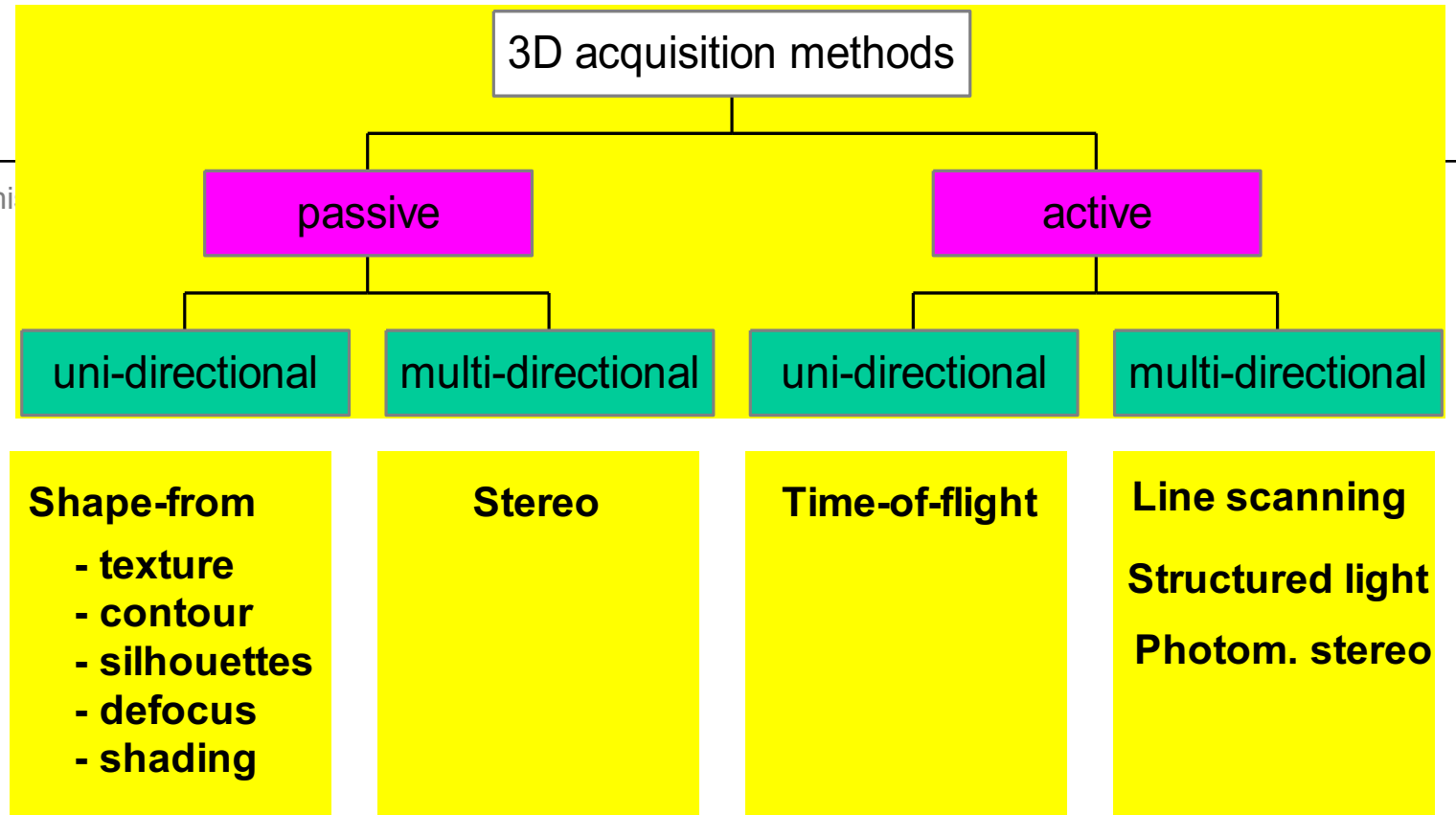


# 3D acquisition

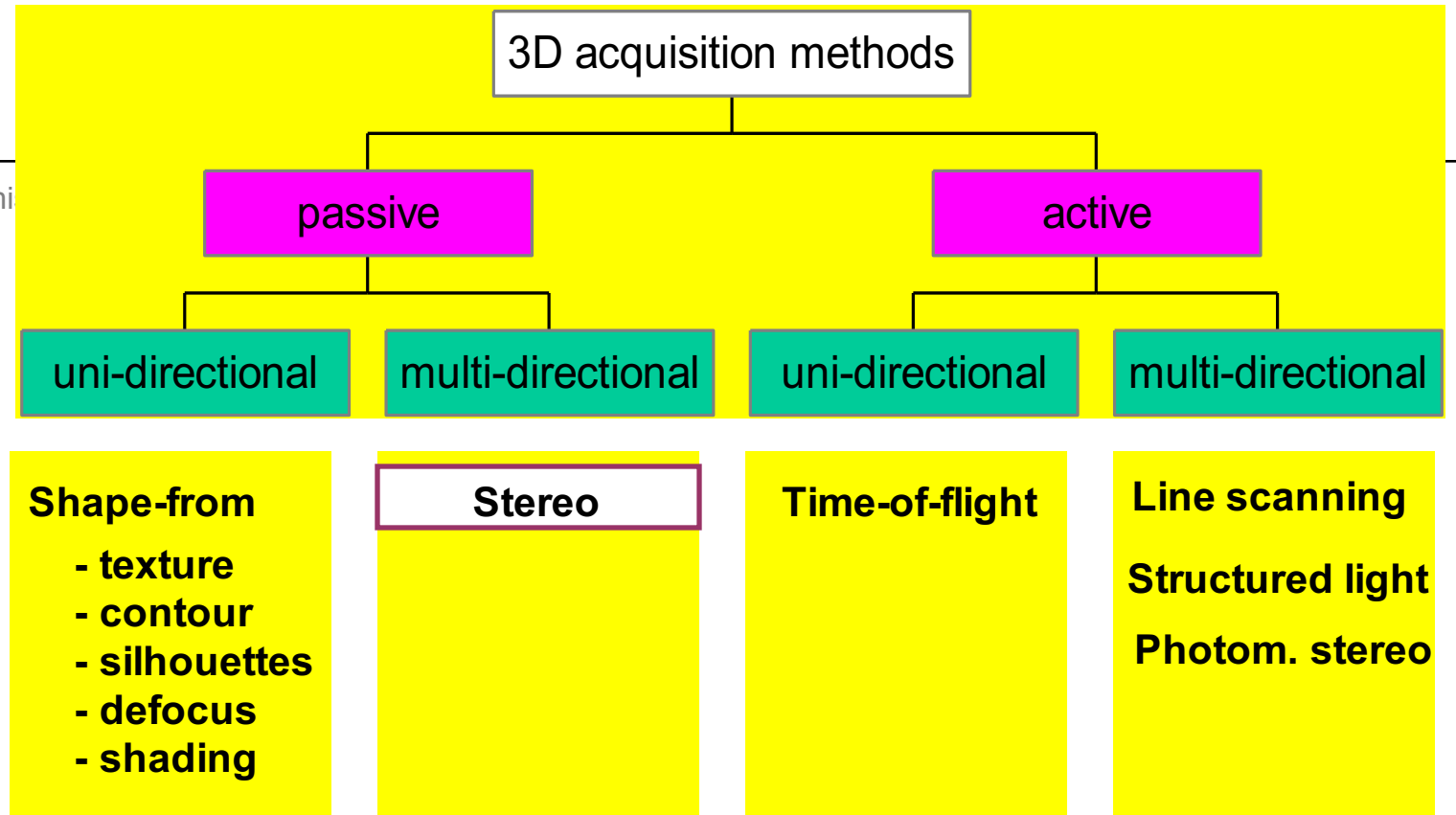


# 3D acquisition taxonomy



This

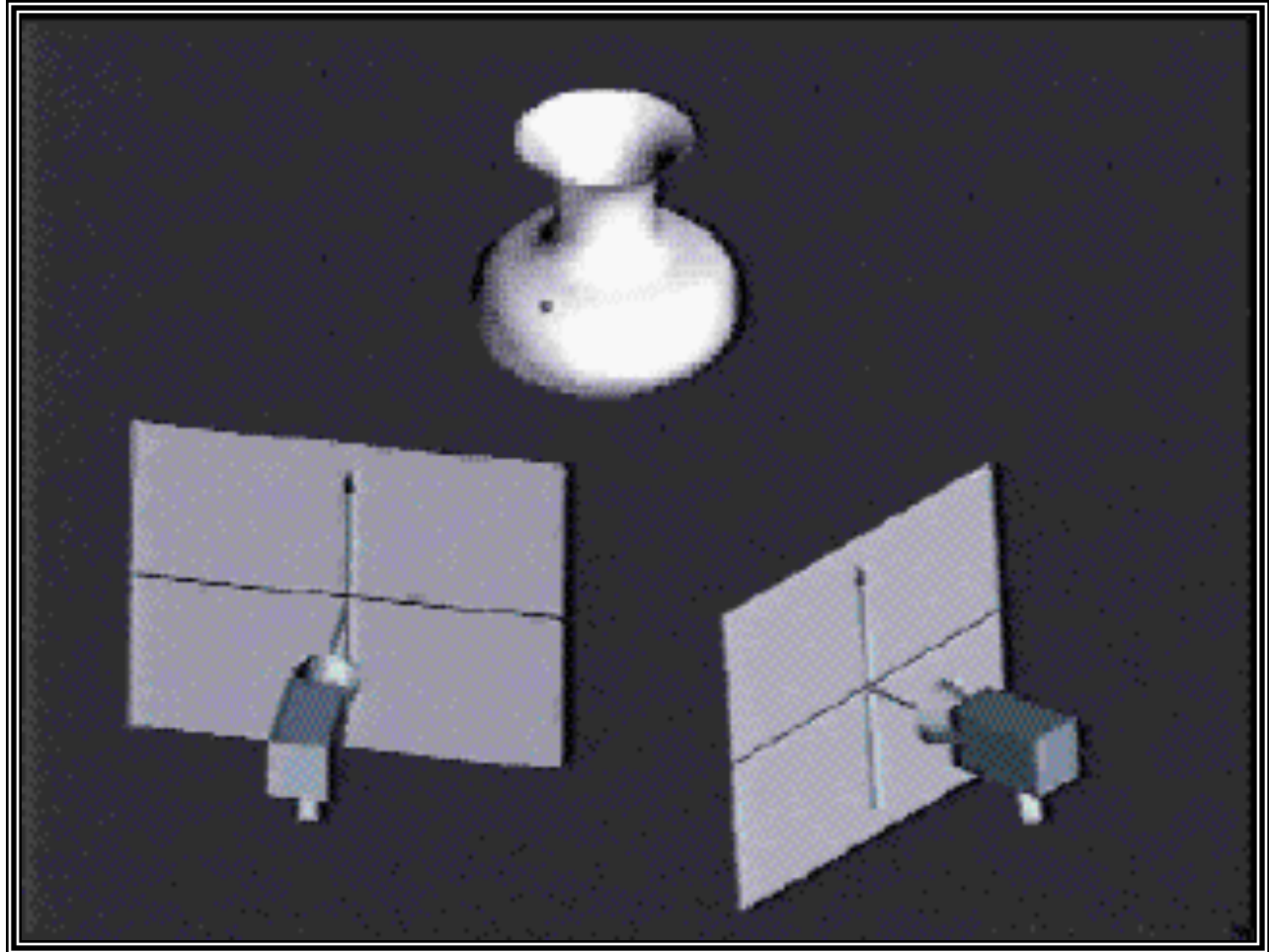
# 3D acquisition taxonomy



This

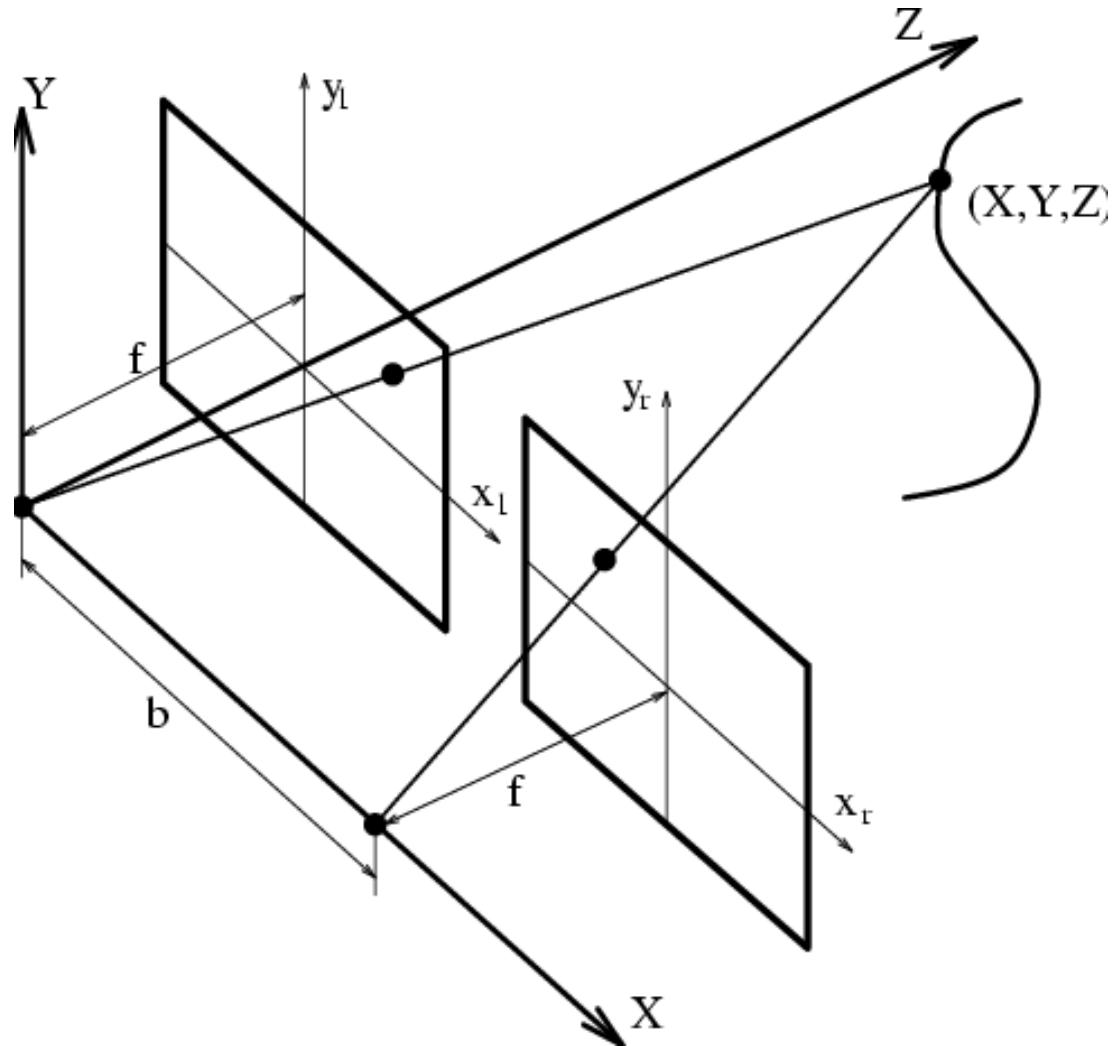
## Stereo

The underlying principle is “triangulation” :

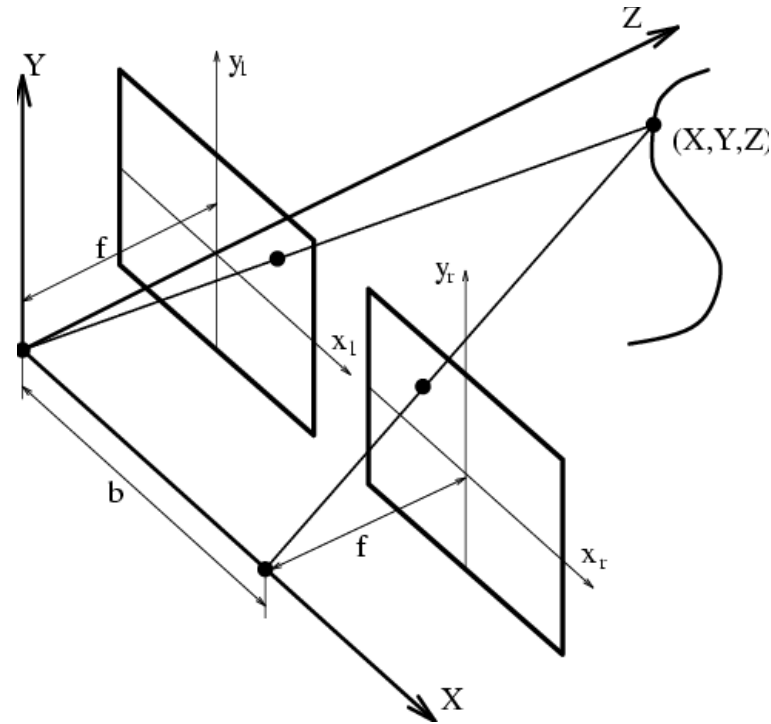


# (Passive) stereo

Simple configuration :



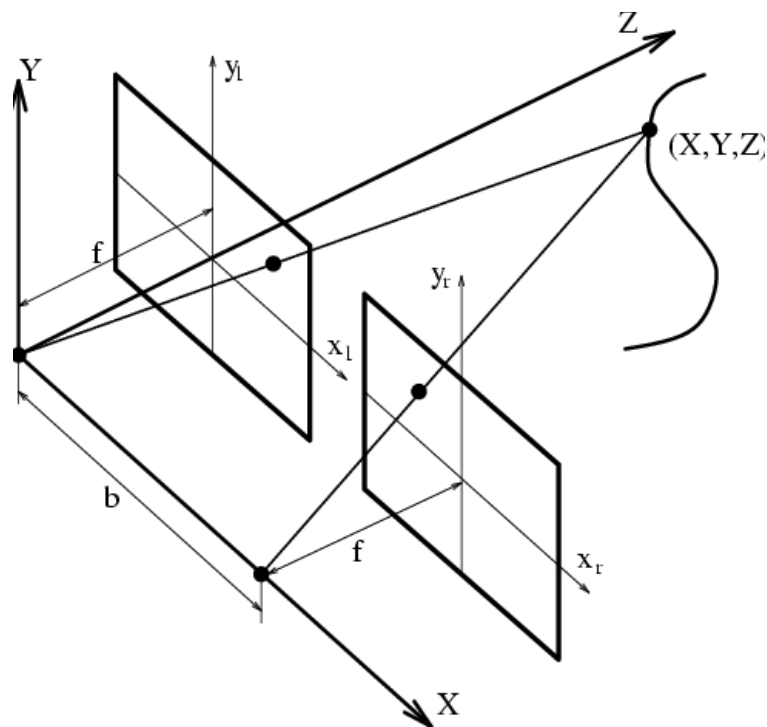
## A simple stereo setup



- identical cameras
- coplanar image planes
- aligned  $x$ -axes



## A simple stereo setup



Reminder :

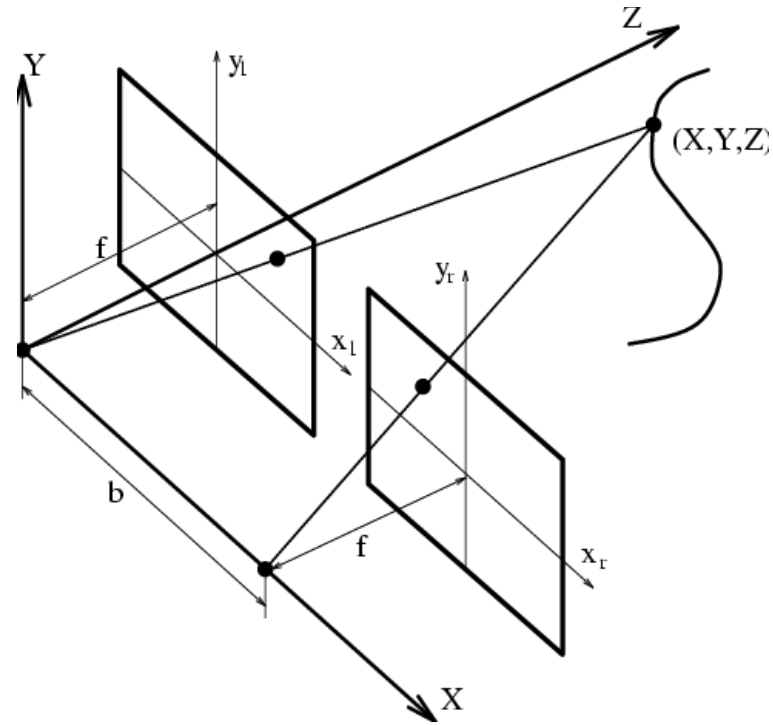
the camera projection can be formulated as

$$\rho p = KR^t (P - C) \quad \text{for some non-zero } \rho \in \mathbb{R}$$

Here  $R$  is the identity...



