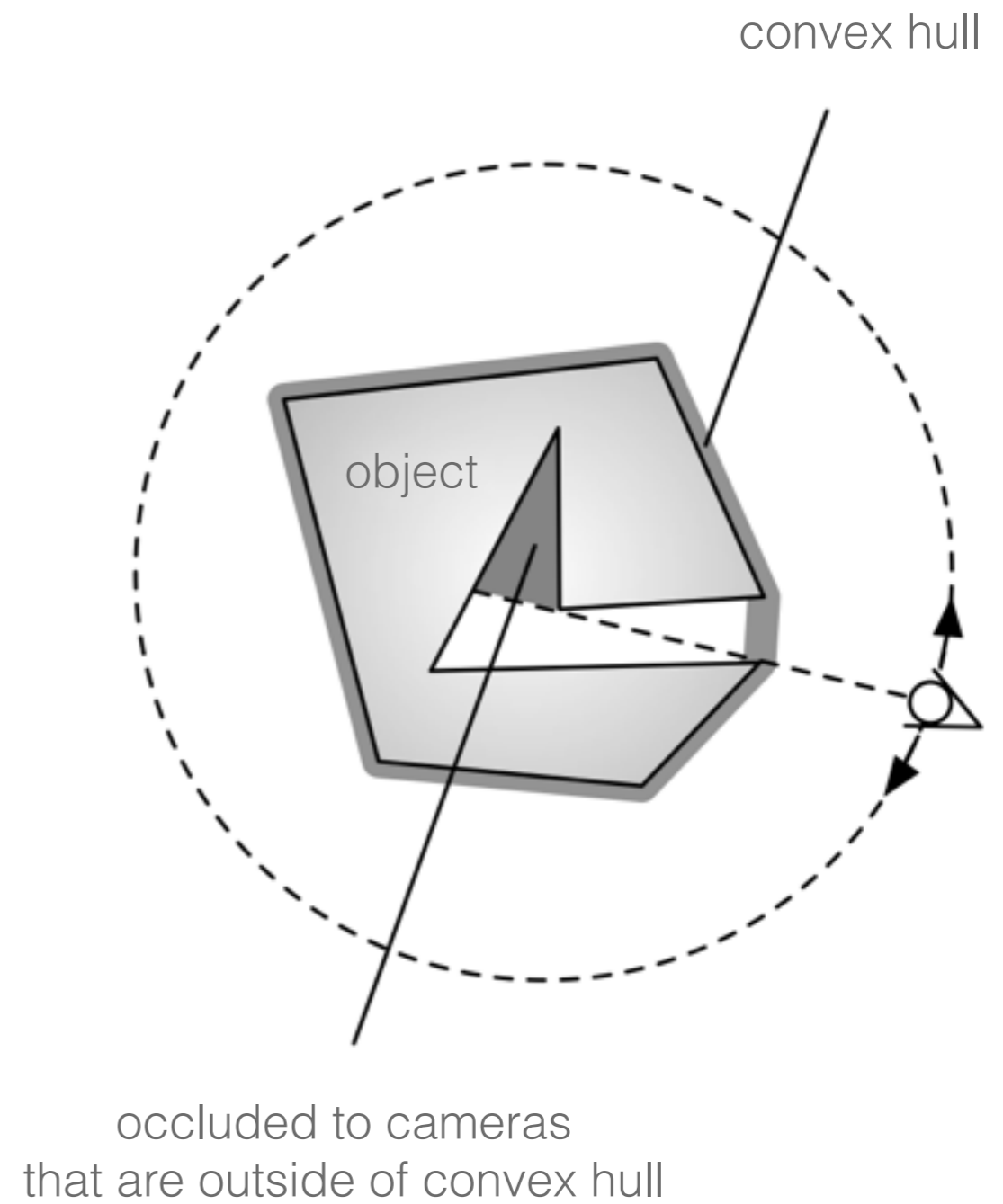
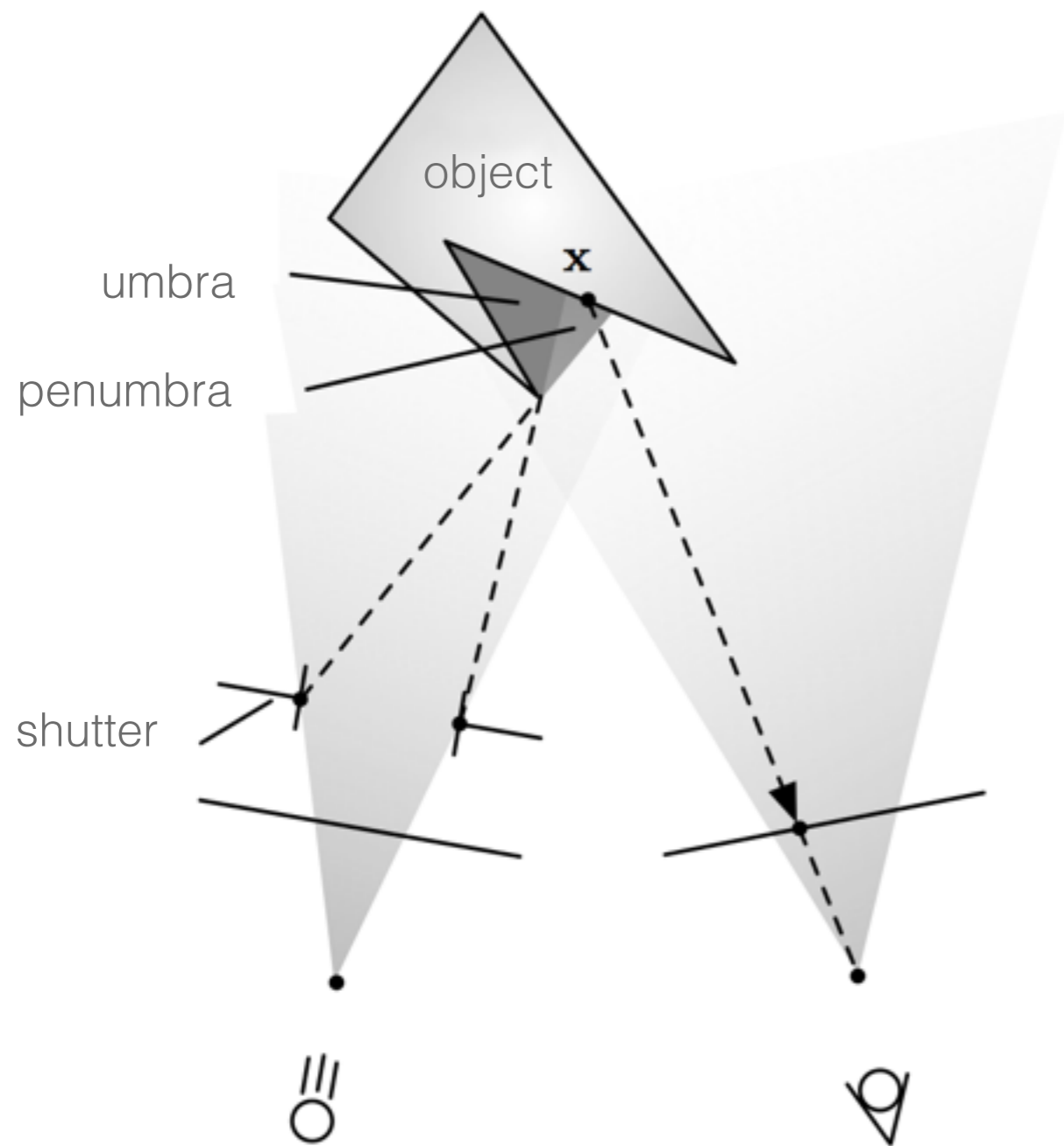