## A simple stereo setup

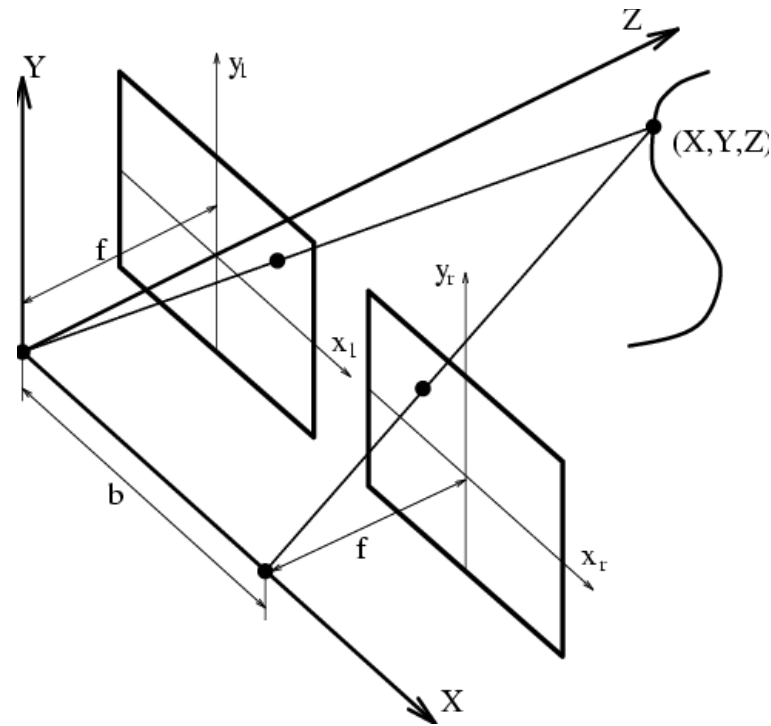


$$\rho \begin{pmatrix} x \\ y \\ 1 \end{pmatrix} = K \begin{pmatrix} X \\ Y \\ Z \end{pmatrix} \quad \rho' \begin{pmatrix} x' \\ y' \\ 1 \end{pmatrix} = K \begin{pmatrix} X - b \\ Y \\ Z \end{pmatrix} \quad K = \begin{pmatrix} fk_x & 0 & 0 \\ 0 & fk_y & 0 \\ 0 & 0 & 1 \end{pmatrix}$$





## A simple stereo setup



$$\begin{cases} x = \frac{fk_x X}{Z}, \\ y = \frac{fk_y Y}{Z}, \end{cases} \quad \text{and} \quad \begin{cases} x' = \frac{fk_x (X - b)}{Z}, \\ y' = \frac{fk_y Y}{Z}, \end{cases}$$

Note that  $y = y'$



## A simple stereo setup

The 3D coordinates of the point are

$$X = b \frac{x}{(x - x')},$$

$$Y = b \frac{k_x}{k_y} \frac{y}{(x - x')},$$

$$Z = bk_x \frac{f}{(x - x')}.$$

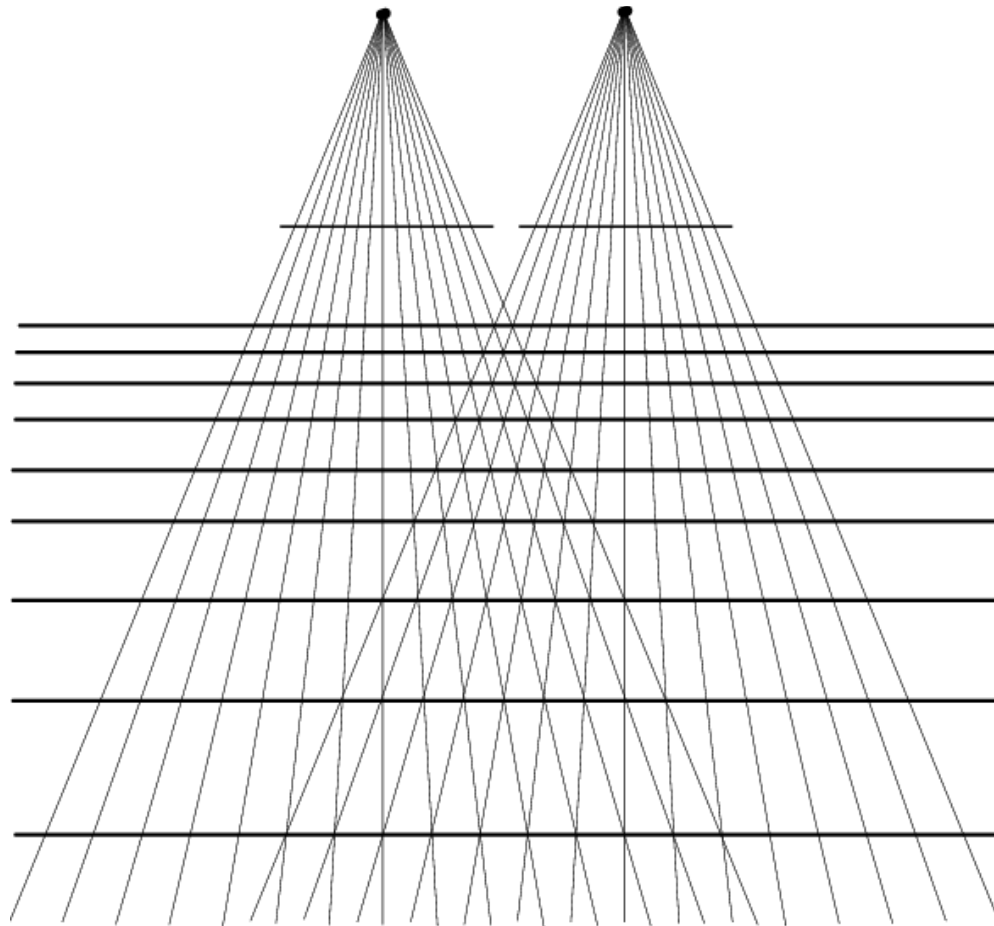
$(x - x')$  is the so-called *disparity*

Stereo is imprecise for far away objects, but increasing  $b$  and/or  $f$  can increase depth resolution

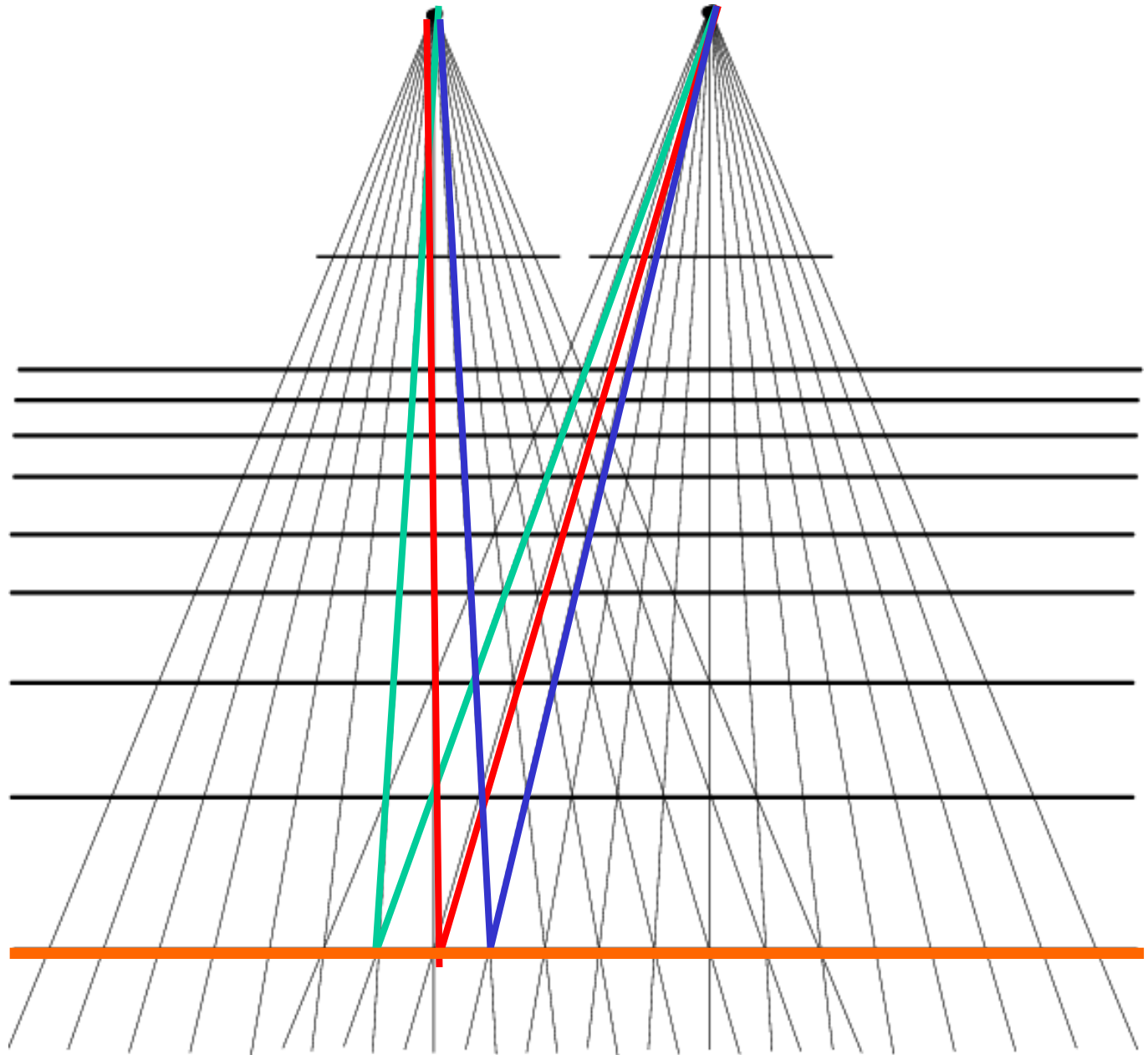


## A simple stereo setup

Notice: for this simple setup, same disparity means same depth

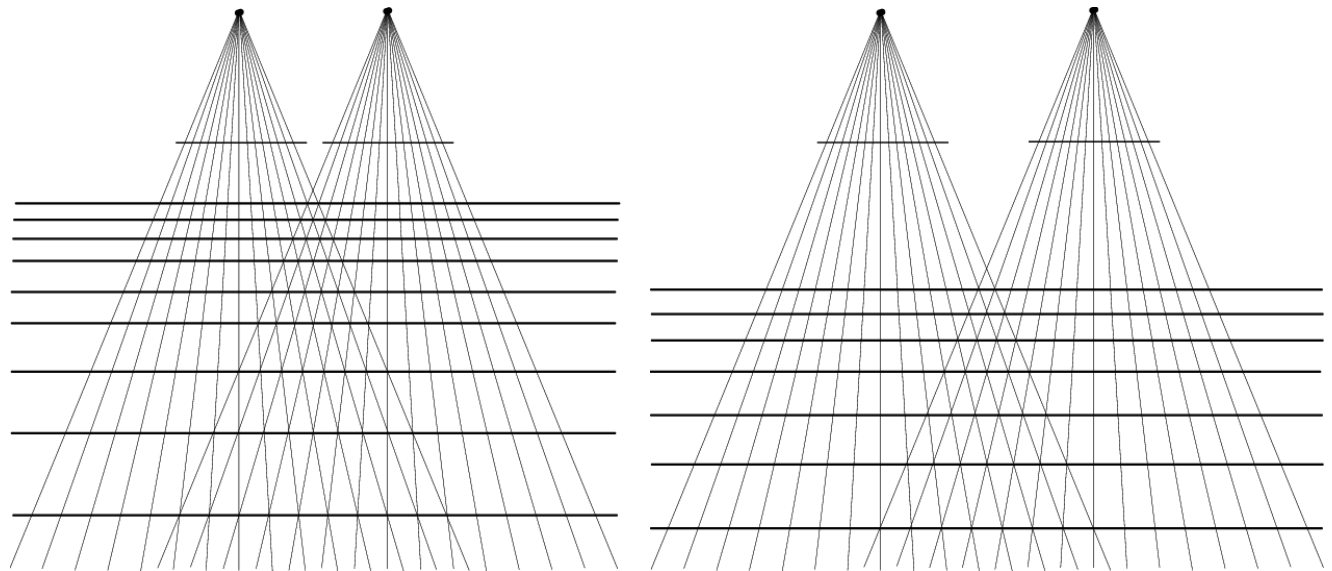


same disparity means same depth



## A simple stereo setup

Increasing  $b$  increases depth resolution

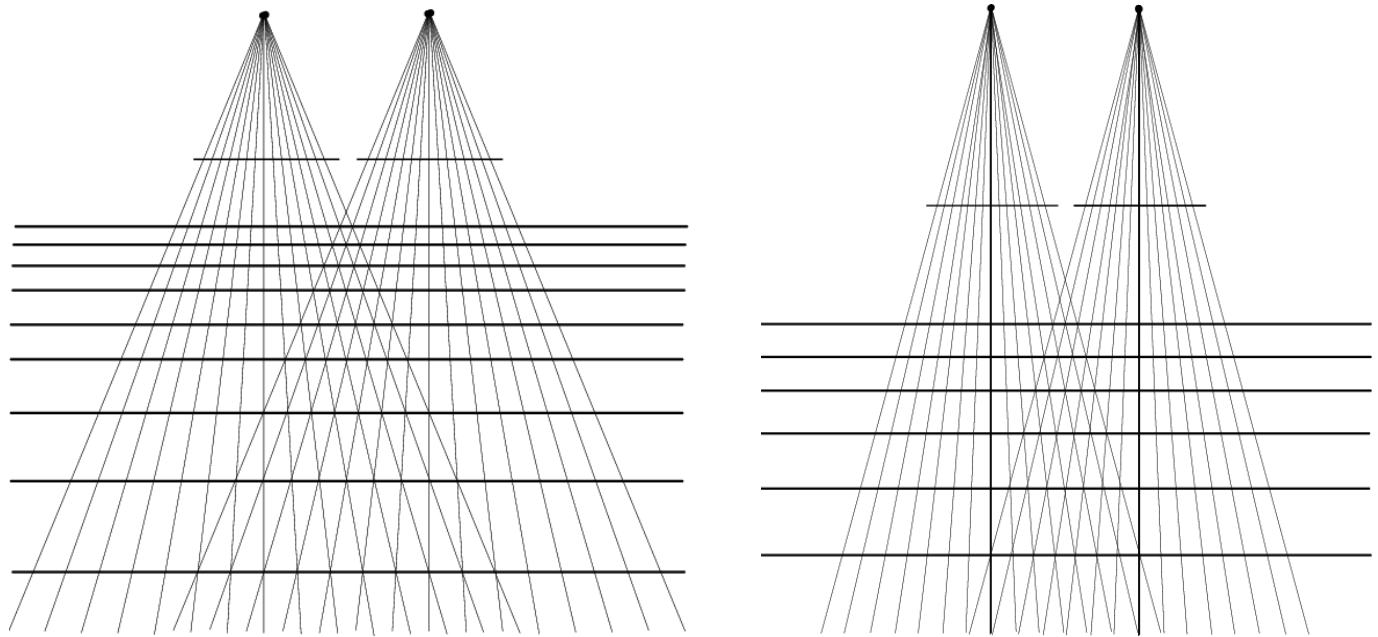


one has to strike a balance with visibility...



## A simple stereo setup

Increasing  $f$  increases depth resolution



one has to strike a balance with visibility...



## Remarks

- ❑ 1. increasing  $b$  and/or  $f$  increases depth resolution but reduces simultaneous visibility
- ❑ 2. iso-disparity loci are depth planes, not so for other configurations
- ❑ 3. human stereo vision only works up to  $\pm 10$  m
- ❑ 4. the real problem is finding correspondences



## A simple stereo setup



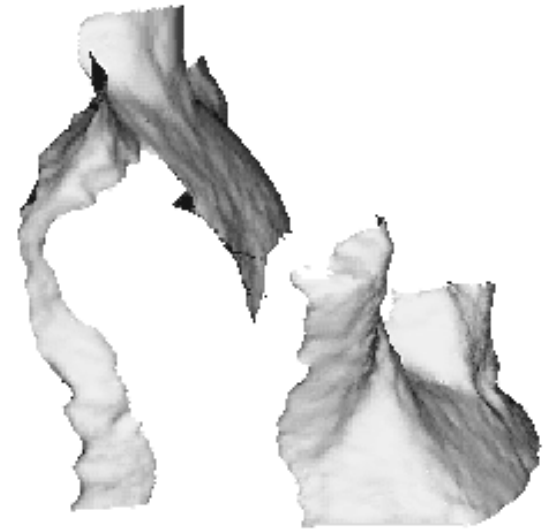
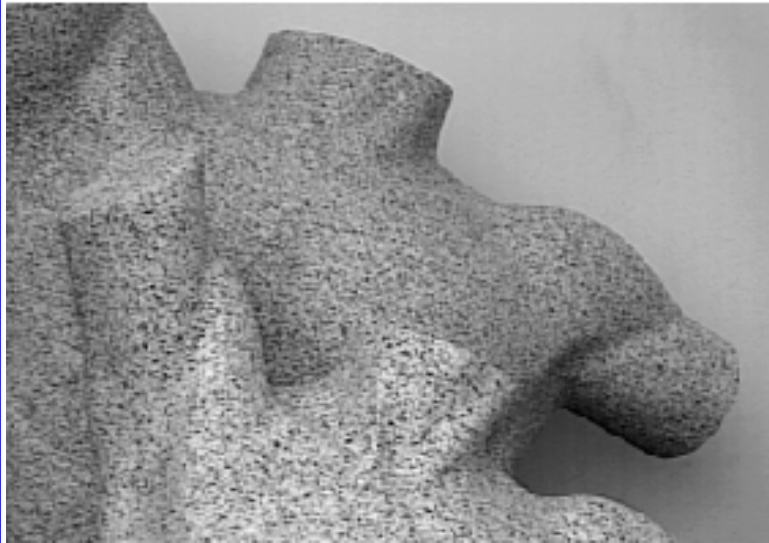
The HARD problem is finding the *correspondences*

**Notice** : no reconstruction for the untextured back wall...





## A simple stereo setup



The HARD problem is finding the *correspondences*

**Notice** : no reconstruction for the untextured  
back wall...





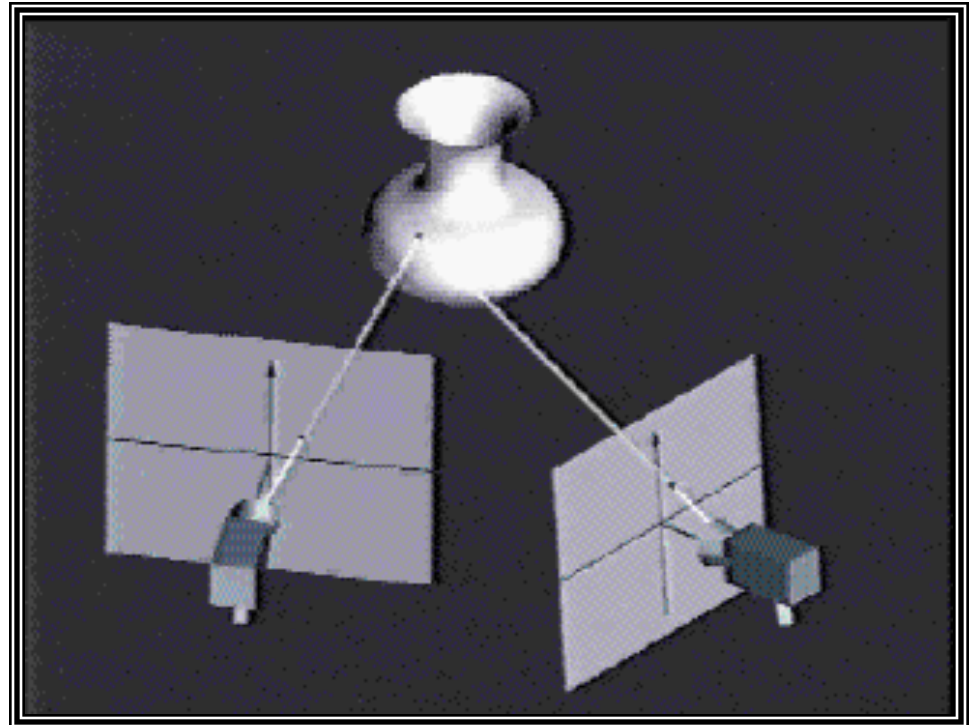
# Computer Vision



## Stereo, the general setup

we start by the relation between the two  
projections of a point

in the second image the point must be along  
the projection of the viewing ray for the first  
camera :



## Stereo, the general setup

We cast this constraint in mathematical expressions :

$p$  and  $p'$  are the two images of  $P$

$$\mu p = K R^t (P - C)$$

$$\rho' p' = K' R'^t (P - C')$$

w.r.t. world frame  $P$  is on the ray with equation

$$P = C + \mu R K^{-1} p \quad \text{for some } \mu \in \mathbb{R}$$



## Stereo, the general setup

so, the ray is given by

$$P = C + \mu RK^{-1}p \text{ for some } \mu \in \mathbb{R}$$

now we project it onto the second image  
in general, points project as follows :

$$\rho'p' = K'R'^t(P - C')$$

and thus, filling in the ray's equation

$$\rho'p' = \mu K'R'^t RK^{-1}p + K'R'^t(C - C')$$



## Stereo, the general setup

the projected ray was found to be

$$\rho' p' = \mu K' R'^t R K^{-1} p + K' R'^t (C - C')$$

the second term is the projection of the 1st camera's center, the so-called *epipole*

$$\rho'_e e' = K' R'^t (C - C')$$

the first term is the projection of the ray's point at infinity, the so-called *vanishing point*

finally, adopting the simplifying notation

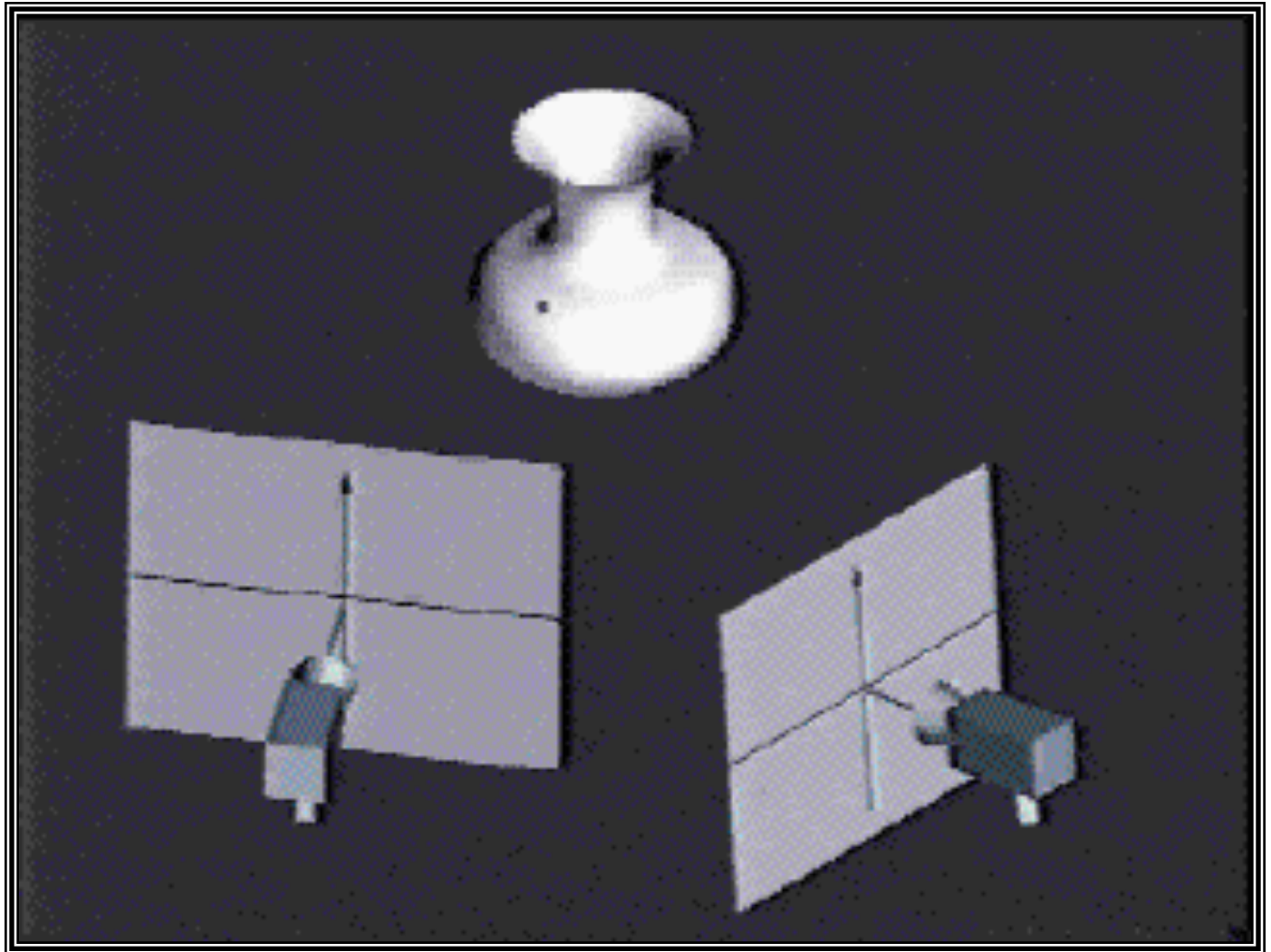
$$A = \frac{1}{\rho'_e} K' R'^t R K^{-1}$$
$$\rho' p' = \rho'_e (\mu A p + e')$$

$A$  is the *infinity homography*



## Stereo, the general setup

note that the epipole lies on all the epipolar lines





## Stereo, the general setup

$$\rho'p' = \rho'_e(\mu Ap + e')$$



## Stereo, the general setup

$$\rho' p' = \rho'_e (\mu A p + e')$$

expresses that  $p'$  lies on the line  $l'$  through the epipole  $e'$  and the vanishing point  $A p$  of the ray of sight of  $p$  (in the 2<sup>nd</sup> image)