# Geometric Constraints





# Geometric Constraints



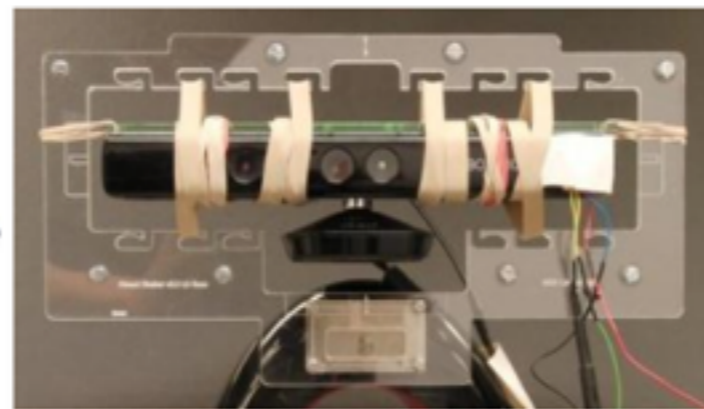
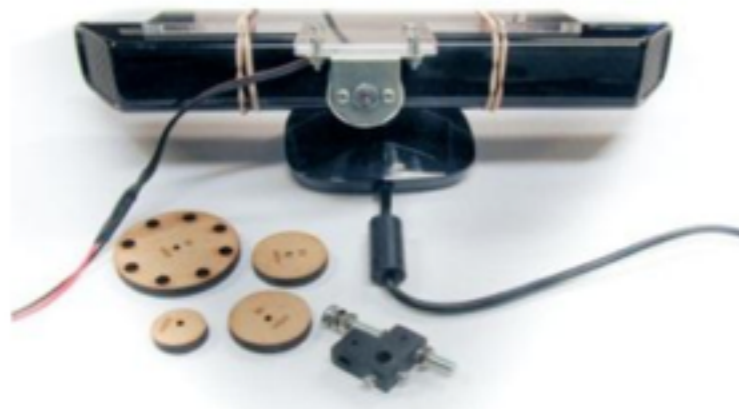
# Take Home Message

## Occlusions in Concave Regions

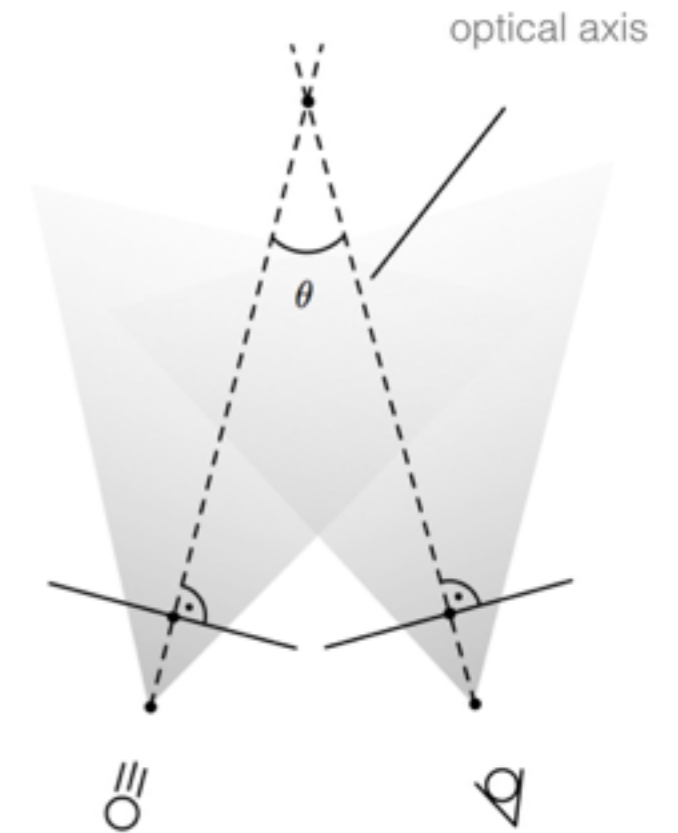
- Longer baseline: more shadowing
- Shorter baseline: less precision
- In practice:  $\theta = 20^\circ$

## Interference of Patterns

- Challenges for multi-view capture

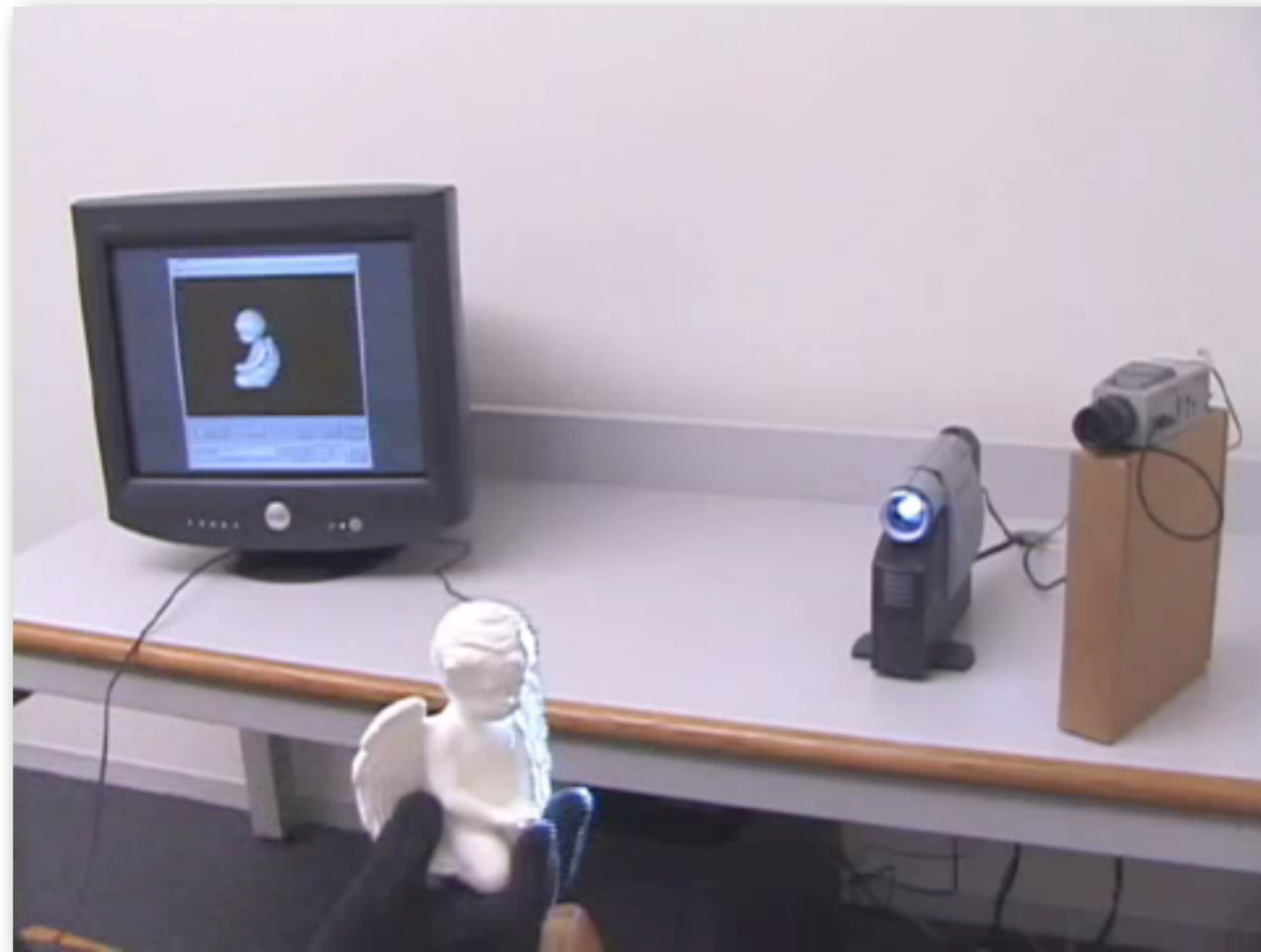


Shake'n'Sense [MSR 2012]