## Stereo, the general setup

$$\rho' p' = \rho'_e (\mu A p + e')$$

*the epipolar constraint (epipolar line)*

we can rewrite this constraint as

$$|p' e' A p| = p'^t (e' \times A p) = 0$$



## Stereo, the general setup

$$|p'e'Ap| = p'^t(e' \times Ap) = 0$$

can be written, given

as

$$[e']_{\times} = \begin{pmatrix} 0 & -e'_3 & e'_2 \\ e'_3 & 0 & -e'_1 \\ -e'_2 & e'_1 & 0 \end{pmatrix}$$

$$|p'e'Ap| = p'^t [e']_{\times} Ap$$

$F = [e']_{\times} A$  is the *fundamental matrix*

$F$  is a 3x3 matrix, but has rank 2



## Stereo, the general setup

$$p'^t [e']_{\times} Ap = 0 \quad \rightarrow \quad p'^t F p = 0$$

The 3-vector  $p'^t F$  contains the line coordinates of the epipolar line of  $p'$  (i.e. a line in the 1st image)

The 3-vector  $F p$  contains the line coordinates of the epipolar line of  $p$  (i.e. a line in the 2nd image)

Hence, the epipolar matrix works in both directions



# Stereo, the general setup



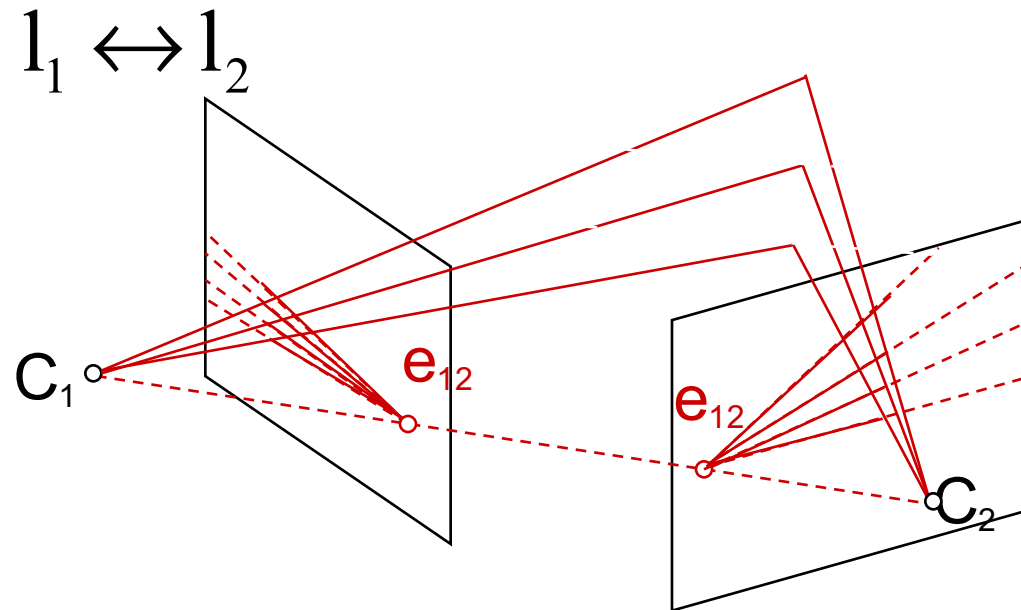
Andrea Fusiello, CVonline

# Epipolar geometry cont'd



## Epipolar geometry cont'd

- Epipolar lines are in mutual correspondence

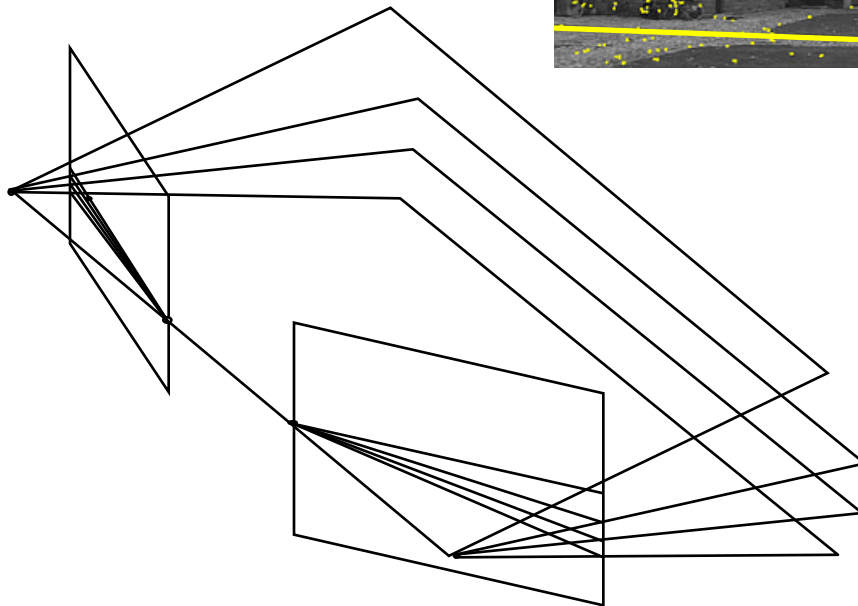


- allows to separate matching problem:  
matching pts on an epipolar line to pts on the  
corresponding epipolar line



## Exploiting epipolar geometry

Separate 2D correspondence search problem to 1D search problem by using two view geometry



# Epipolar geometry cont'd



## Stereo, the general setup

- ❑ one point yields one equation  $p'^t F p = 0$  that is linear in the entries of the fundamental matrix  $F$   
so, we can actually obtain  $F$  without any prior knowledge about camera settings if we have sufficient pairs of corresponding points !!
- ❑  $F$  can be computed *linearly* from 8 pairs of corresponding points,  
i.e. already from 8 `correspondences'  
(not 9, as this is a homogeneous system and one coefficient can be fixed to value 1 to fix the scale !)
- ❑  $F$  being rank 2 yields an additional, but non-linear constraint. Thus, 7 correspondences suffice to *non-linearly* solve for  $F$



## Stereo, the general setup

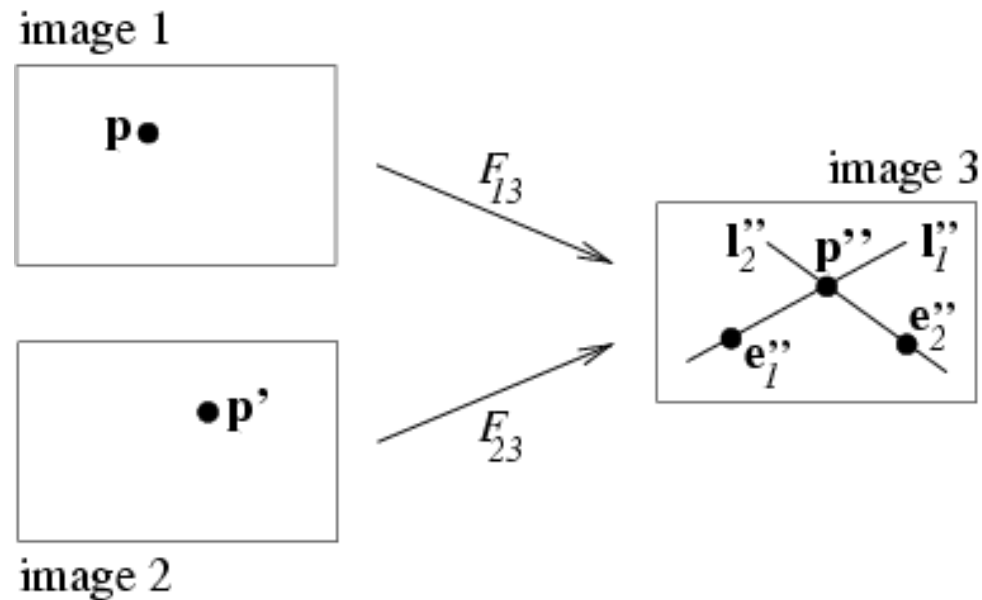
### Remarks :

- ❑ Of course, in practice one wants to use as many Correspondences as available, e.g. for obtaining a least-squares solution, based on the linear system, followed by a step to impose rank 2.
- ❑ Often,  $F$  is found through a procedure called RANSAC (RANDOM Sample Consensus). It starts from a randomly drawn subset of correspondences of minimal size (e.g. 8), and then keeps on drawing until a subset is found that yields an  $F$  so that many correspondences are seen to obey the epipolar constraint. RANSAC is good to fend off against correspondences that are wrong ('outliers')



## Relations between 3 views

one could use more than 2 images, e.g. 3  
suppose  $P$  projects to  $p, p'$ , and  $p''$   
 $p''$  is found at the intersection of epipolar lines :



fails when the epipolar lines coincide

⇒

*trifocal constraints*



# Computer Vision



## Correspondence problem : constraints

Reducing the search space :

- 1. Points on the epipolar line
- 2. Min. and max. depth  $\Rightarrow$  line segment
- 3. Preservation of order
- 4. Smoothness of the disparity field



## Correspondence problem : methods

### 1. correlation

- ❑ deformations...
- ❑ small window  $\Rightarrow$  noise!
- ❑ large window  $\Rightarrow$  bad localisation

### 2. feature-based

- ❑ mainly edges and corners
- ❑ sparse depth image

### 3. regularisation methods





## Stereo, the general setup

3D reconstruction

$$P = C + \mu R K^{-1} p$$

$$P = C' + \mu' R' K'^{-1} p'$$

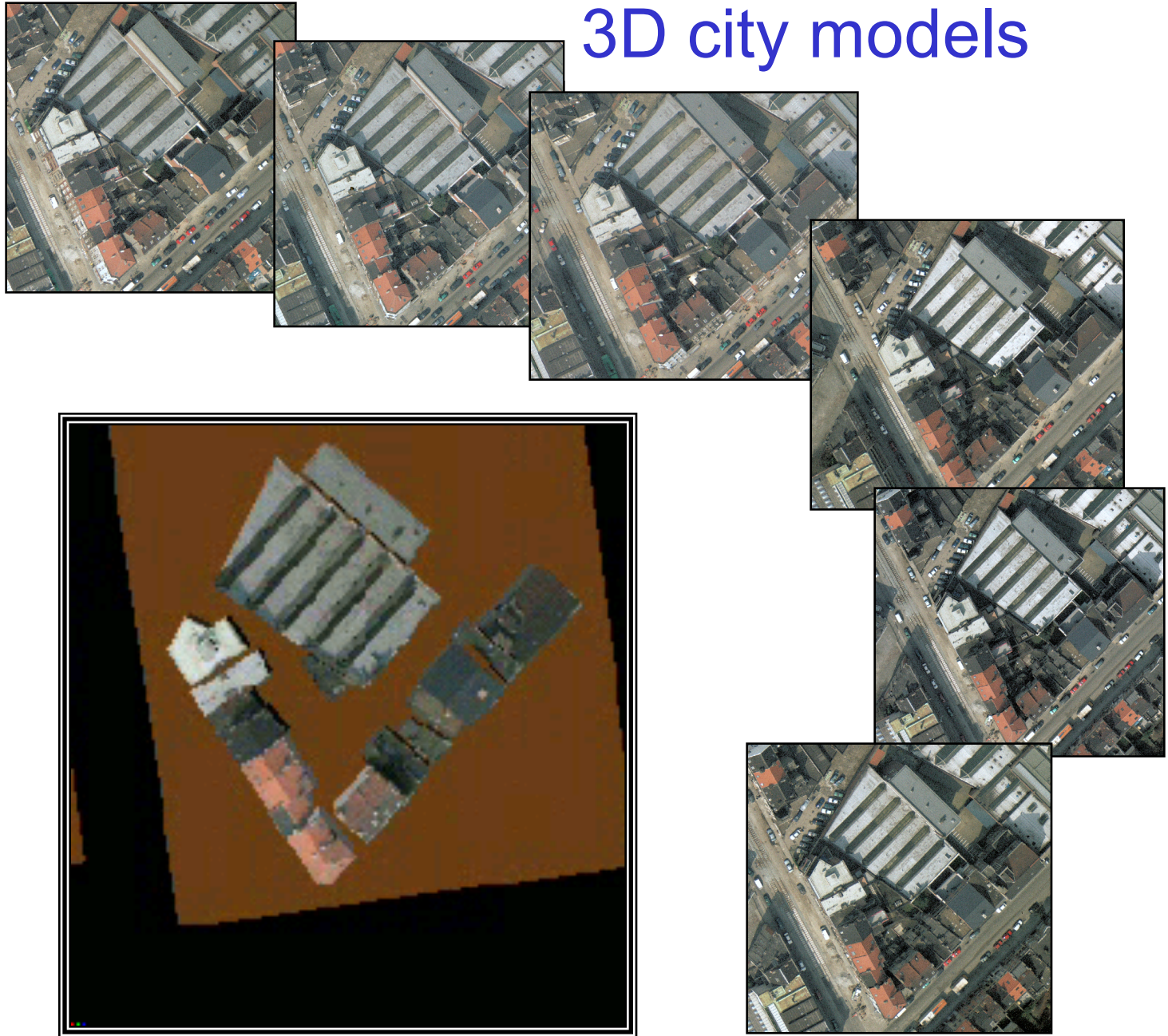
Yields 6 equations in 5 unknowns  $X, Y, Z$   
and  $\mu, \mu'$

However, due to noise and errors, the rays may  
not intersect!

⇒ e.g. use the middle where the rays come  
closest



# 3D city models



# 3D city models – ground level

Mobile mapping example – for measuring

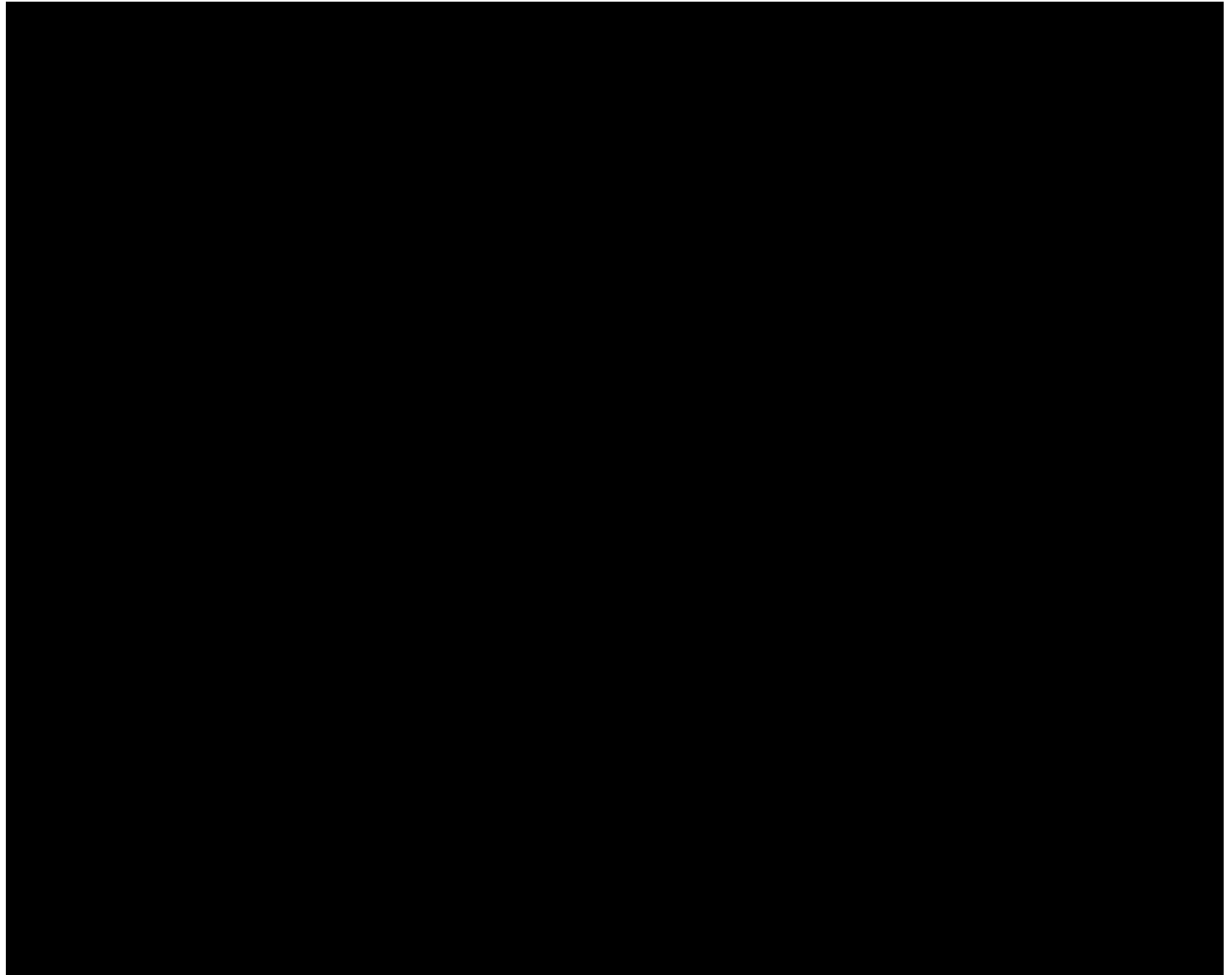


## 3D city models – ground level

Can also be turned into 3D for visualisation, but one needs to stay close to the camera viewpoints.

The example shown is of Quebec

# 3D city models – ground level



# Uncalibrated reconstruction

From 2 views...



If the camera  
translates...

**An affine reconstruction can be made**

**A projective reconstruction is always possible**

(if no pure rot.)



# Uncalibrated reconstruction

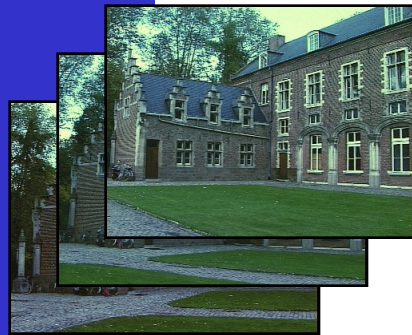
From 3 general views  
taken with the same camera parameters...



**A metric reconstruction is possible**



# Uncalibrated reconstruction



**Tracking  
and  
Calibration**

**Dense  
depth  
estimation**

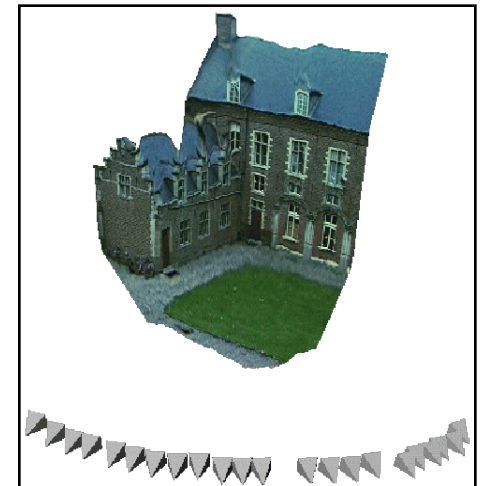
**3D  
surface  
modeling**



Points and cameras



Depth map



3D models



# Uncalibrated reconstruction



## Uncalibrated reconstruction - example



Univ. of Leuven



## **Input Images**

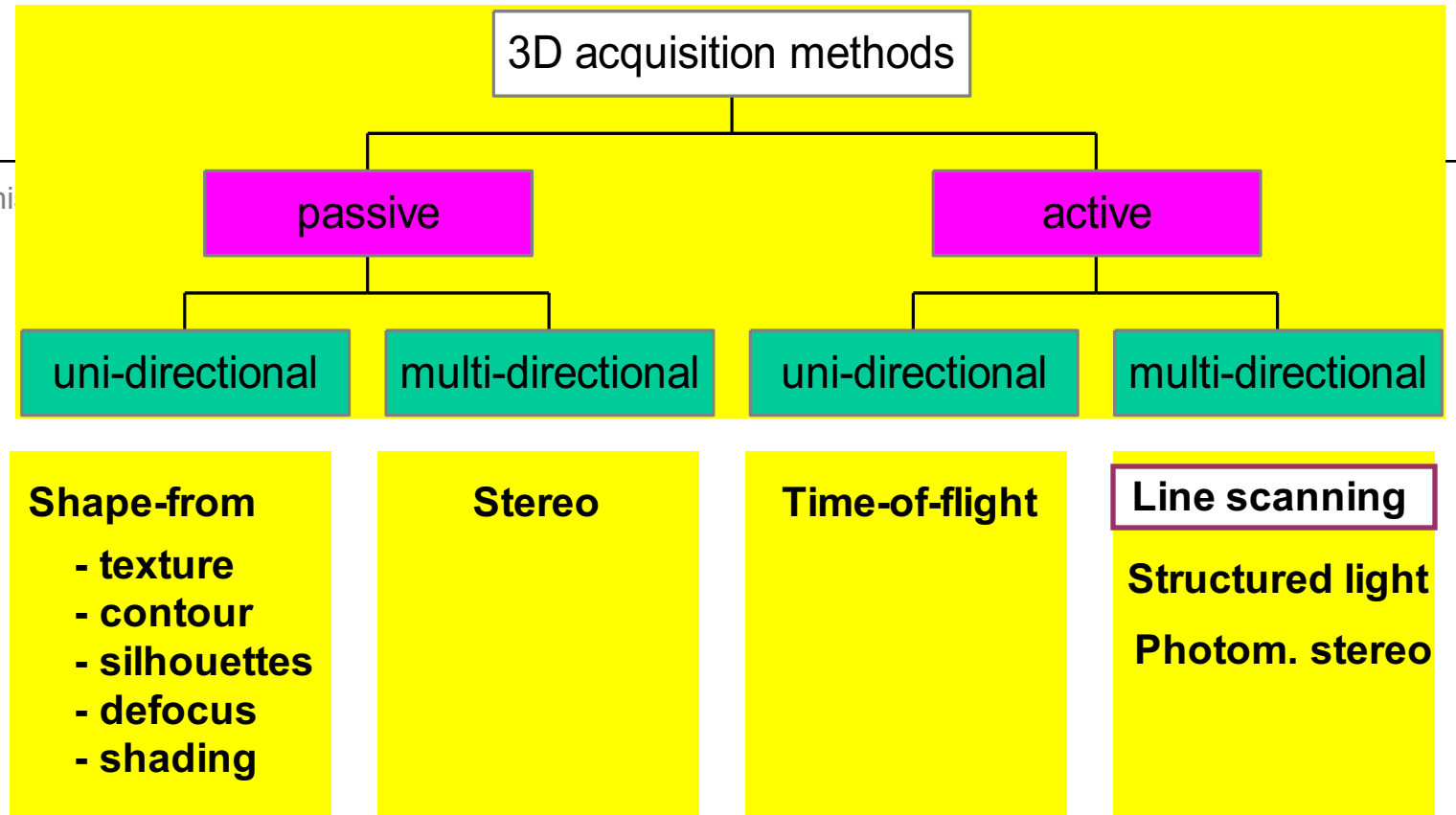
shots taken with Canon EOS D60

(Resolution: 6,3 Megapixel )