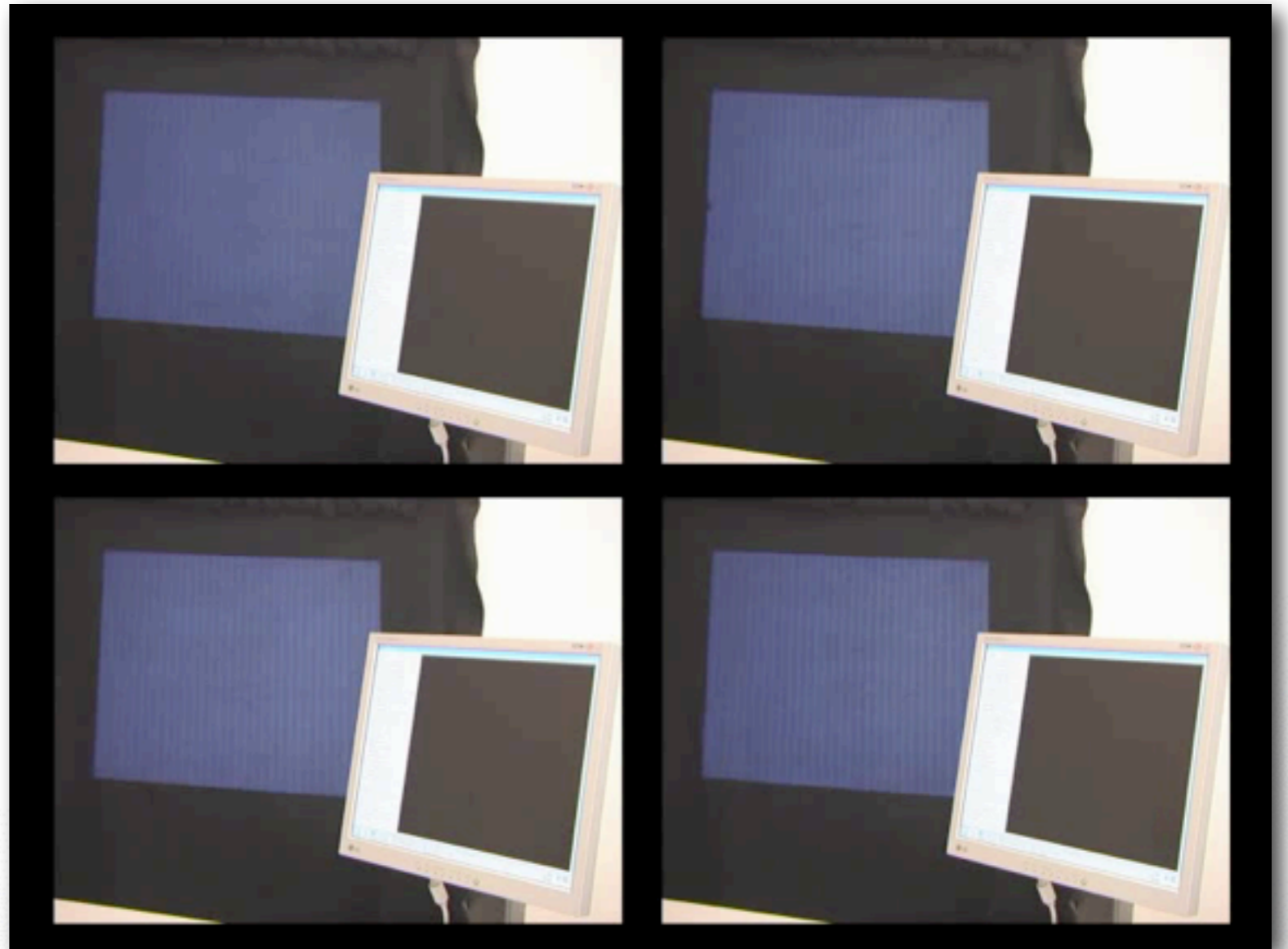
# Realtime Structured Light



# Phase Shift Patterns

## Realtime Depth Capture

- Moving and Deforming Scenes
- Subpixel accuracy
- High resolution

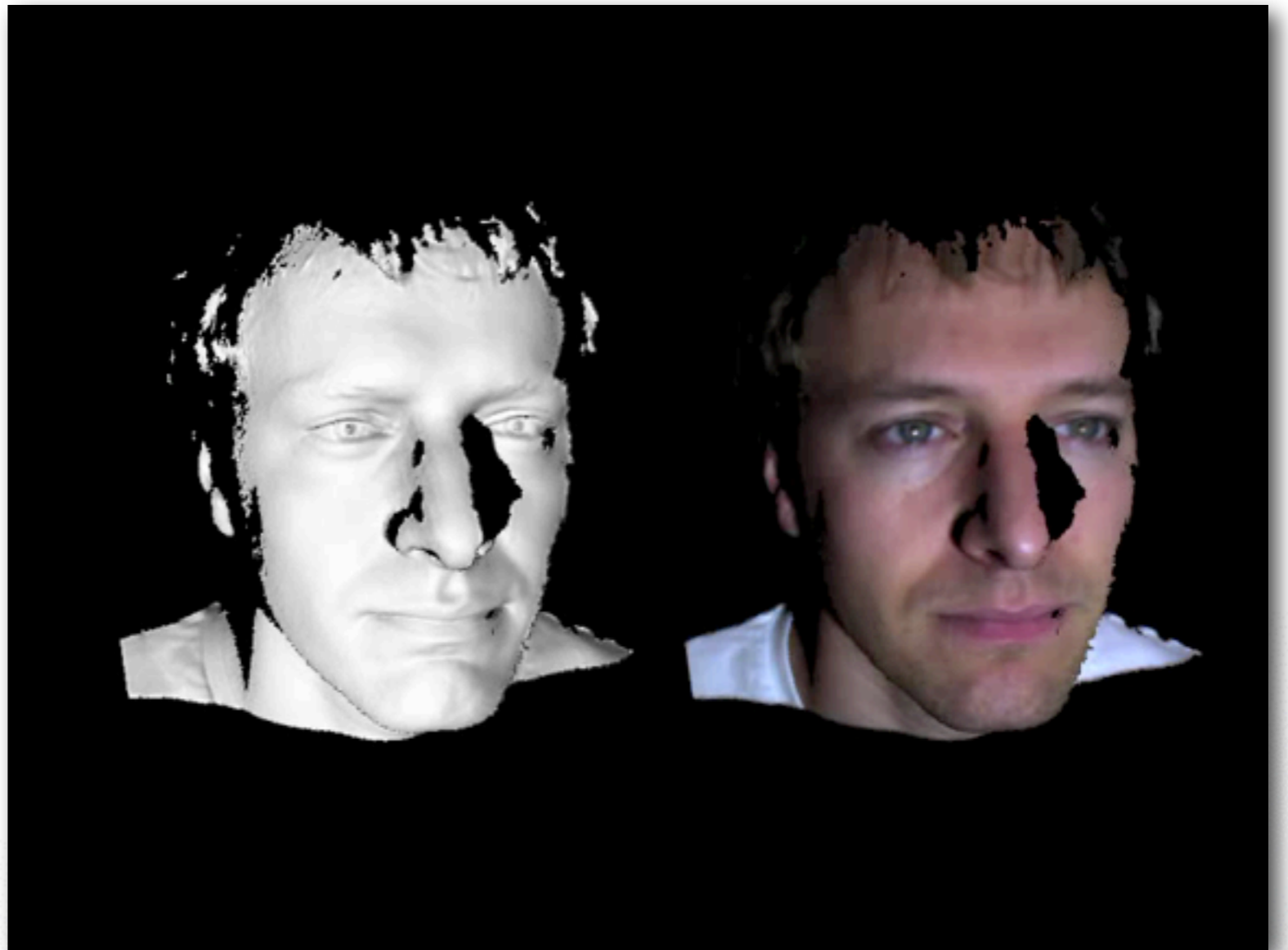




# Phase Shift Patterns

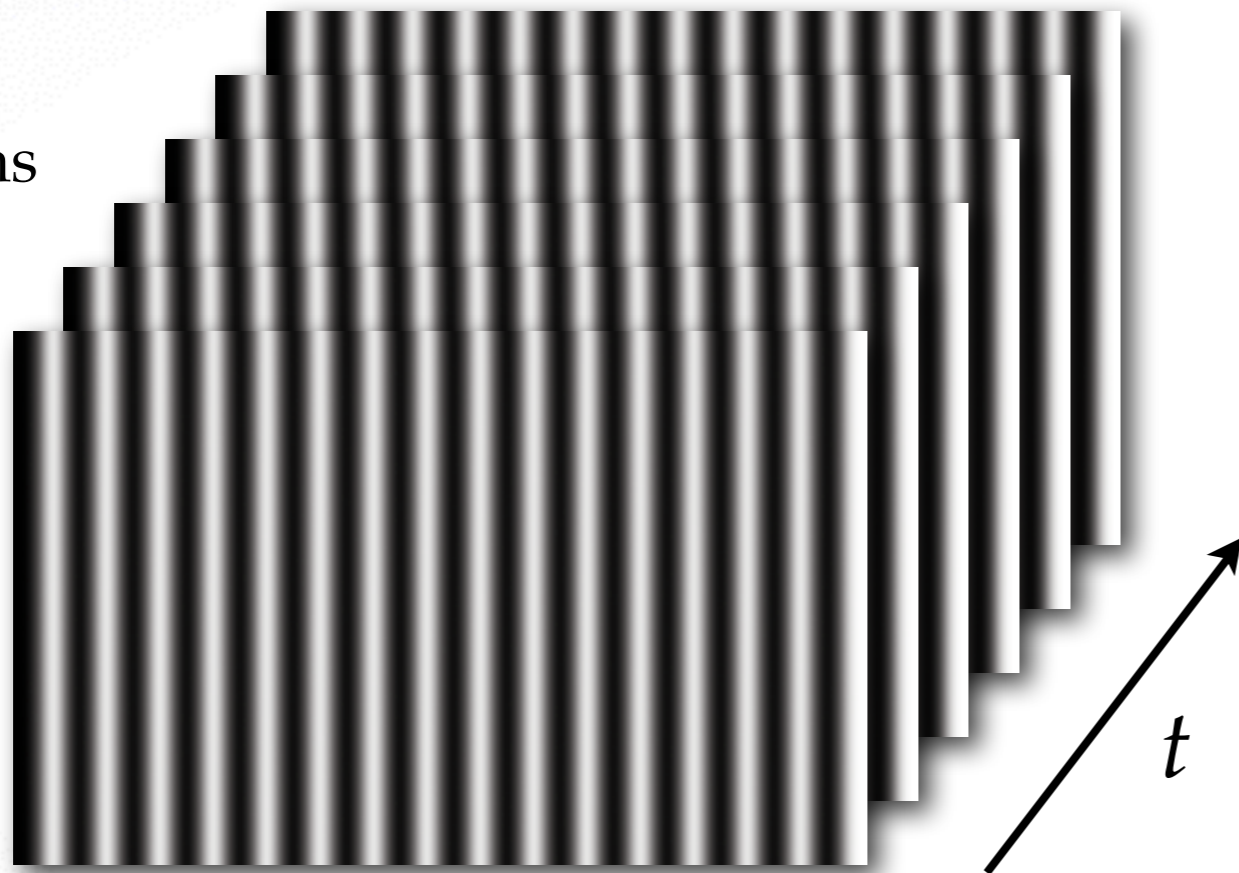
## Realtime Depth Capture

- Moving and Deforming Scenes
- Subpixel accuracy
- High resolution