**[www.arc3d.be](http://www.arc3d.be)**

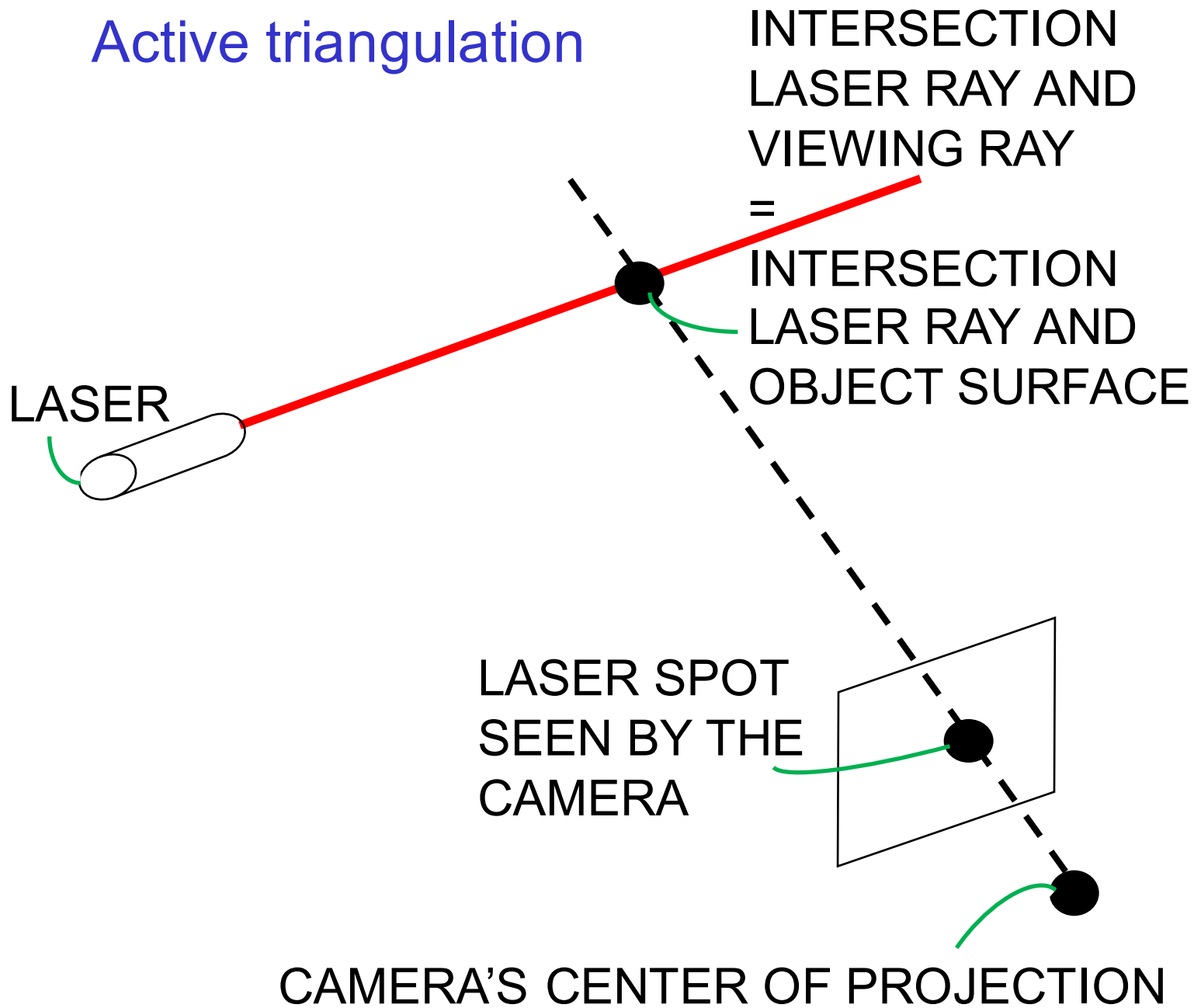
Webservice,  
free for non-commercial use

# 3D acquisition taxonomy

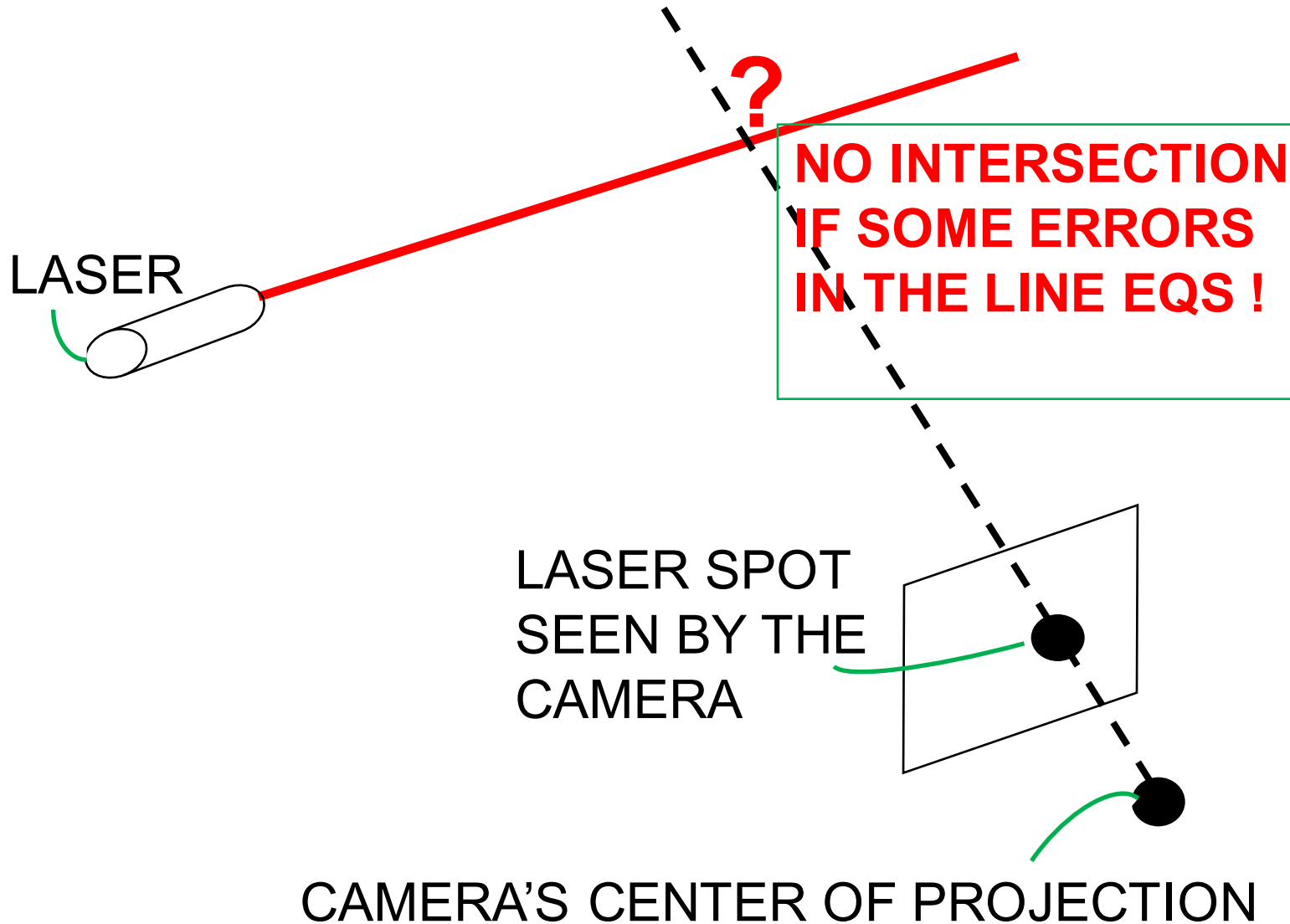


This

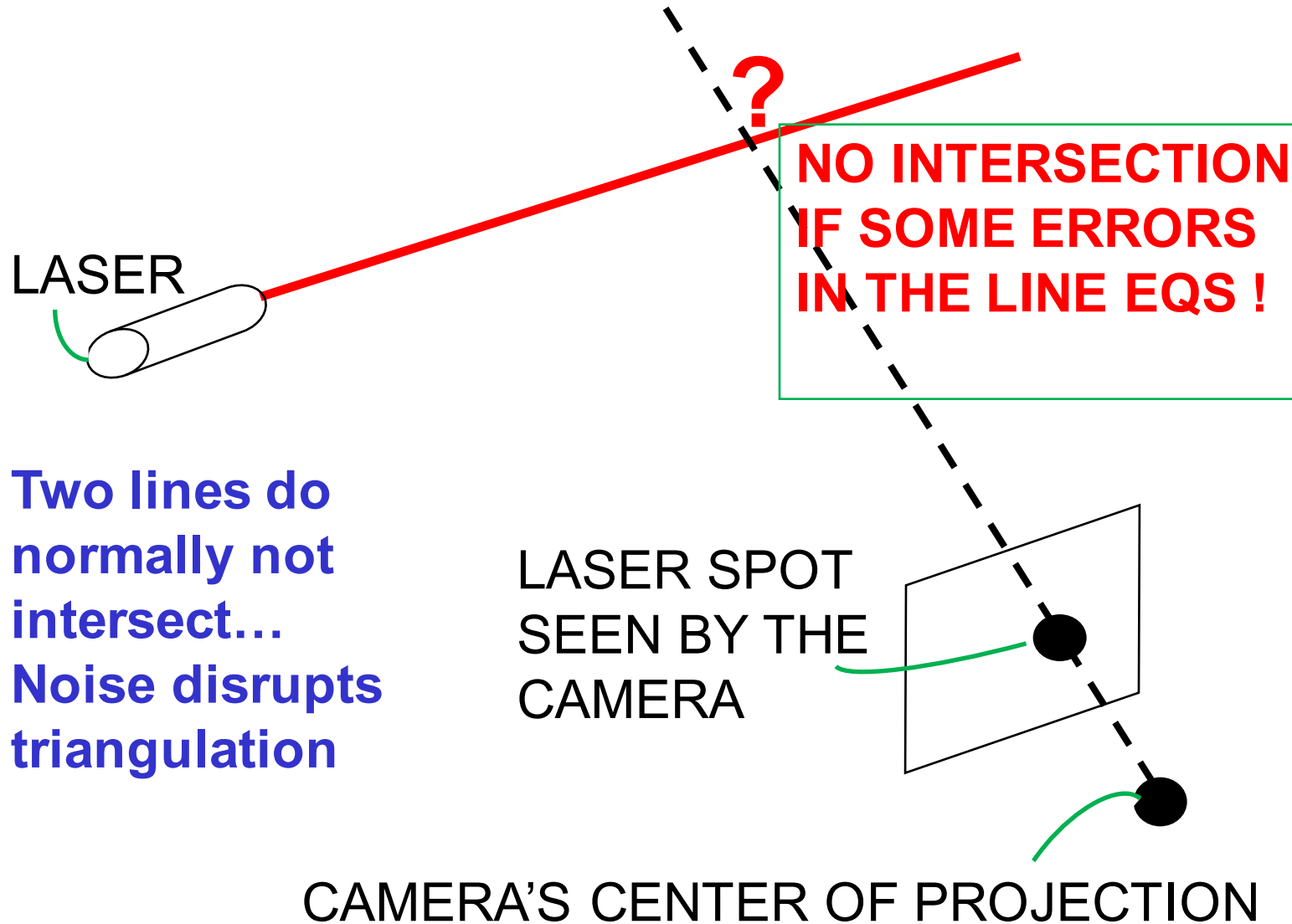
# Active triangulation



# Active triangulation



# Active triangulation





# Active triangulation

LASER WITH  
CYLINDRICAL  
LENS IN  
FRONT

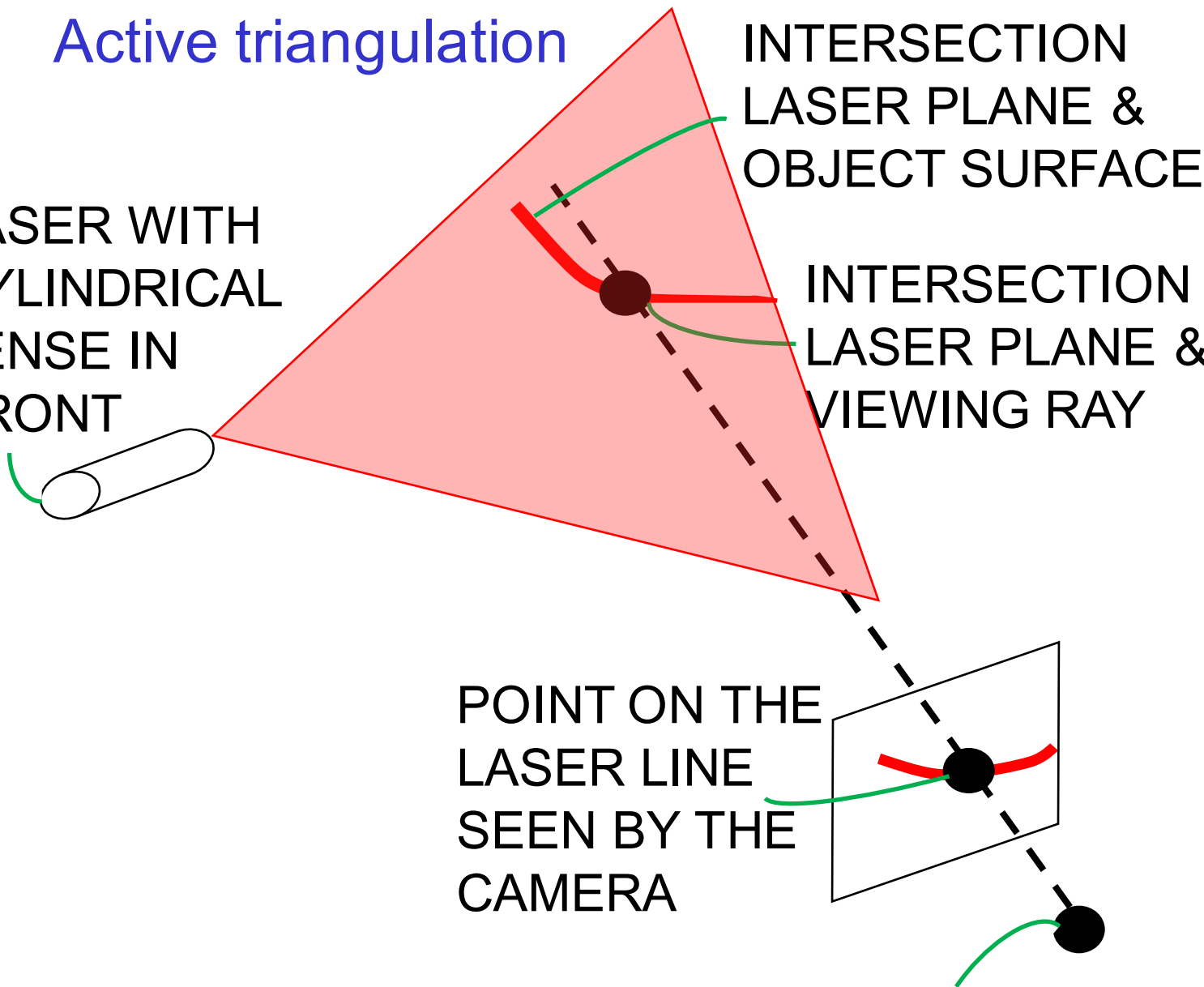


INTERSECTION  
LASER PLANE &  
OBJECT SURFACE

INTERSECTION  
LASER PLANE &  
VIEWING RAY

POINT ON THE  
LASER LINE  
SEEN BY THE  
CAMERA

CAMERA'S CENTER OF PROJECTION



## Active triangulation

LASER WITH  
CYLINDRICAL  
LENS IN  
FRONT

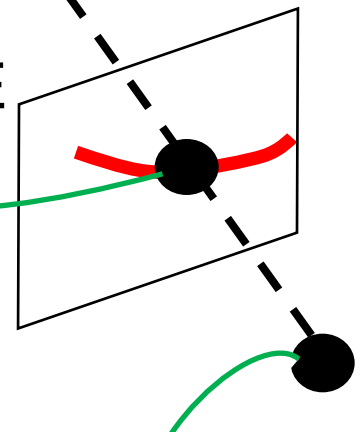


INTERSECTION  
LASER PLANE &  
OBJECT SURFACE

INTERSECTION  
LASER PLANE &  
VIEWING RAY

**A plane and a  
line do normally  
intersect...  
Noise has little  
influence on the  
triangulation**

POINT ON THE  
LASER LINE  
SEEN BY THE  
CAMERA



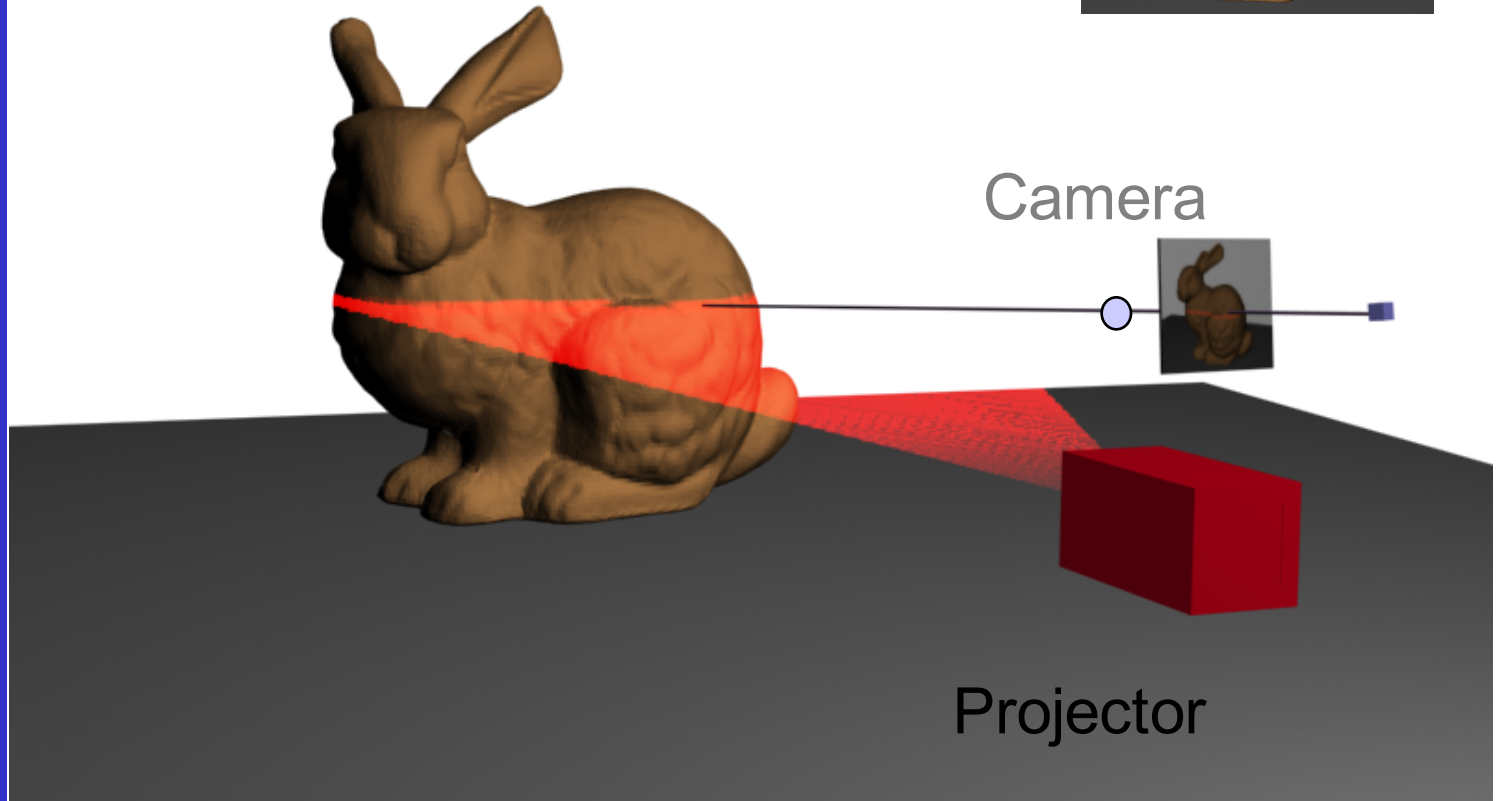
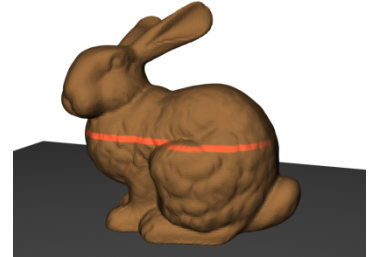
CAMERA'S CENTER OF PROJECTION

## Active triangulation



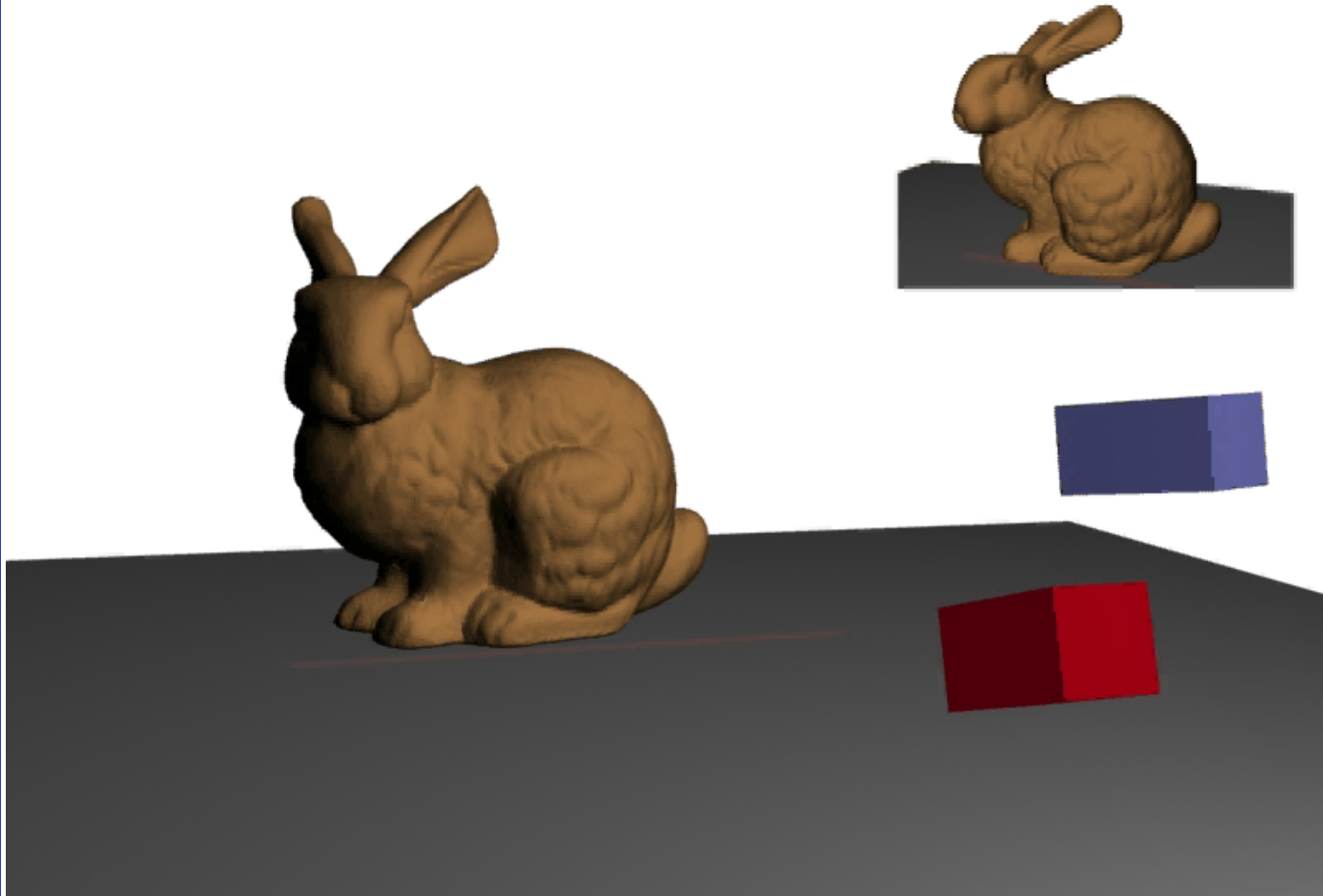
## Active triangulation

Triangulation  $\rightarrow$  3D measurements

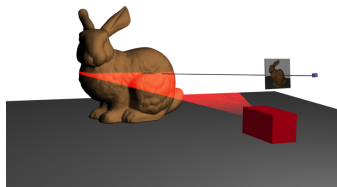
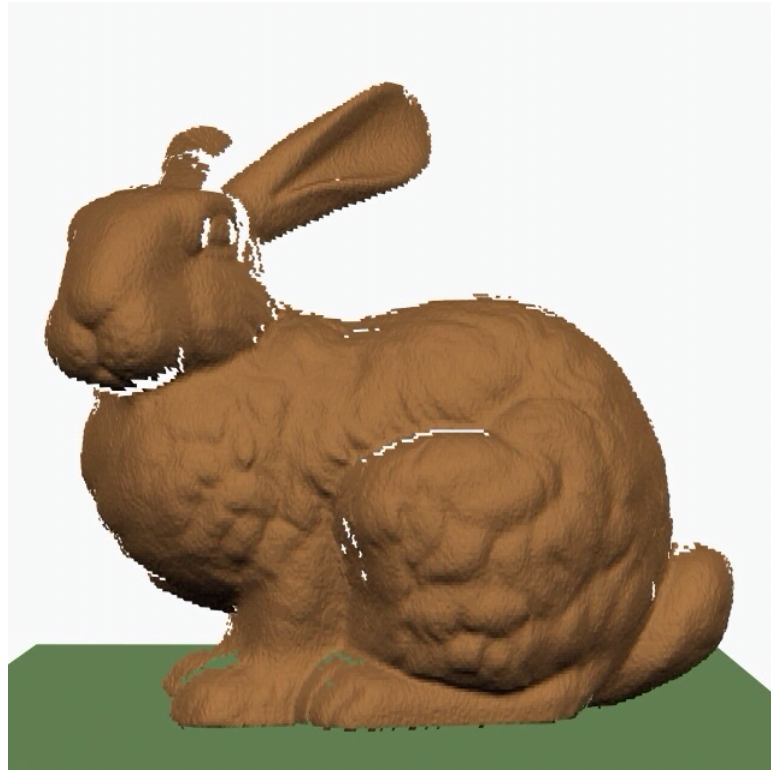


# Active triangulation

Camera image

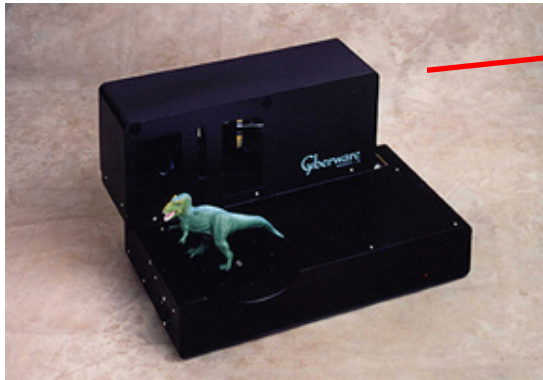


# Active triangulation



# Active triangulation

## Example 1 Cyberware laser scanners



Desktop model  
for small objects

Medium-sized objects



Body scanner

Head scanner



## Active triangulation

### Example 2 Minolta

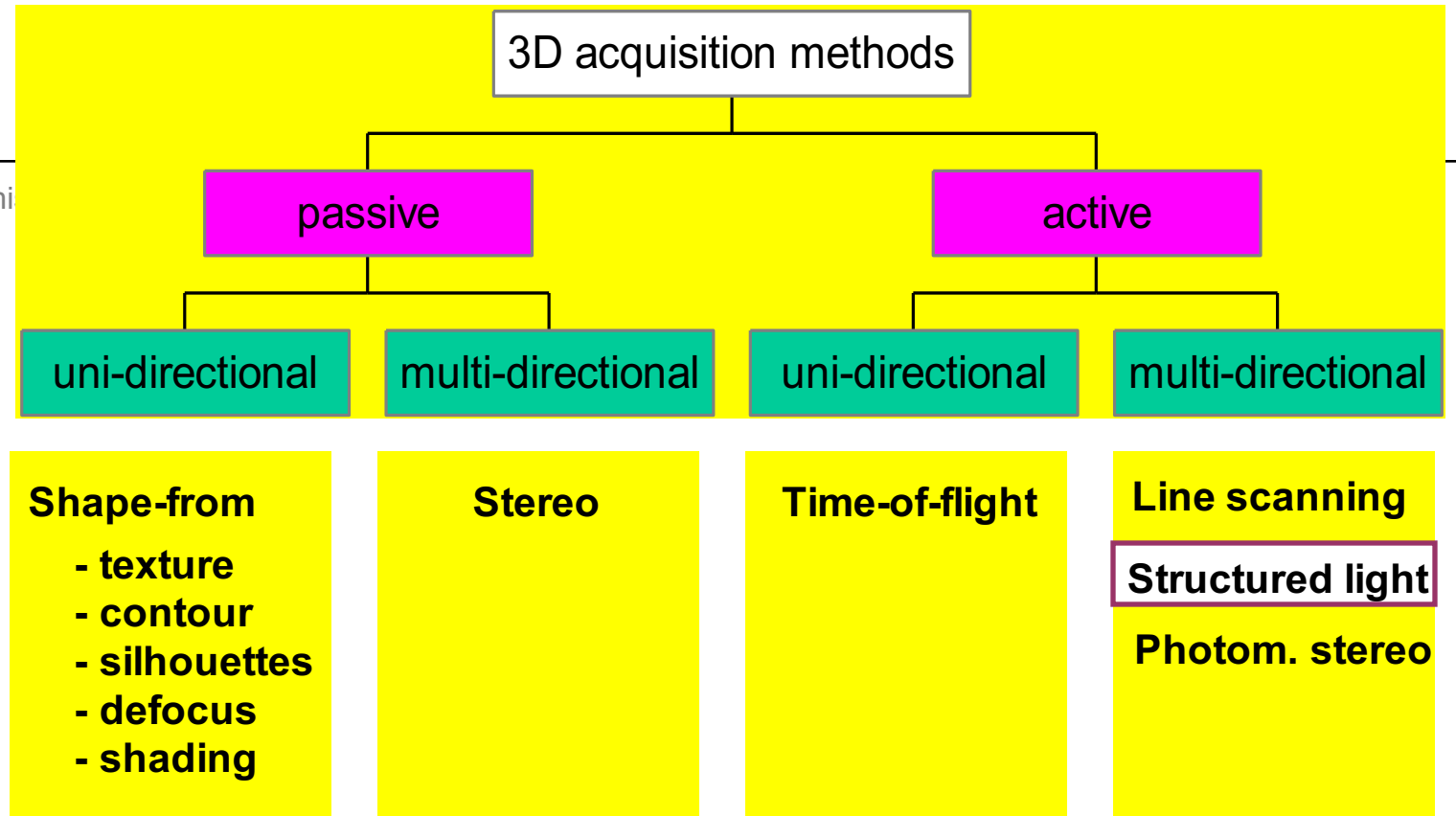


Portable desktop model





# 3D acquisition taxonomy



This

## Structured light

patterns of a special shape are projected onto the scene

deformations of the patterns yield information on the shape

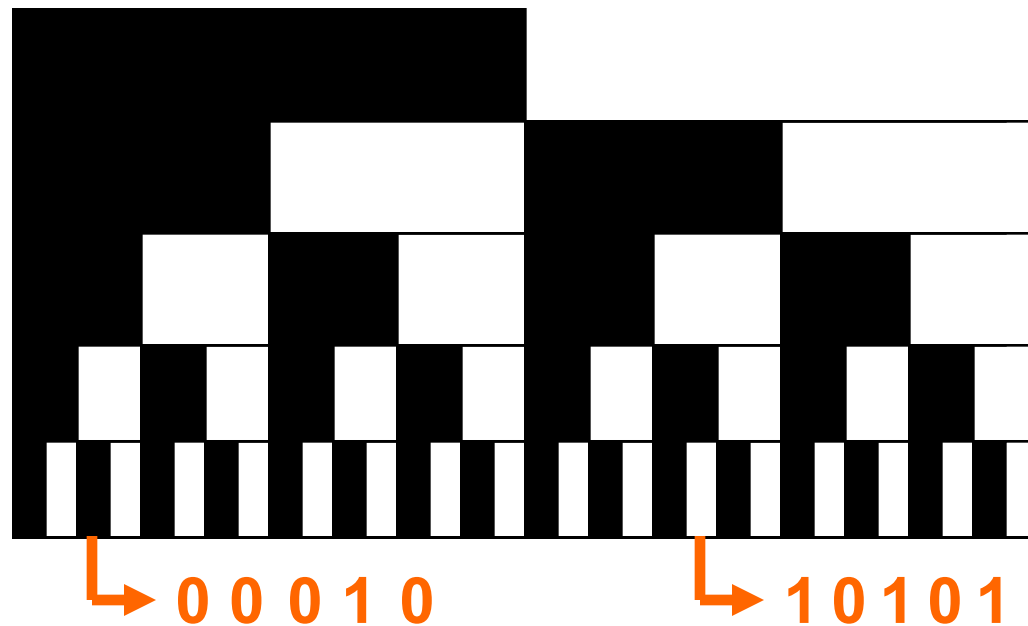
Focus is on combining a good resolution with a minimum number of pattern projections



## Serial binary patterns

A sequence of patterns with increasingly  
fine subdivisions

Yields  $2^n$  identifiable lines for only  $n$  patterns



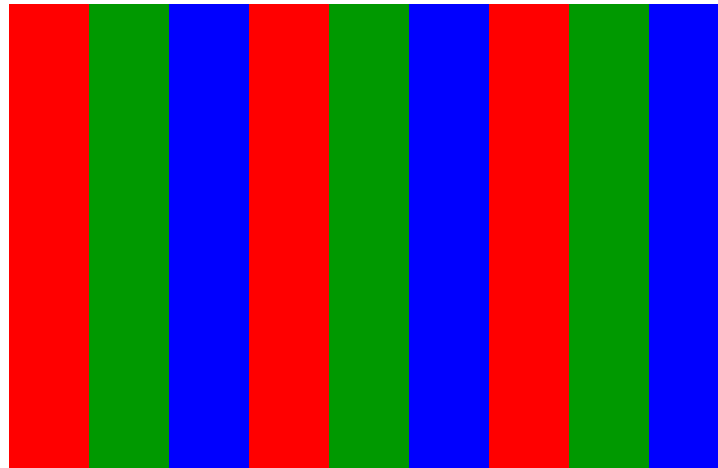
## Reducing the nmb of projections: colour

Binary patterns

Yields  $2^n$  identifiable lines for only  $n$  patterns

Using colours, e.g. 3,

Yields  $3^n$  identifiable lines for only  $n$  patterns



**Interference from object colours...**



# One-shot implementation

3D from a single frame – KULeuven '96:

① projector



② camera



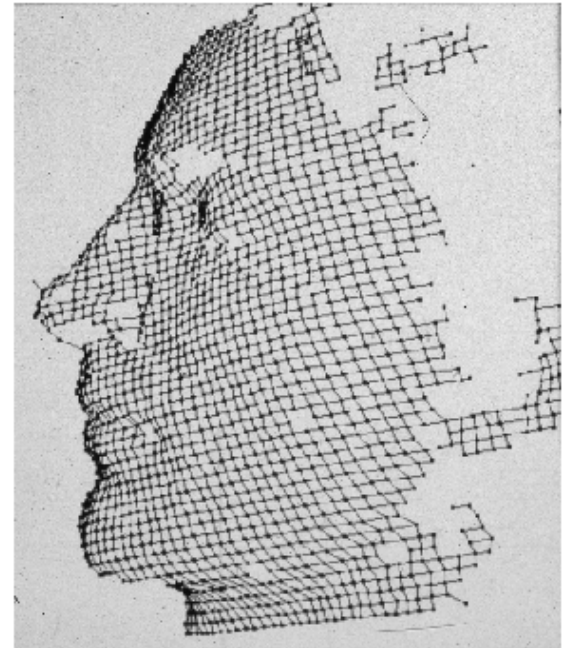
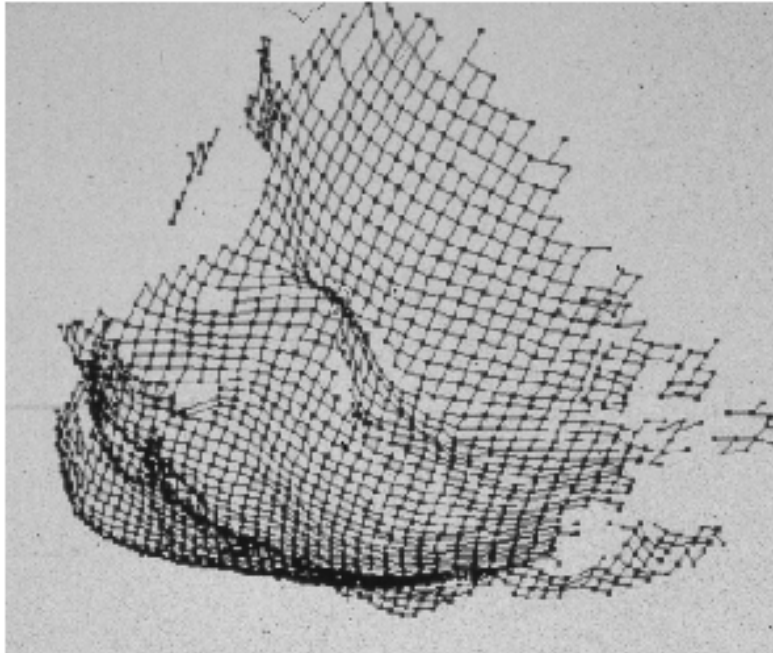
## One-shot implementation

KULeuven '81: checkerboard pattern with column code

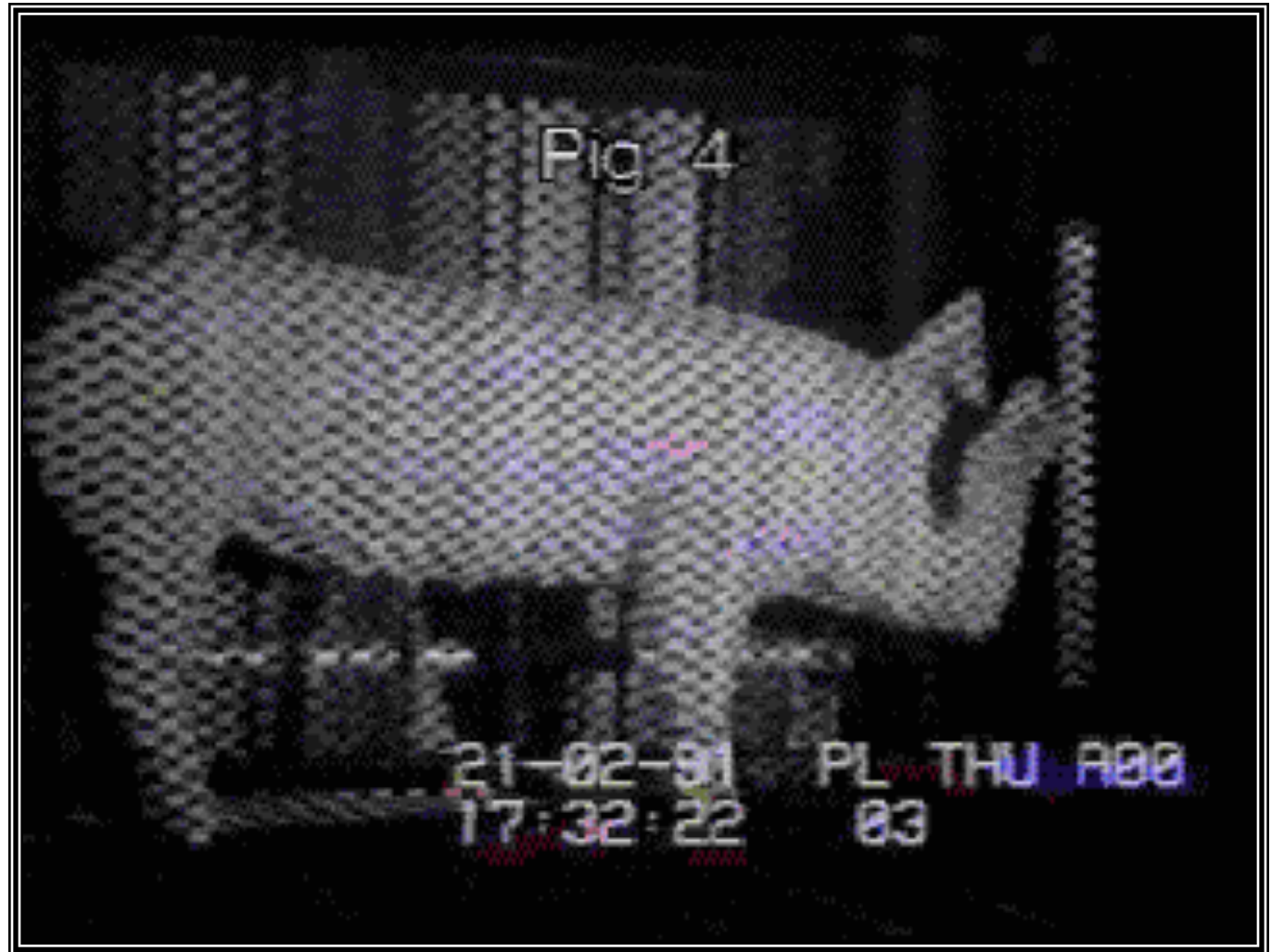
example :



## 3D reconstruction for the example



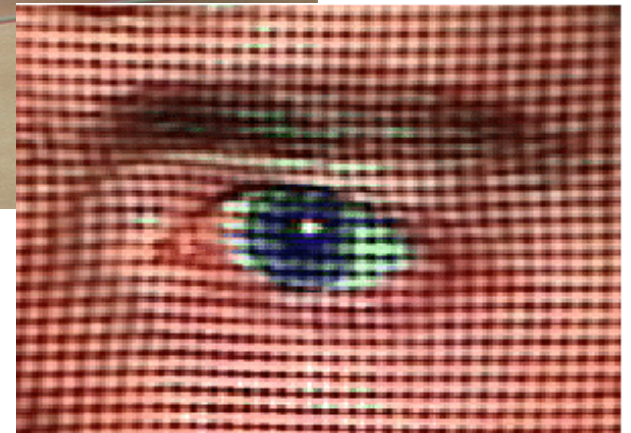
## An application in agriculture





# One-shot 3D acquisition

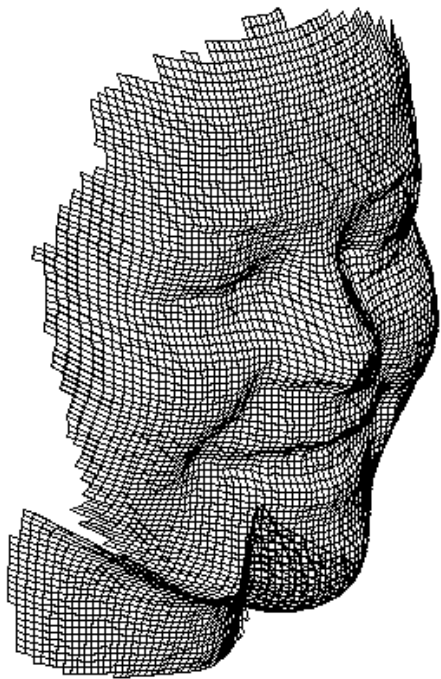
## Leuven ShapeCam



## Shape + texture often needed

Higher resolution

Texture is also extracted



Computer  
Vision

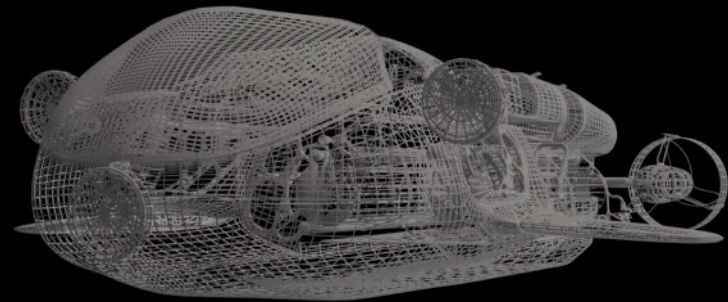


James Bond

Die another day

Lara Croft

Thomb  
Raider



## Active triangulation

Recent, commercial example



**KINECT**  
for  XBOX 360.

Kinect 3D camera, affordable  
and compact solution by Microsoft.

Projects a 2D point pattern in the NIR,  
to make it invisible to the human eye



# Kinect: 9x9 patches with locally unique code



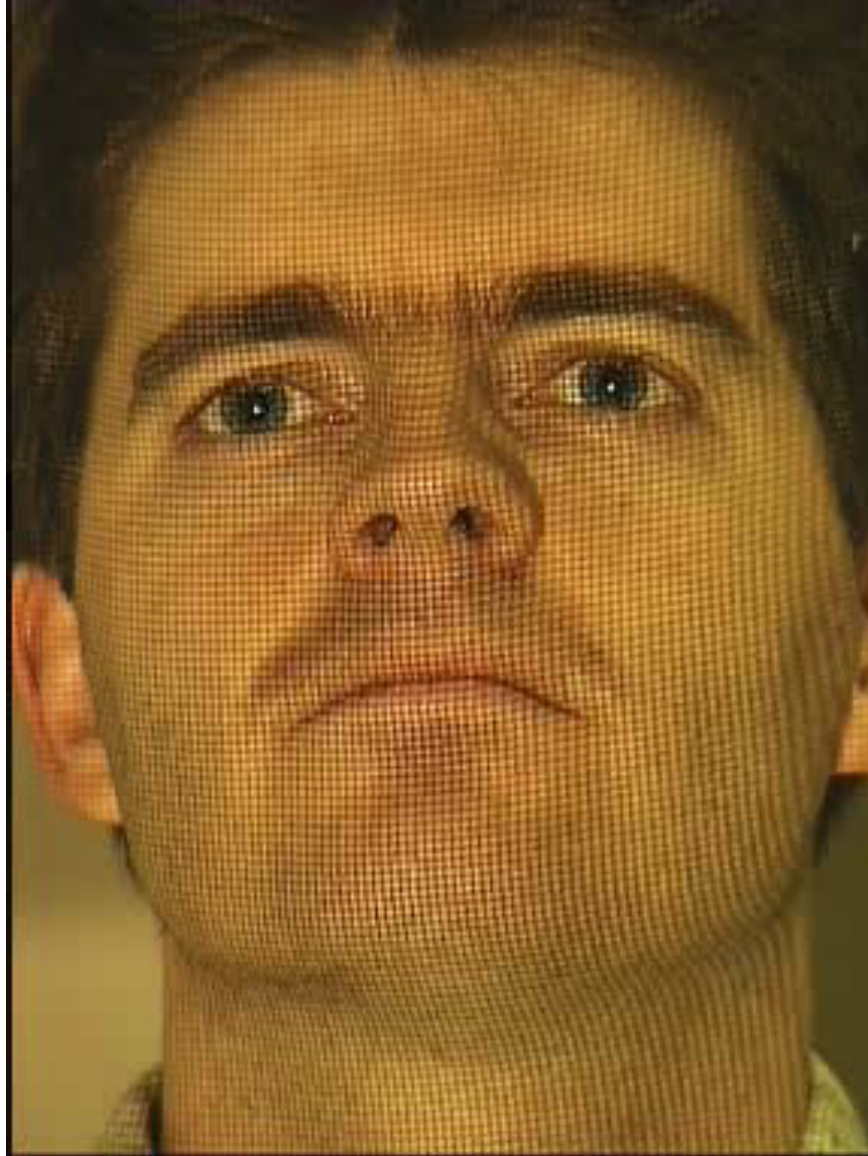
## Kinect as one-shot, low-cost scanner

Excerpt from the dense NIR dot pattern:



<http://research.microsoft.com/apps/video/default.aspx?i>

## Face animation - input



# Face animation – replay + effects

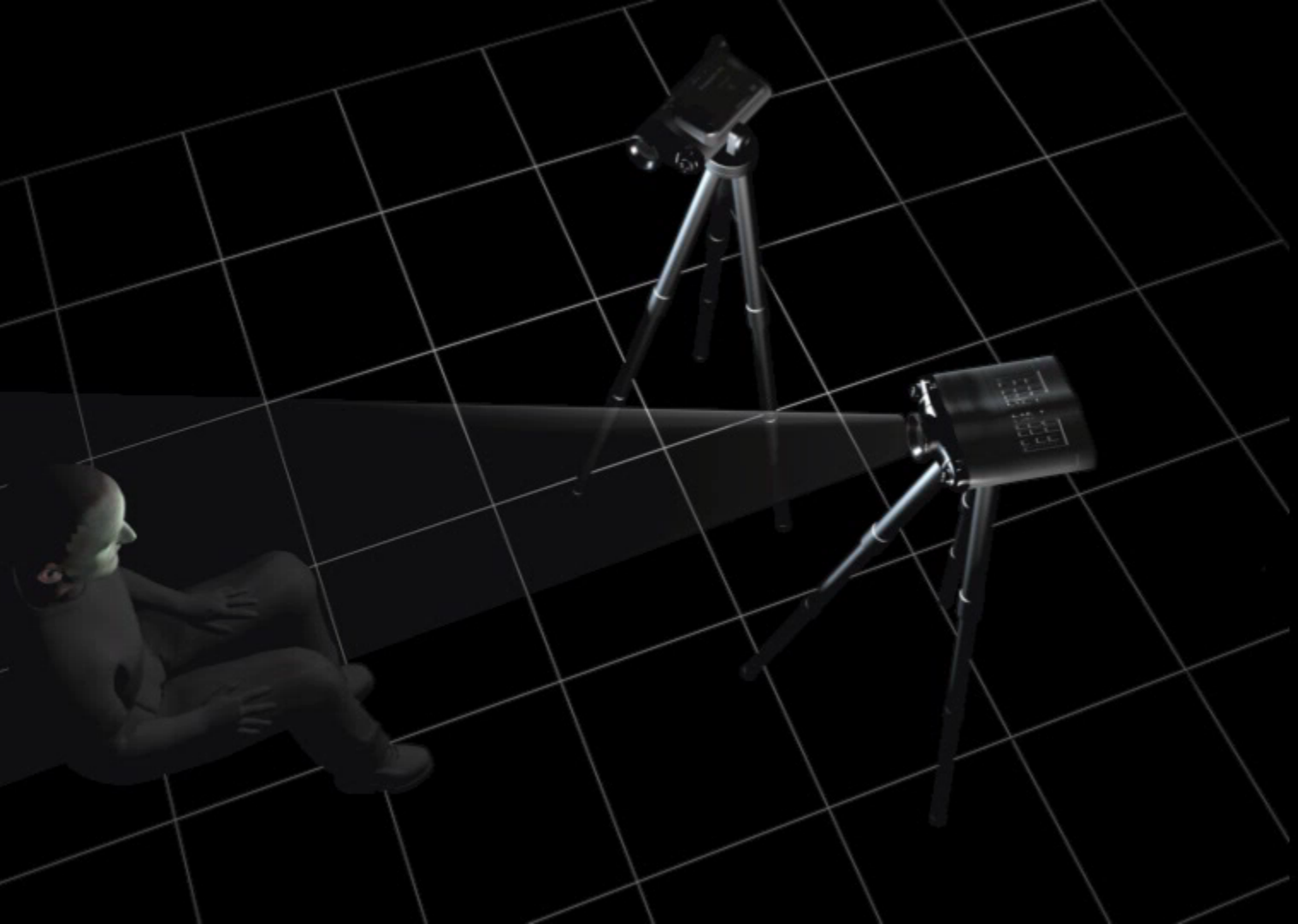




# Facial motion capture

motion capture for *League of Extraordinary Gentlemen*

SETUP



# Facial motion capture



COMPUTERCAFE

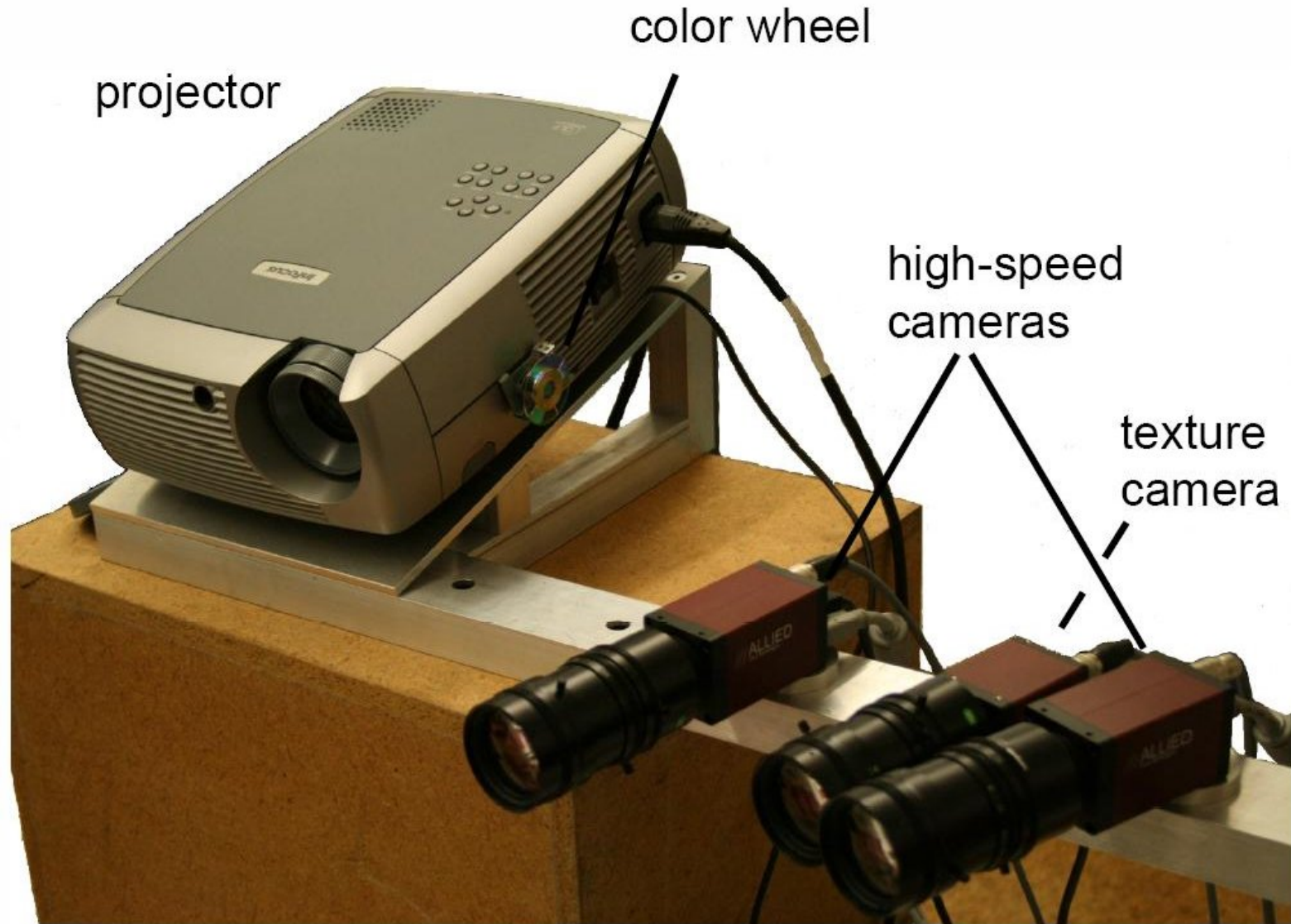


LC015 Eyetronics  
Face Capture Test V01

1 / 291

03 / 11 / 2003

# Phase shift



# Phase shift

$$I_r = A + R \cos (\phi - \theta)$$

$$I_g = A + R \cos (\phi)$$

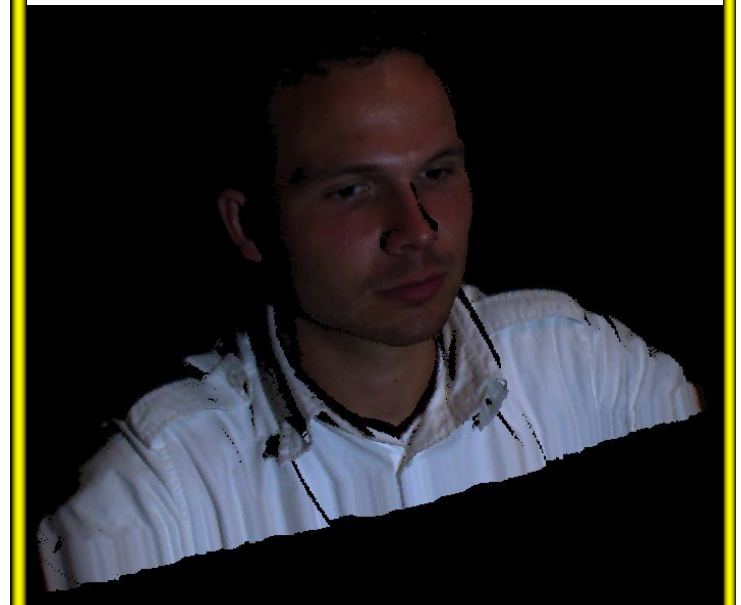
$$I_b = A + R \cos (\phi + \theta)$$

1. detect phase from 3 subsequently projected cosine patterns, shifted over 120 degrees
2. unwrap the phases / additional stereo
3. texture is obtained by summing the 3 images / color camera w. slower integration

# Phase shift

$$A = \frac{I_r + I_g + I_b}{3}$$

$$\phi = \arctan \left( \tan \left( \frac{\theta}{2} \right) \frac{I_r - I_b}{2I_g - I_r - I_b} \right)$$



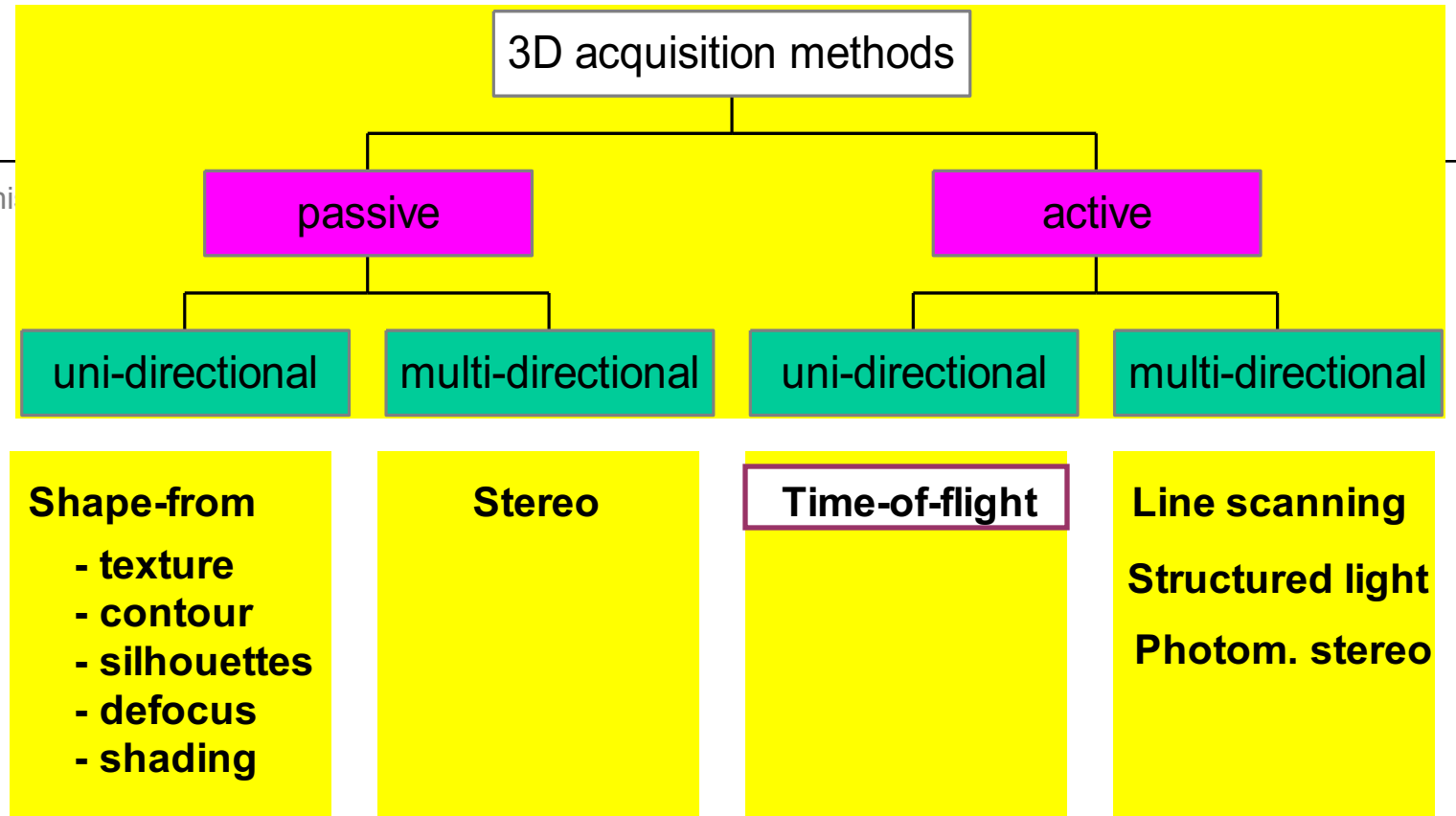
# 4D acquisition

Motion retargetting, from 3D phase shift scans

Face/Off: Live Facial Puppetry

PaperID 102

# 3D acquisition taxonomy



This

## Time-of-flight

measurement of the time a modulated light signal needs to travel before returning to the sensor

this time is proportional to the distance

waves :

- |                         |                           |
|-------------------------|---------------------------|
| 1. <i>radar</i>         | low freq. electromagnetic |
| 2. <i>sonar</i>         | acoustic waves            |
| 3. <i>optical radar</i> | optical waves             |

working principles :

1. pulsed
2. phase shifts



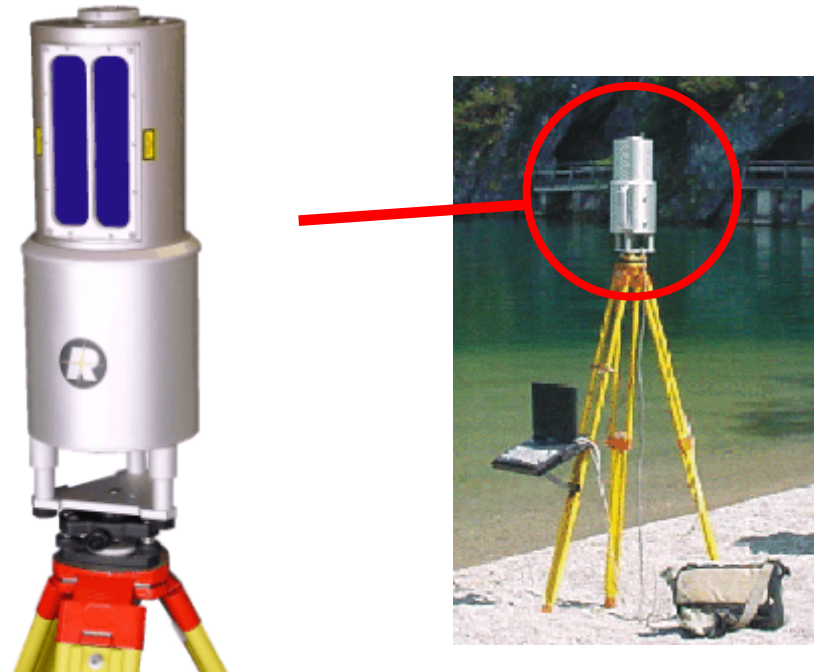


# Time-of-flight

Example 1: Cyrax



Example 2: Riegl



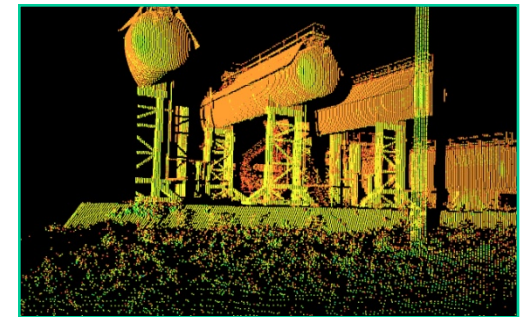
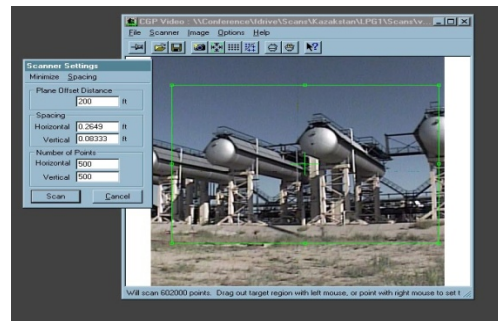
Time-of-flight: example

***Cyrax***™

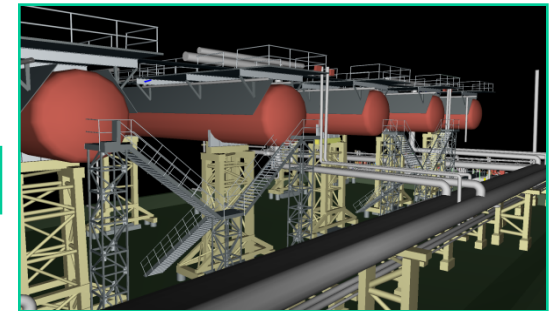
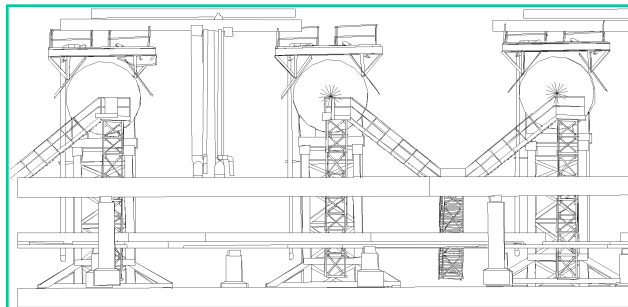
**3D Laser Mapping  
System**

# Cyrax

**Accurate, detailed, fast measuring**

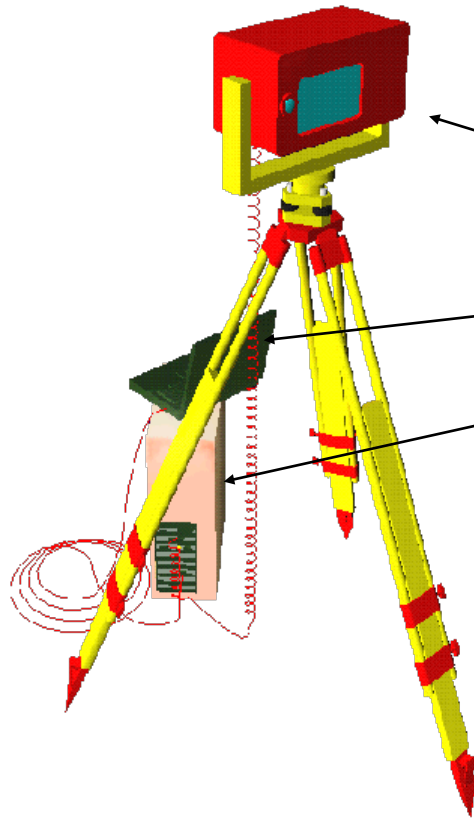


**2D / 3D CAD**



**Integrated modeling**

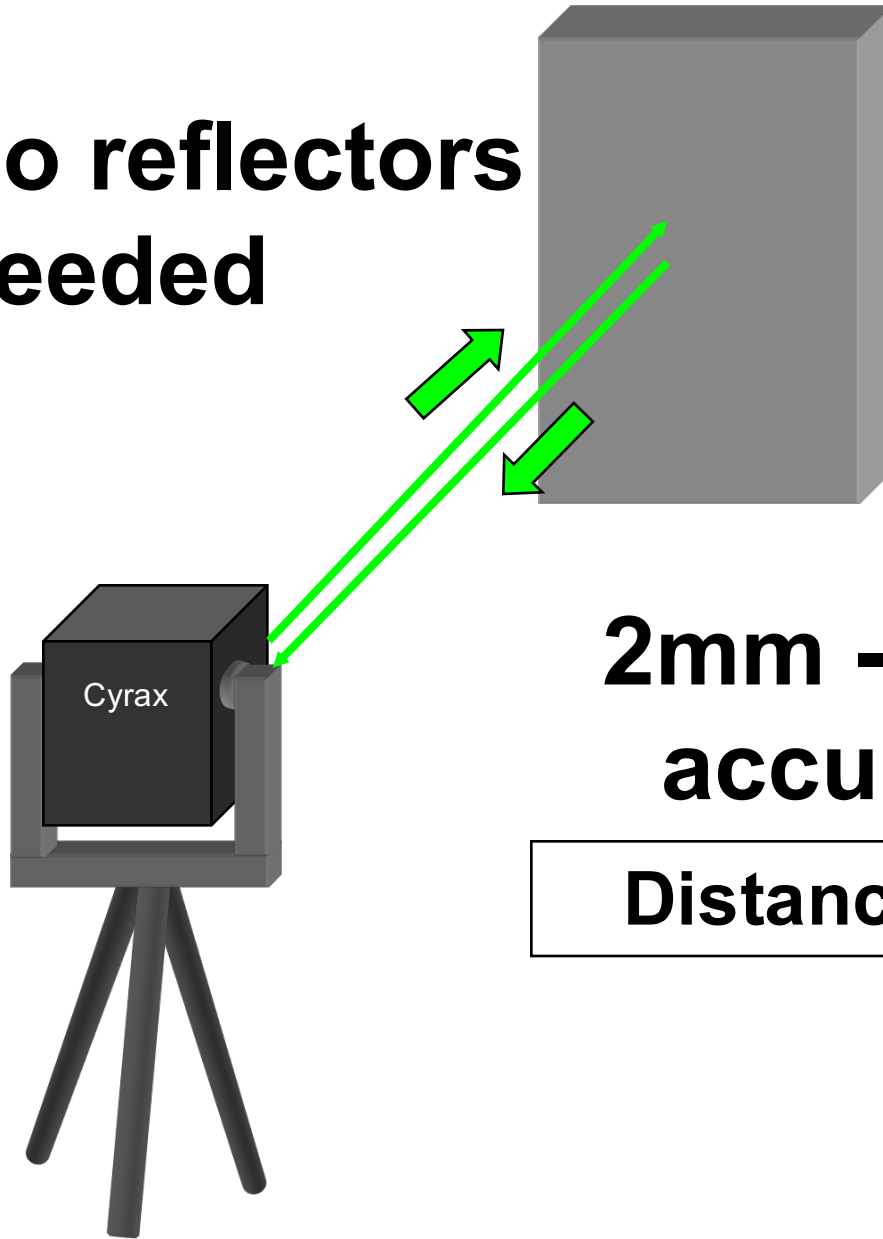
# *Cyrax*



- 3 Components
  - Laser Scanner
  - Laptop Computer & Software
  - Electronics & Power Supply
- Field Portable