# Phase Shift Patterns

phase  
shifted  
patterns



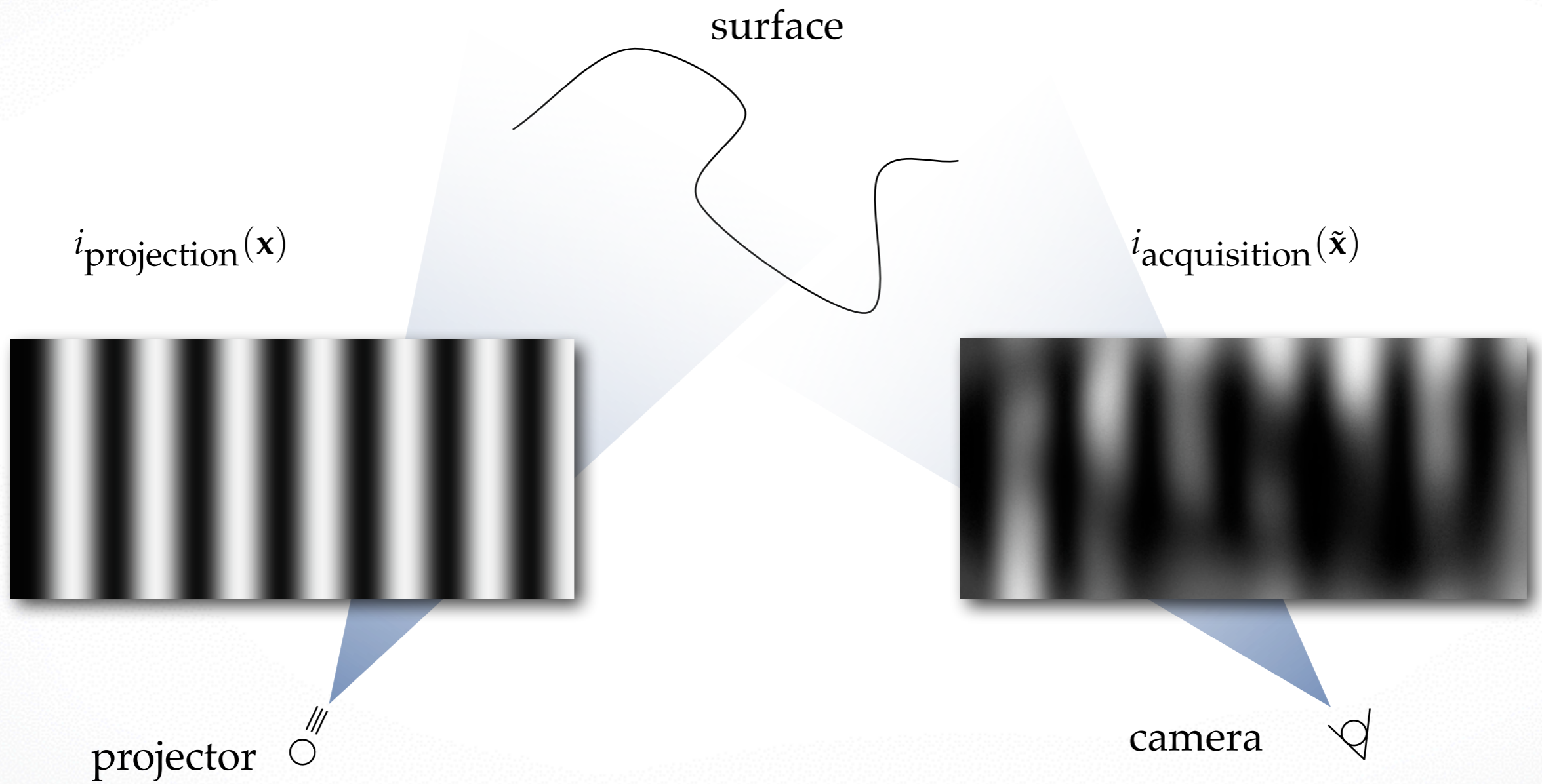
projector 

$$i_{\text{projection}}(\mathbf{x}, t) = \frac{1}{2}(1 + \cos(\theta(\mathbf{x}) - \phi(t)))$$