# Pulsed laser (time-of-flight)

**No reflectors  
needed**

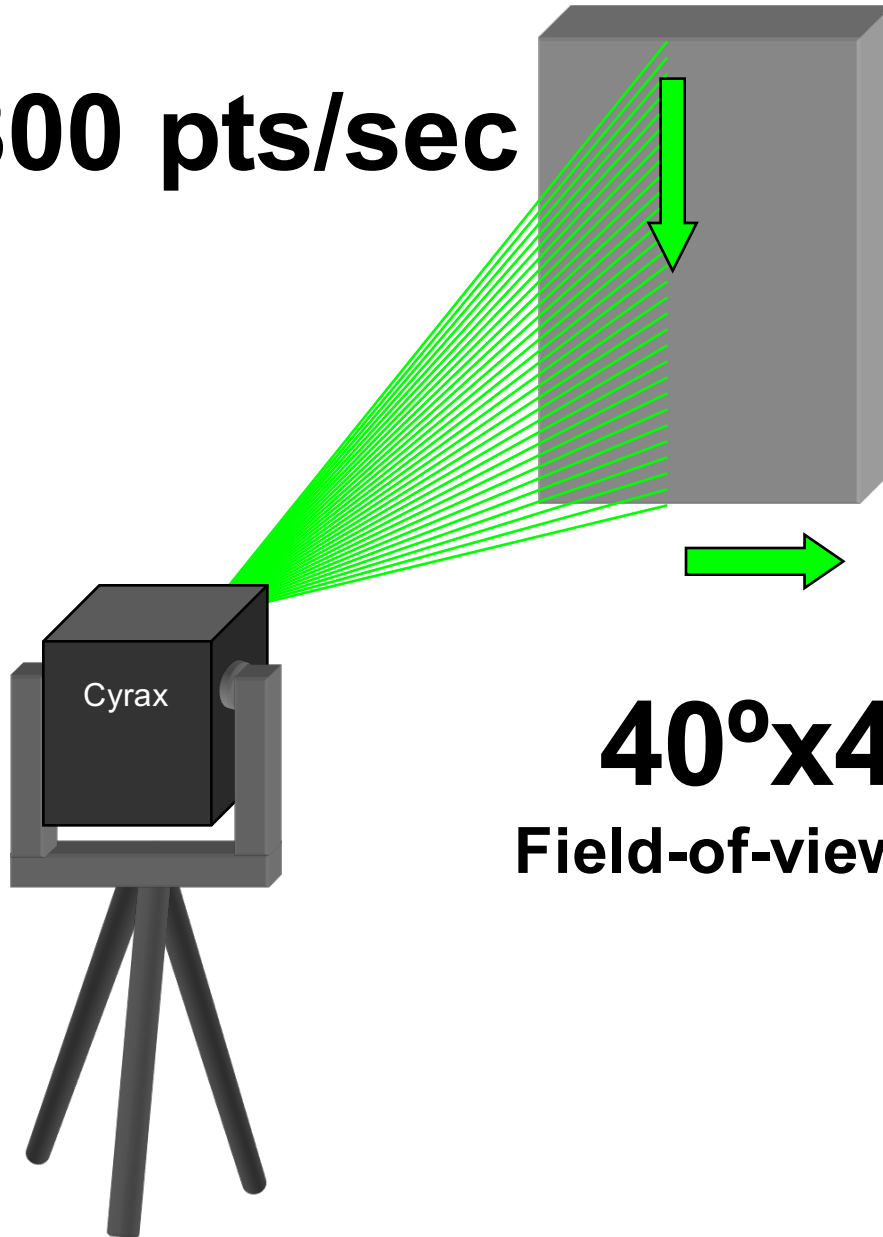


**2mm - 6mm  
accuracy**

$$\text{Distance} = C \times \Delta T \div 2$$

# Laser sweeps over surface

**800 pts/sec**

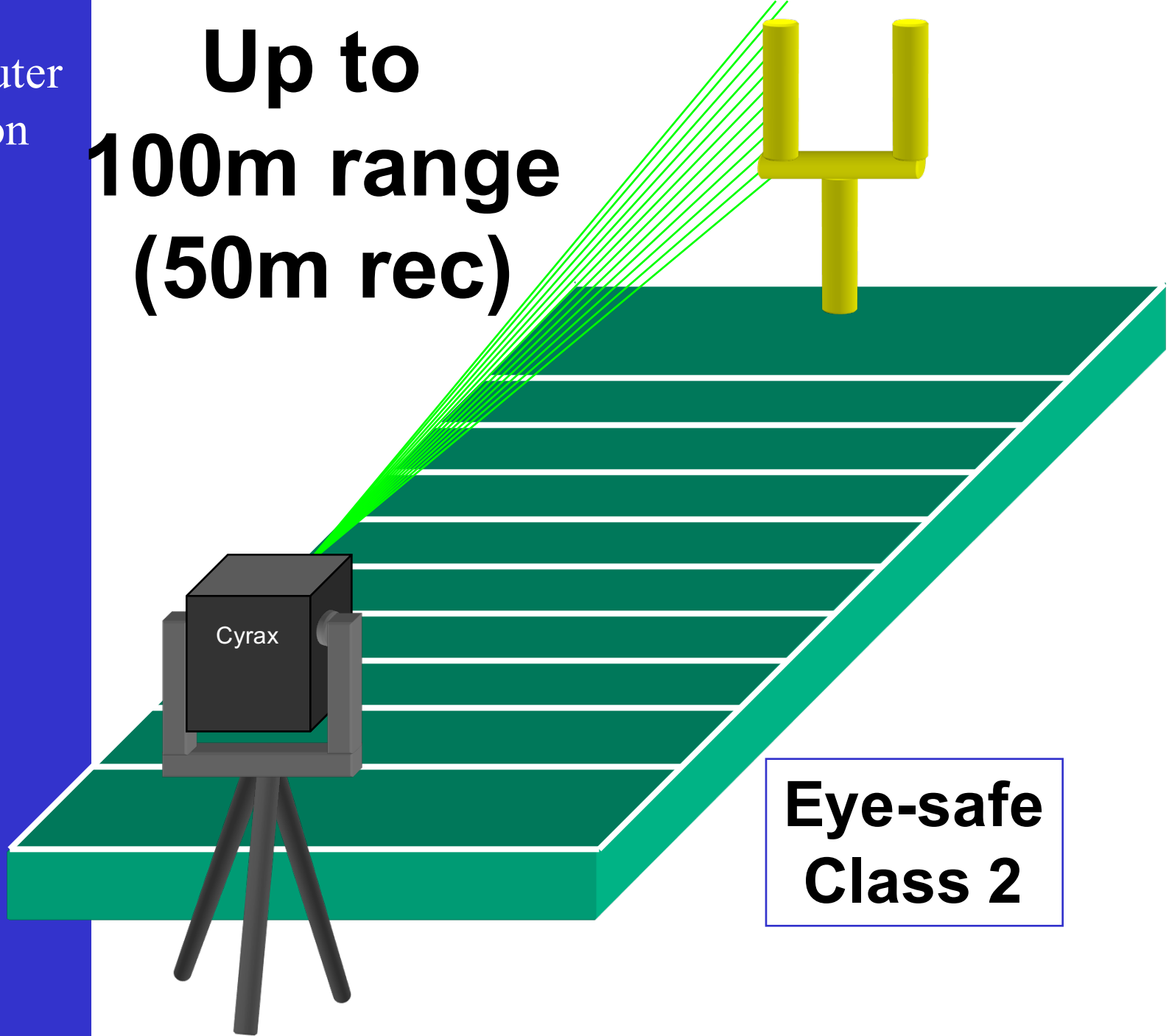


**2mm min  
pt-to-pt  
spacing**

**40°x40°  
Field-of-view (max)**

Computer  
Vision

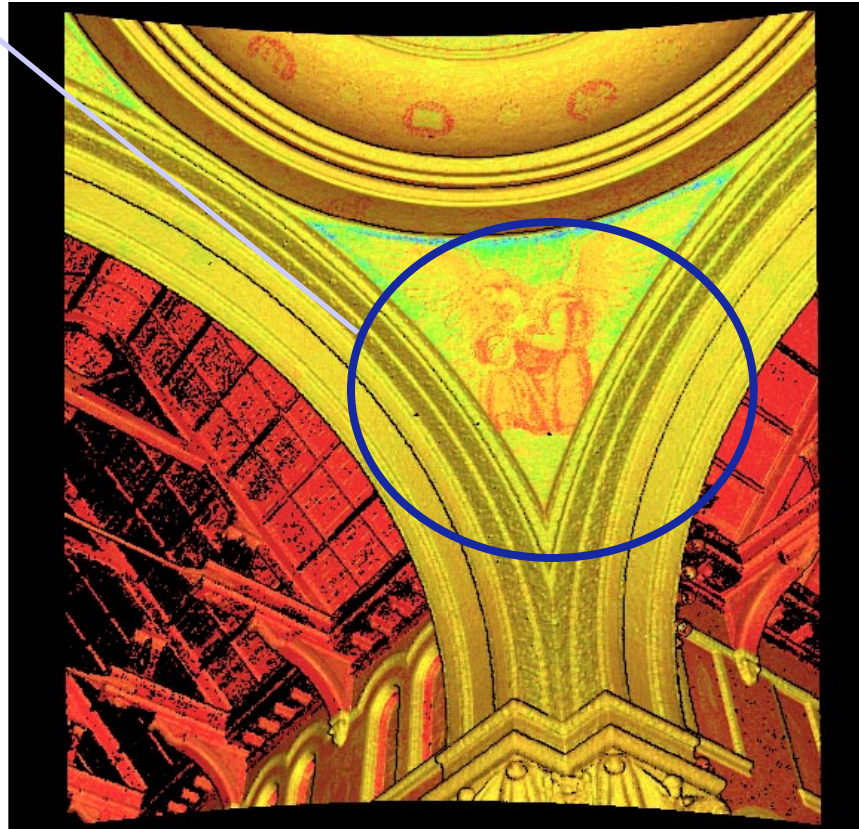
**Up to  
100m range  
(50m rec)**



**Eye-safe  
Class 2**

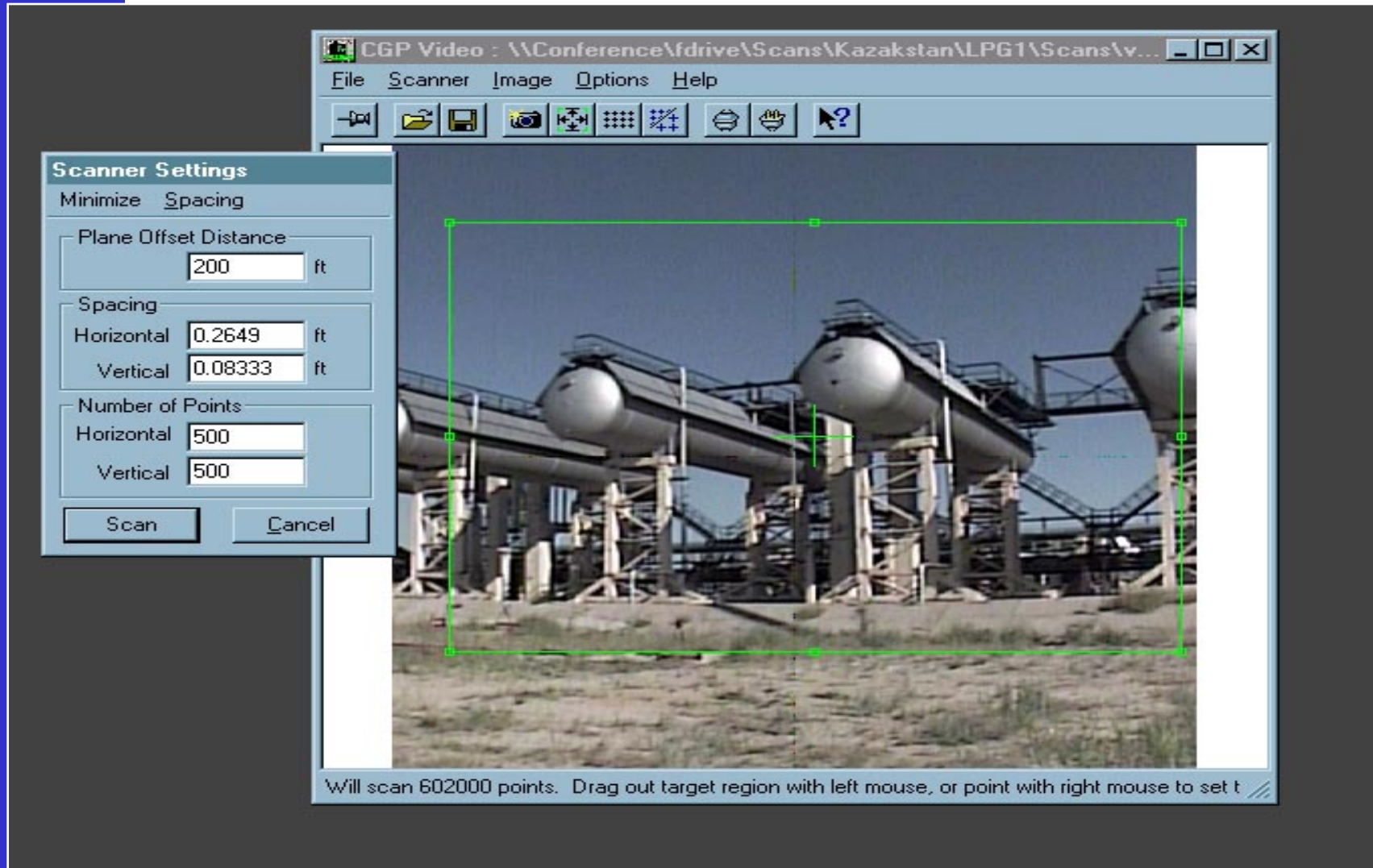
*Cyrax* is also a **visualization** tool