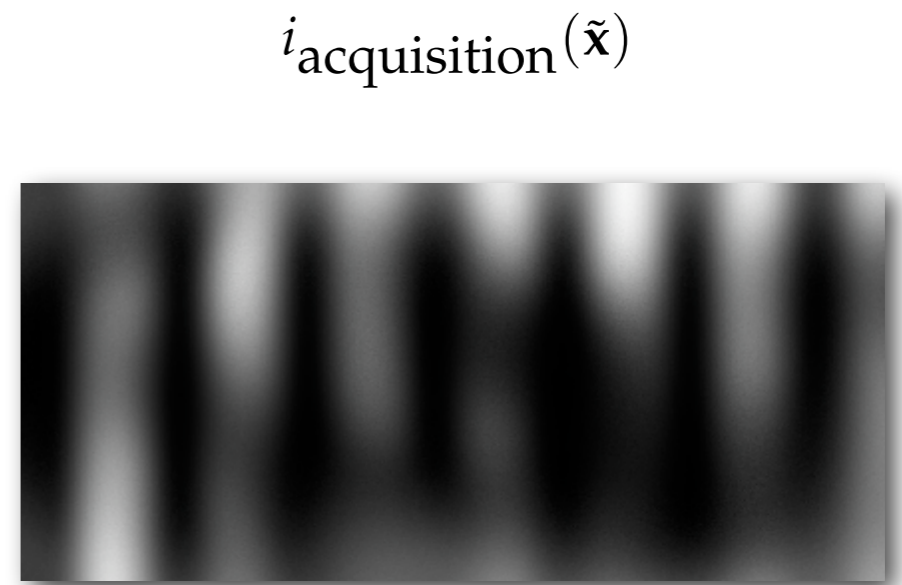
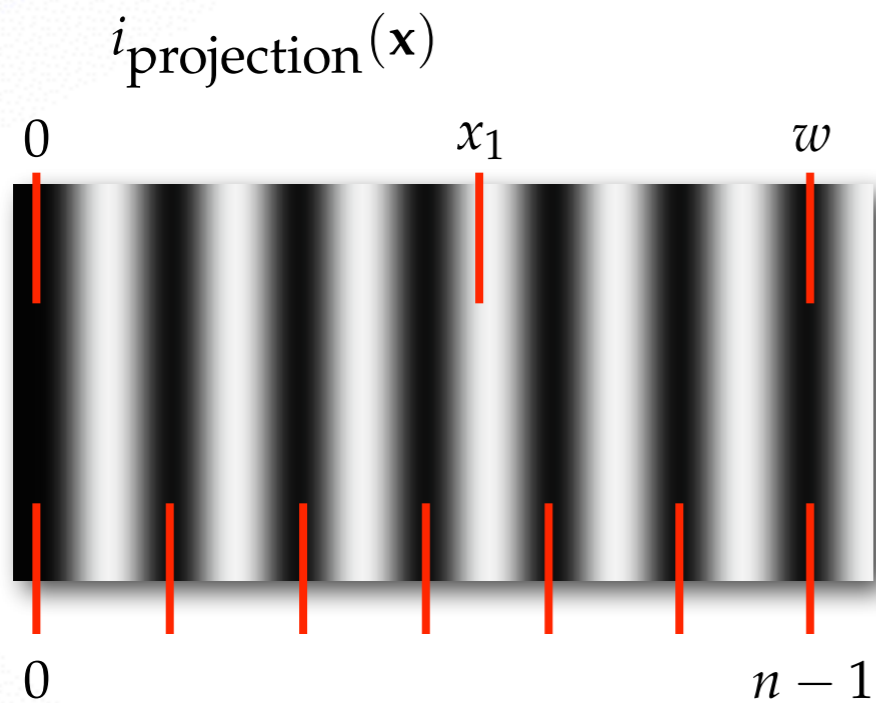
$$\mathbf{x} \in \mathbb{R}^2$$



# Phase Shift Patterns



# Phase Shift Patterns



$$i_{\text{acquisition}}(\tilde{\mathbf{x}}) = i_{\text{albedo}}(\tilde{\mathbf{x}}) + i_{\text{amplitude}}(\tilde{\mathbf{x}}) \cos\left(2\pi n \frac{x_1}{w} - \phi\right)$$



# Phase Unwrapping

$$i_{\text{acquisition}}(\tilde{\mathbf{x}}) = i_{\text{albedo}}(\tilde{\mathbf{x}}) + i_{\text{amplitude}}(\tilde{\mathbf{x}})\cos\left(2\pi n\frac{x_1}{w} - \phi\right)$$



$$i_{\text{acquisition}}(\tilde{\mathbf{x}}) = i_{\text{albedo}}(\tilde{\mathbf{x}}) + i_{\text{amplitude}}(\tilde{\mathbf{x}})\cos(\theta - \phi)$$

$$\theta \in [0, 2\pi]$$

# Phase Unwrapping

$$i_{\text{acquisition}}(\tilde{\mathbf{x}}) = i_{\text{albedo}}(\tilde{\mathbf{x}}) + i_{\text{amplitude}}(\tilde{\mathbf{x}})\cos(\theta - \phi)$$



$$i_{\text{acquisition}}^{(t)}(\tilde{\mathbf{x}}) = i_{\text{albedo}}(\tilde{\mathbf{x}}) + i_{\text{amplitude}}(\tilde{\mathbf{x}})\cos(\theta - 2\pi\frac{t}{m})$$

$$\theta \in [0, 2\pi]$$

Three unknowns:

$$i_{\text{albedo}}(\tilde{\mathbf{x}})$$

$$i_{\text{amplitude}}(\tilde{\mathbf{x}})$$



# Phase Unwrapping

$$i_{\text{acquisition}}^{(t)}(\tilde{\mathbf{x}}) = i_{\text{albedo}}(\tilde{\mathbf{x}}) + i_{\text{amplitude}}(\tilde{\mathbf{x}})\cos(\theta - 2\pi\frac{t}{m})$$

$$\theta = \arctan\left(\frac{3^{\frac{1}{2}}(i_{\text{acquisition}}^1 - i_{\text{acquisition}}^3)}{2i_{\text{acquisition}}^2 - i_{\text{acquisition}}^1 - i_{\text{acquisition}}^3}\right)$$

$$i_{\text{albedo}}(\tilde{\mathbf{x}}) = \frac{1}{3} \sum_{t=1}^3 i_{\text{acquisition}}^{(t)}(\tilde{\mathbf{x}})$$

$$i_{\text{amplitude}}(\tilde{\mathbf{x}}) = \left(\frac{(i_{\text{acquisition}}^3 - i_{\text{acquisition}}^1)^2}{3} + \frac{(2i_{\text{acquisition}}^2 - i_{\text{acquisition}}^1 - i_{\text{acquisition}}^3)^2}{9}\right)^{\frac{1}{2}}$$

# Phase Unwrapping

phase solution is unique only up to period...



phase “unwrapping”



$$\tilde{\theta}(\tilde{\mathbf{x}}) = \theta(\tilde{\mathbf{x}}) + 2\pi k(\tilde{\mathbf{x}})$$

$$k \in [0, n - 1]$$



# Kinect for XBOX 360

## Kinect (= 1st gen Kinect)

- Structured Light Technology (Primesense Sensor)
- 640 x 480 @ 30 fps
- 1280x960 @ 12 fps
- accuracy:
  - < a few mm (depth < 50 cm)
  - < 4 cm (depth < 500 cm)
- VGA for RGB input
- uses Kinect1.x SDK



# Summary

## The Future will be more accessible

- Real-time depth sensors (smaller, more accurate, higher resolution, less noise, larger working volume, portable)
  - TOF, structured Light, camera Arrays
- Multi-view stereo capture (sparser, better algorithms, real-time, very large working volume, high speed, portable)
  - Robotic camera tracking



tracking a ping pong ball



# 3D scan yourself at home with Kinect and realistic 3D printed figurine!

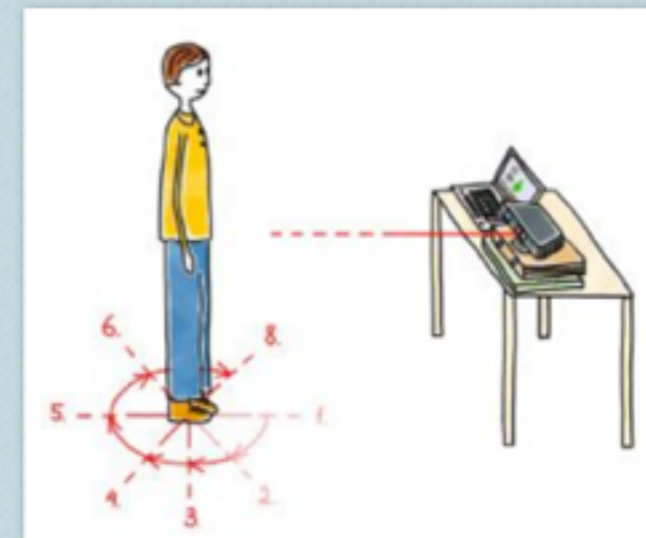
<http://shapify.me>



presented by Artec Group



Step 1



Step 2



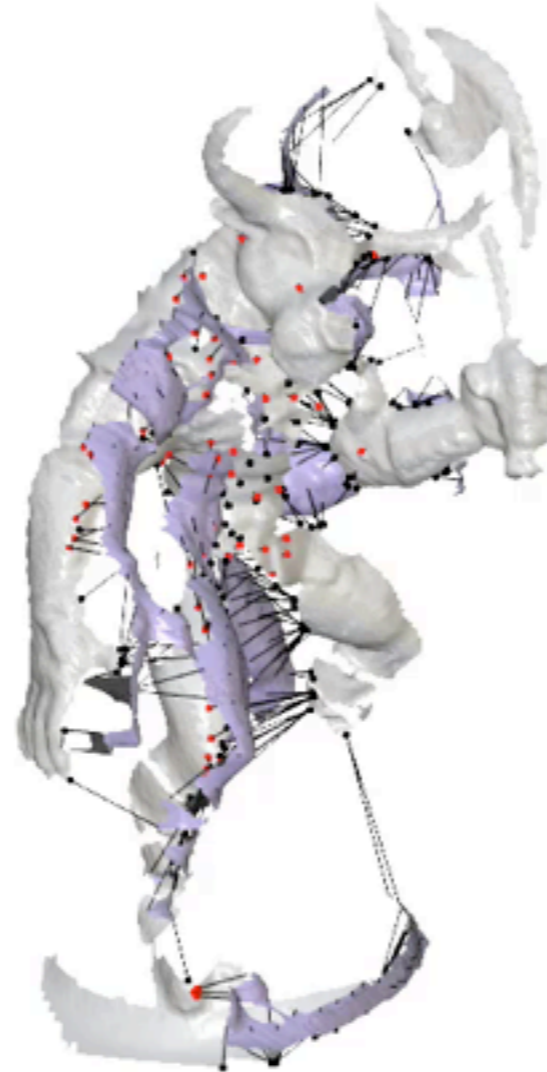
Step 3

# Literature

- Lanman and Taubin, “Build Your Own 3D Scanner: Optical Triangulation for Beginners”, SIGGRAPH 2009 Courses
- Curless, “New Methods for Surface Reconstruction from Range Images”, PhD Thesis, Stanford University 1997
- Levoy et al., “Digital Michelangelo Project”, Stanford 1997 - 2000
- Zhang, “[www.me.iastate.edu/directory/faculty/song-zhang/](http://www.me.iastate.edu/directory/faculty/song-zhang/)”
- Newcombe & Davison, “Live Dense Reconstruction with a Single Moving Camera”, CVPR 2010



# Next Time



## Surface Registration

<http://cs599.hao-li.com>

# Thanks!