*Cyrax* detects the intensity of each reflected laser pulse and **colors** it

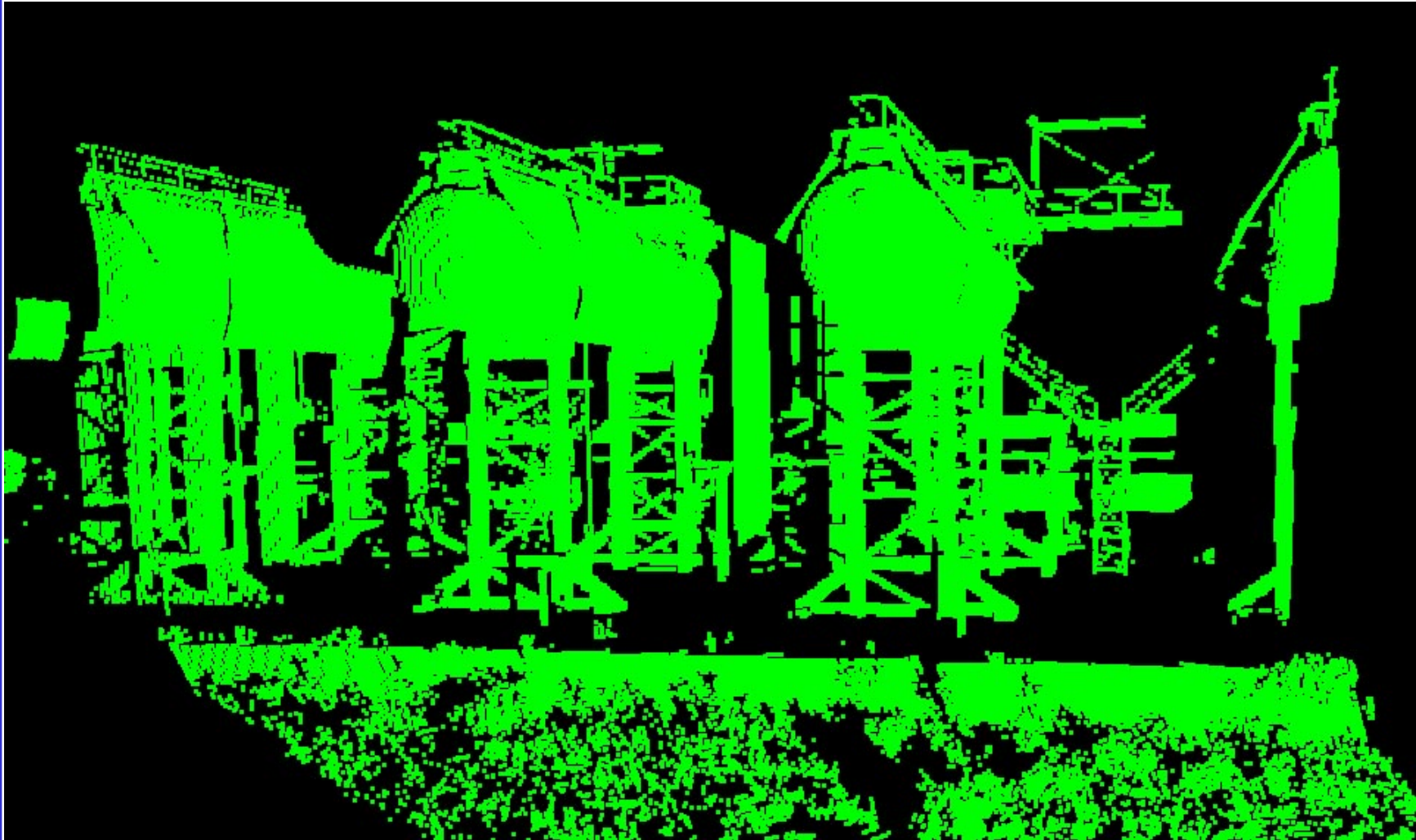




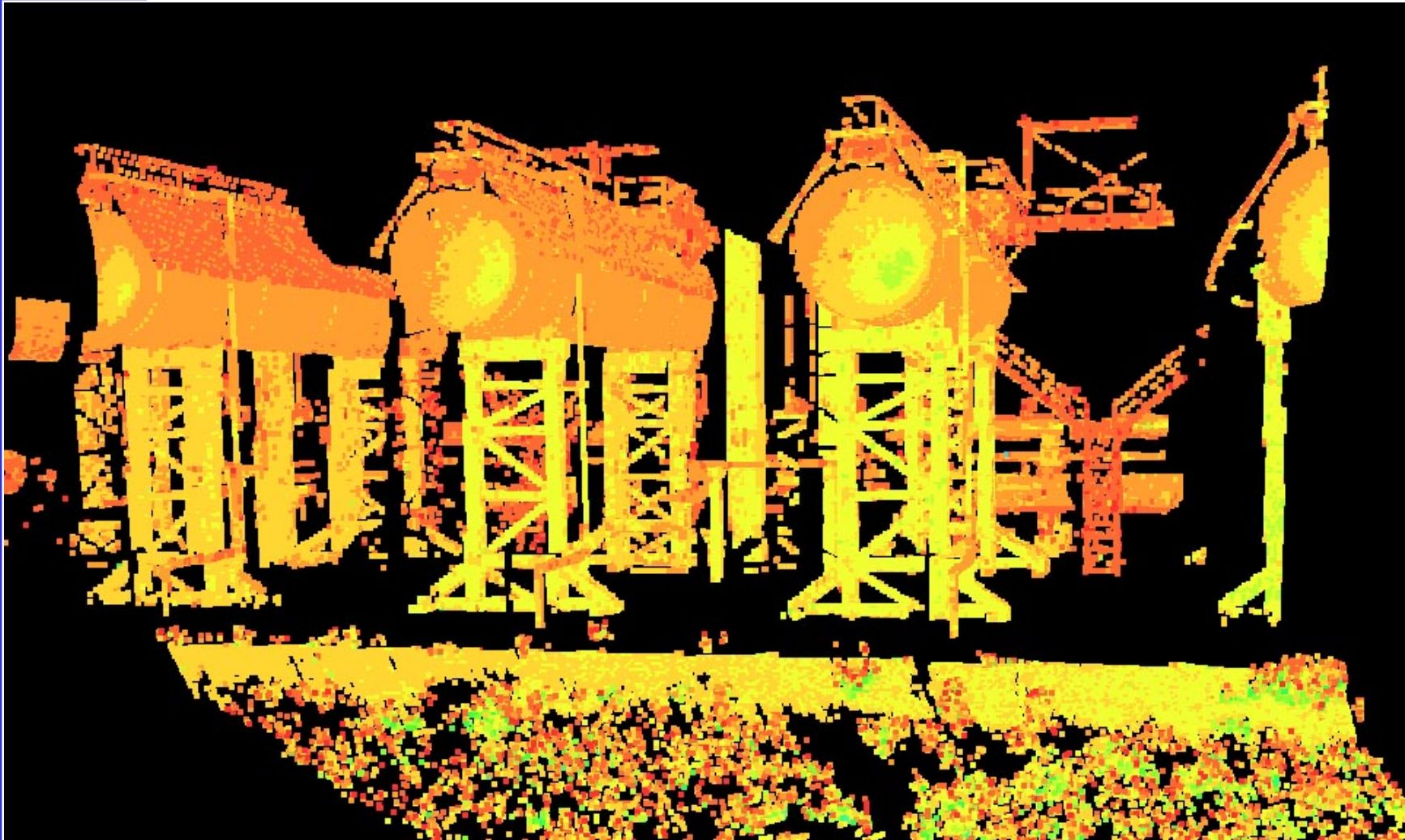
# Step 1: Target the structure



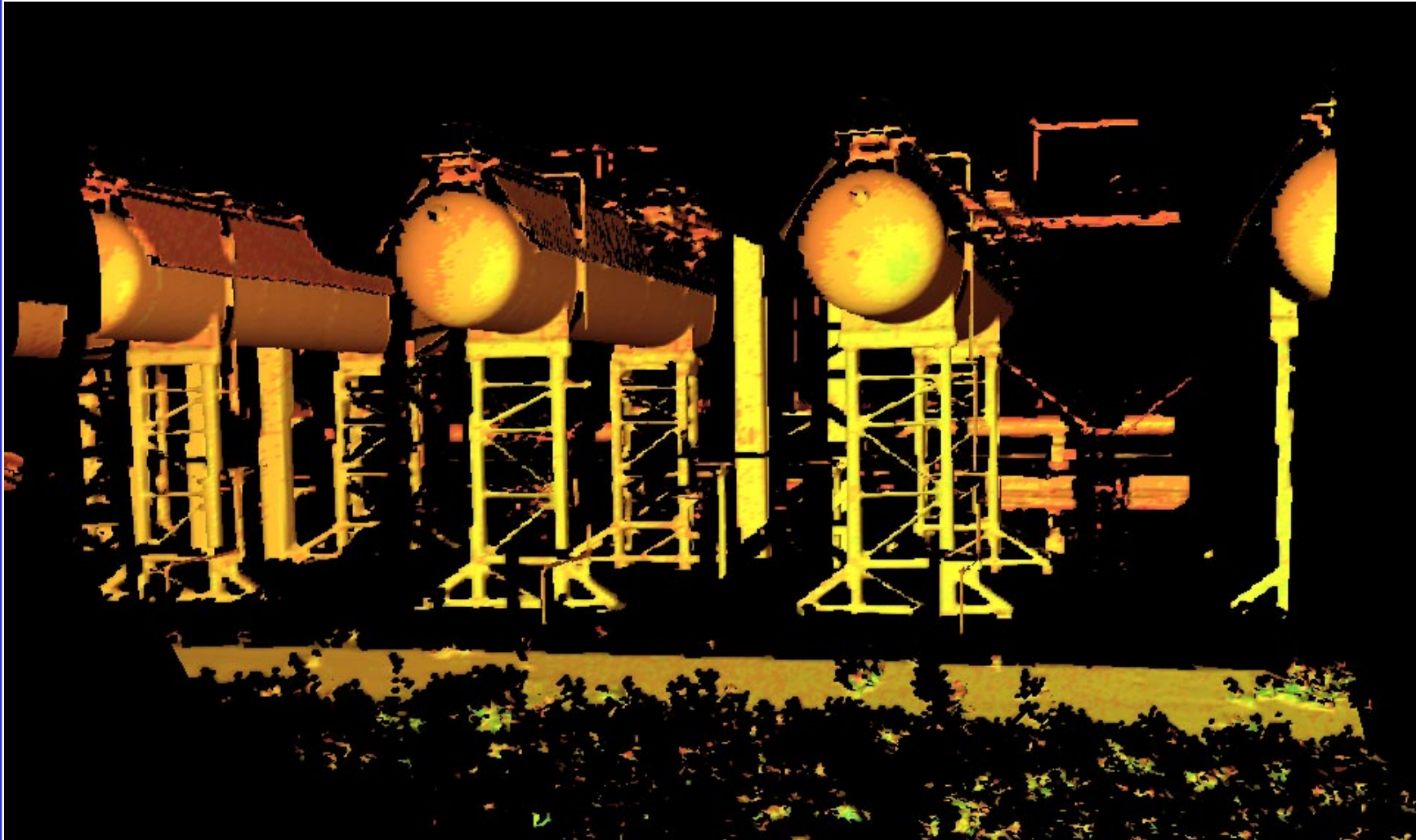
# Step 2: Scan the structure



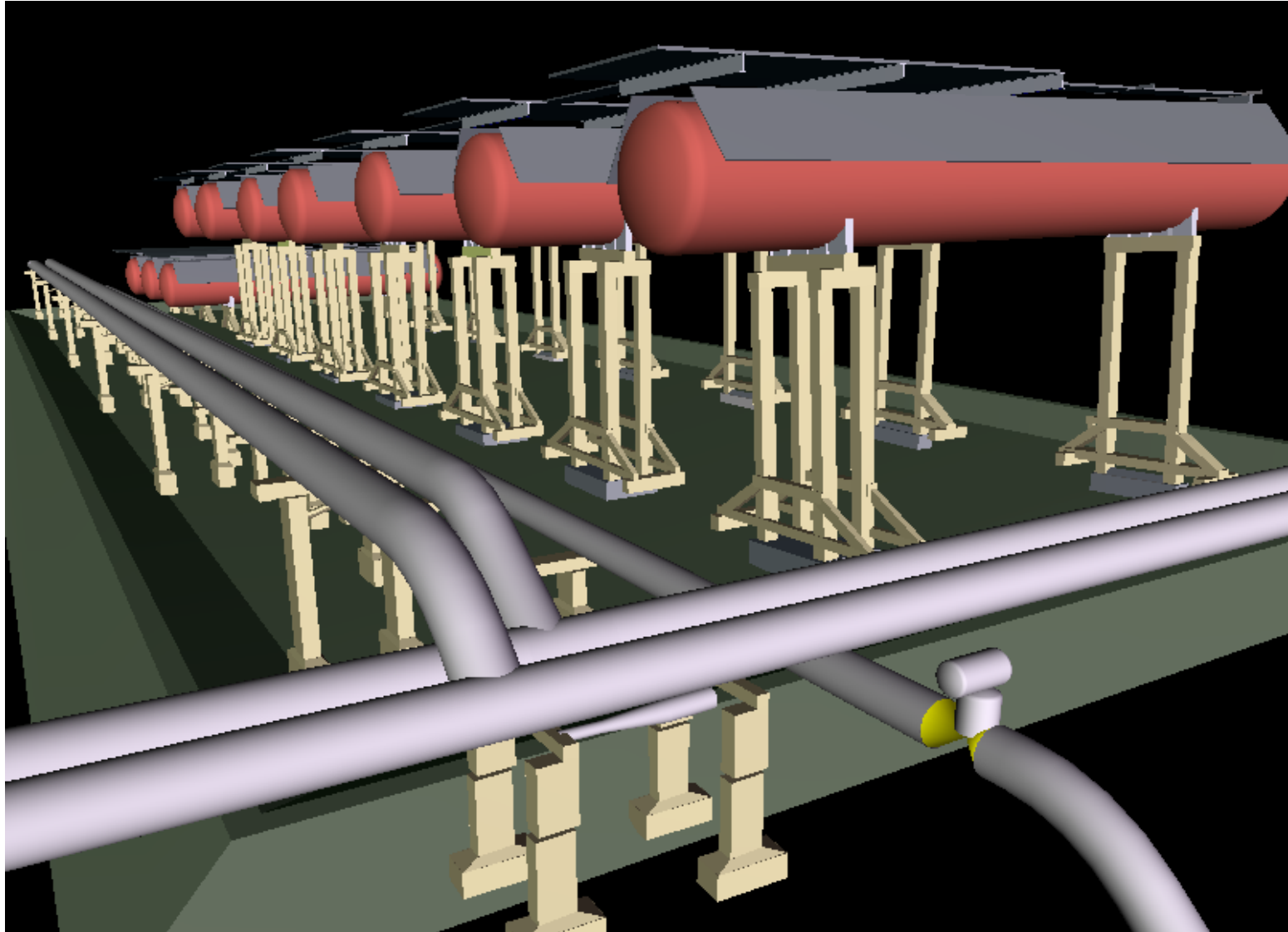
# Step 3: Color the points

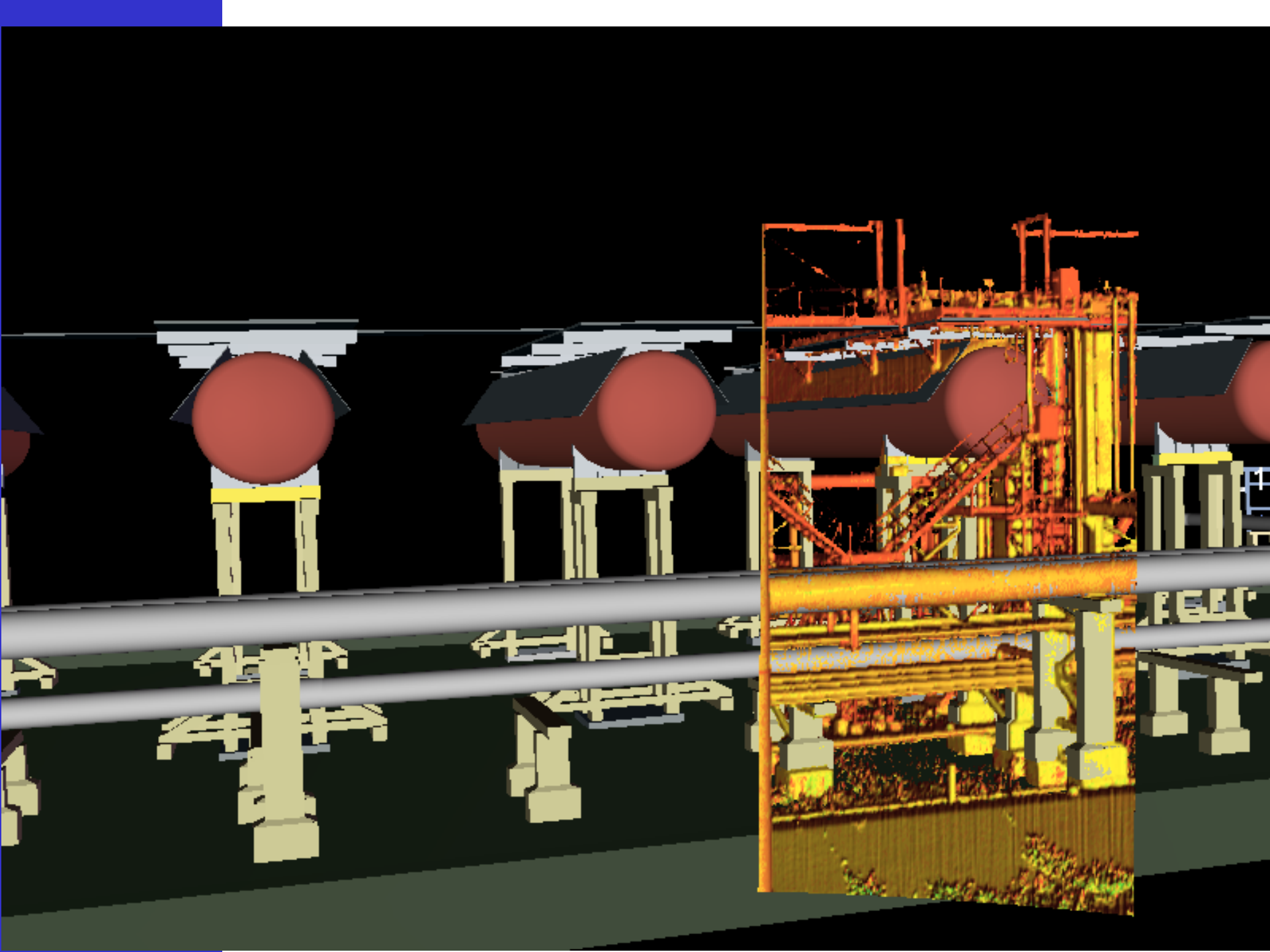


# Step 4: Model fitting in-the-field



# Result





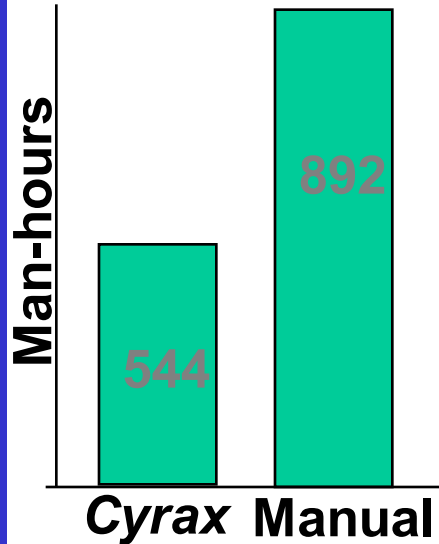
# Project: As-built of Chevron hydrocarbon plant



- 400'x500' area
- 10 vessels; 5 pumps
- 6,000 objects
- 81 scans from 30 tripod locations
- *Cyrax* field time = 50 hrs

# Cost Benefits

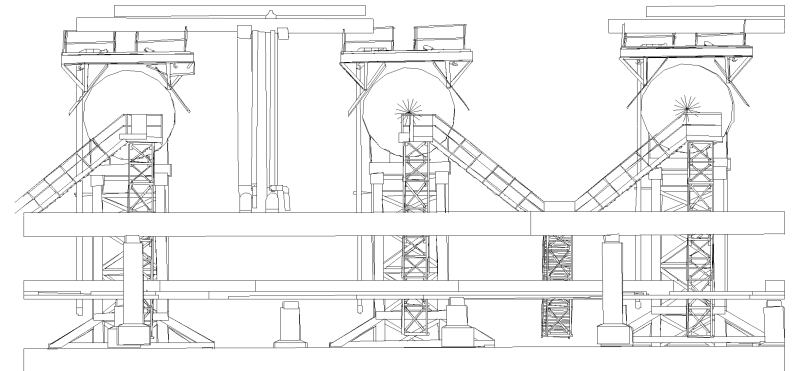
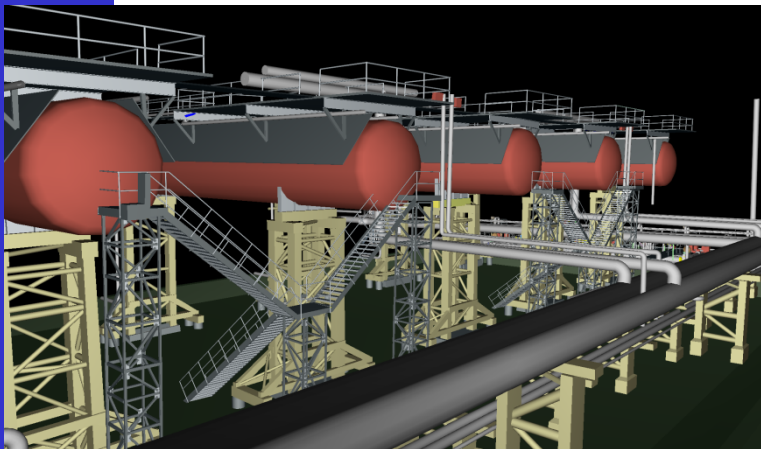
Measuring & modeling



# Added Value Benefits



- Greater detail & no errors
- Higher accuracy
- Fewer construction errors
- 6 week schedule savings





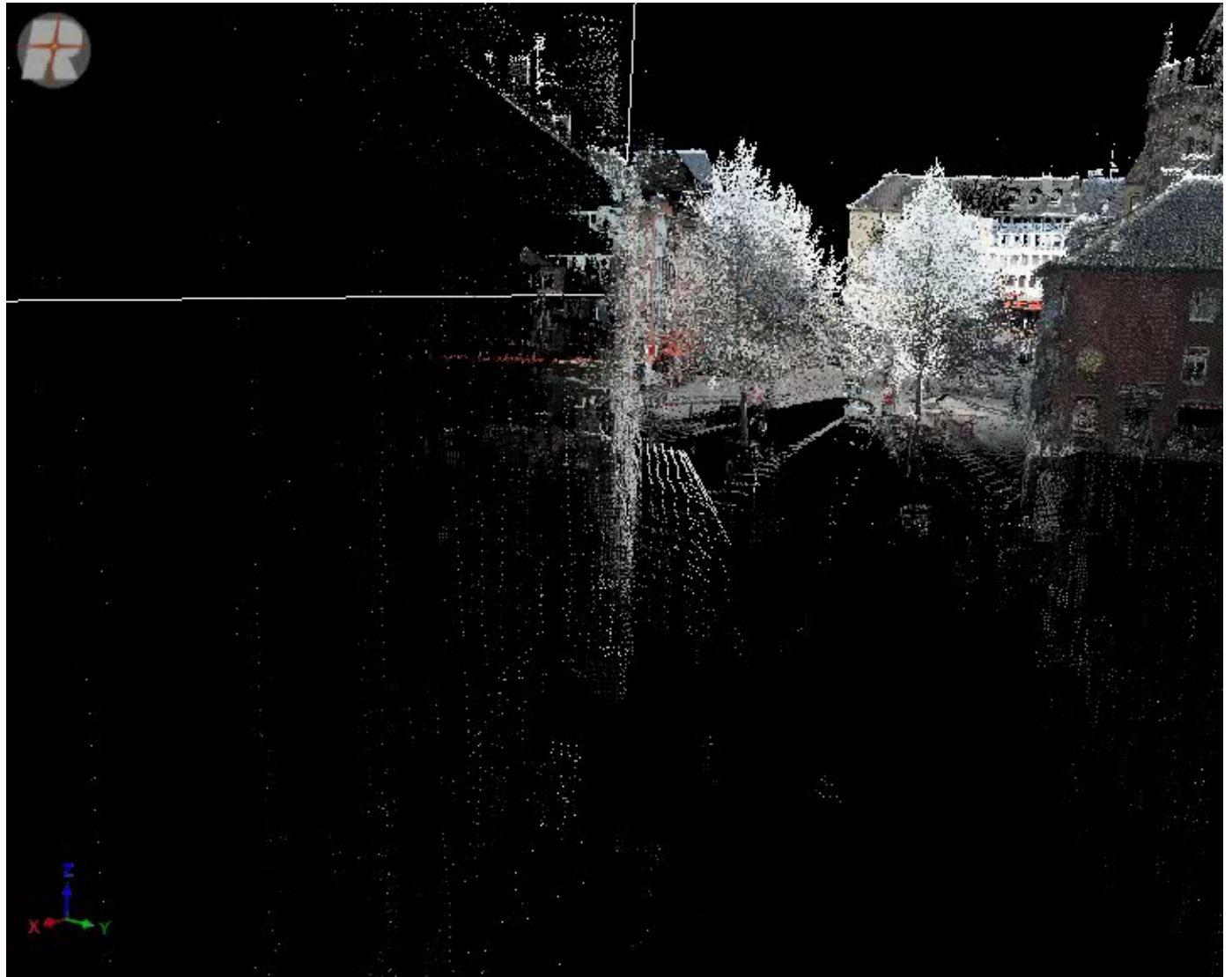
# Application

## Modeling movie sets

STARSHIP TROOPERS



# Lidar data with Riegl LMS-Z390i



courtesy of RWTH Aachen, L. Kobbelt et al.

# Comparison Lidar - passive

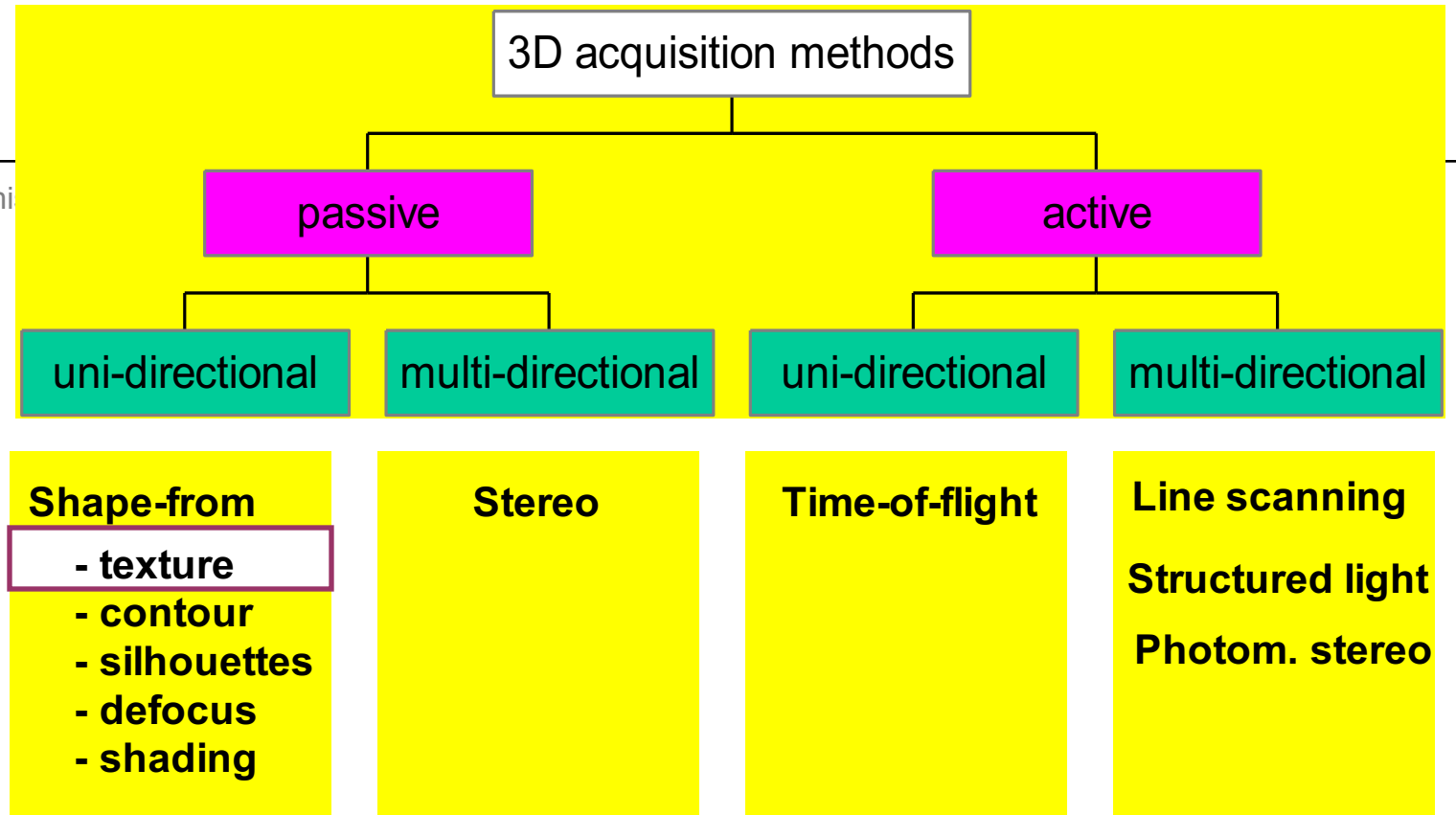
**3-D Reconstruction based on**

**Multi-View Stereo**

**LIDAR Measurements**



# 3D acquisition taxonomy



This

## Shape-from-texture

assumes a slanted and tilted surface to have a homogeneous texture

inhomogeneity is regarded as the result of projection

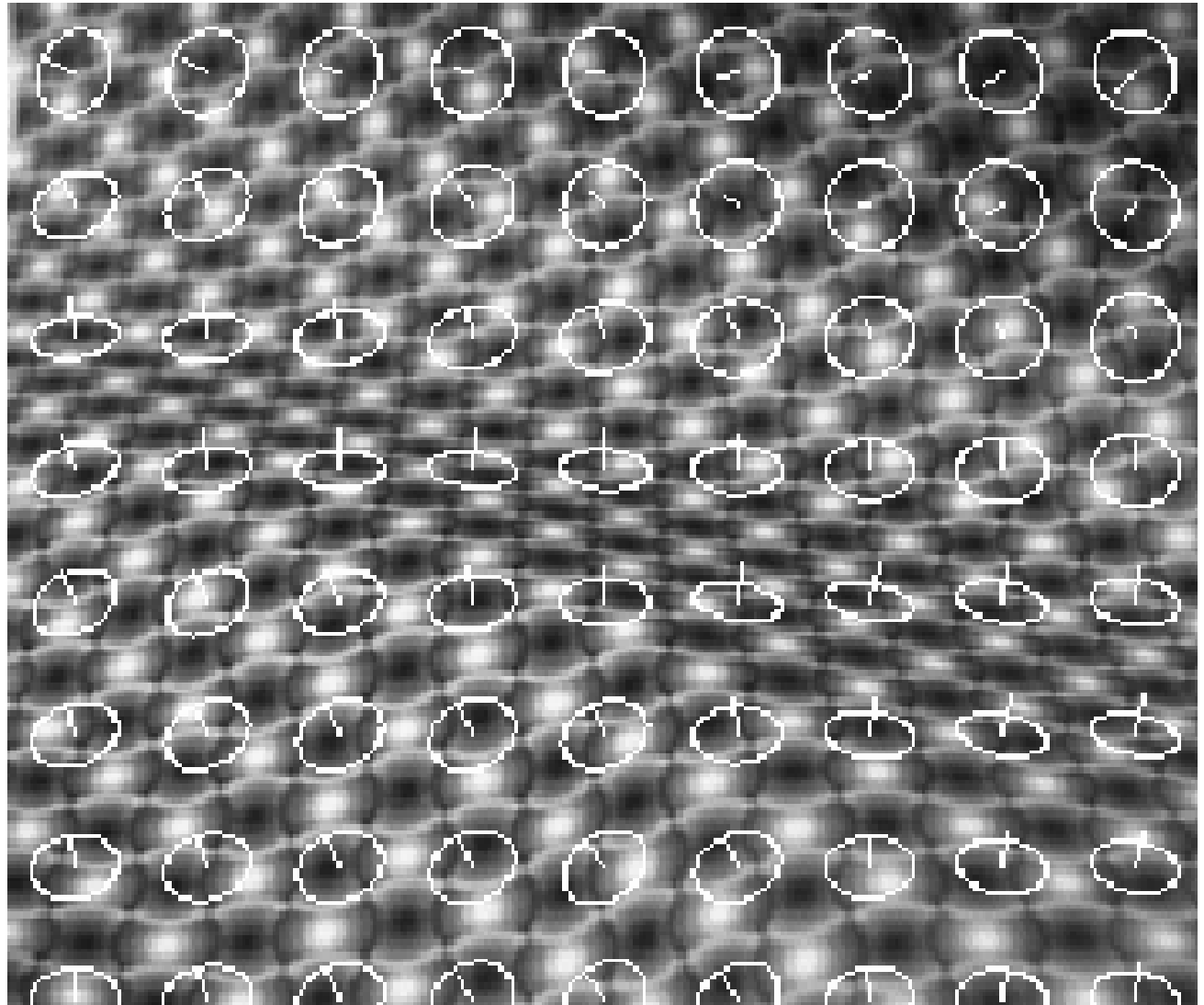
e.g. anisotropy in the statistics of edge orientations



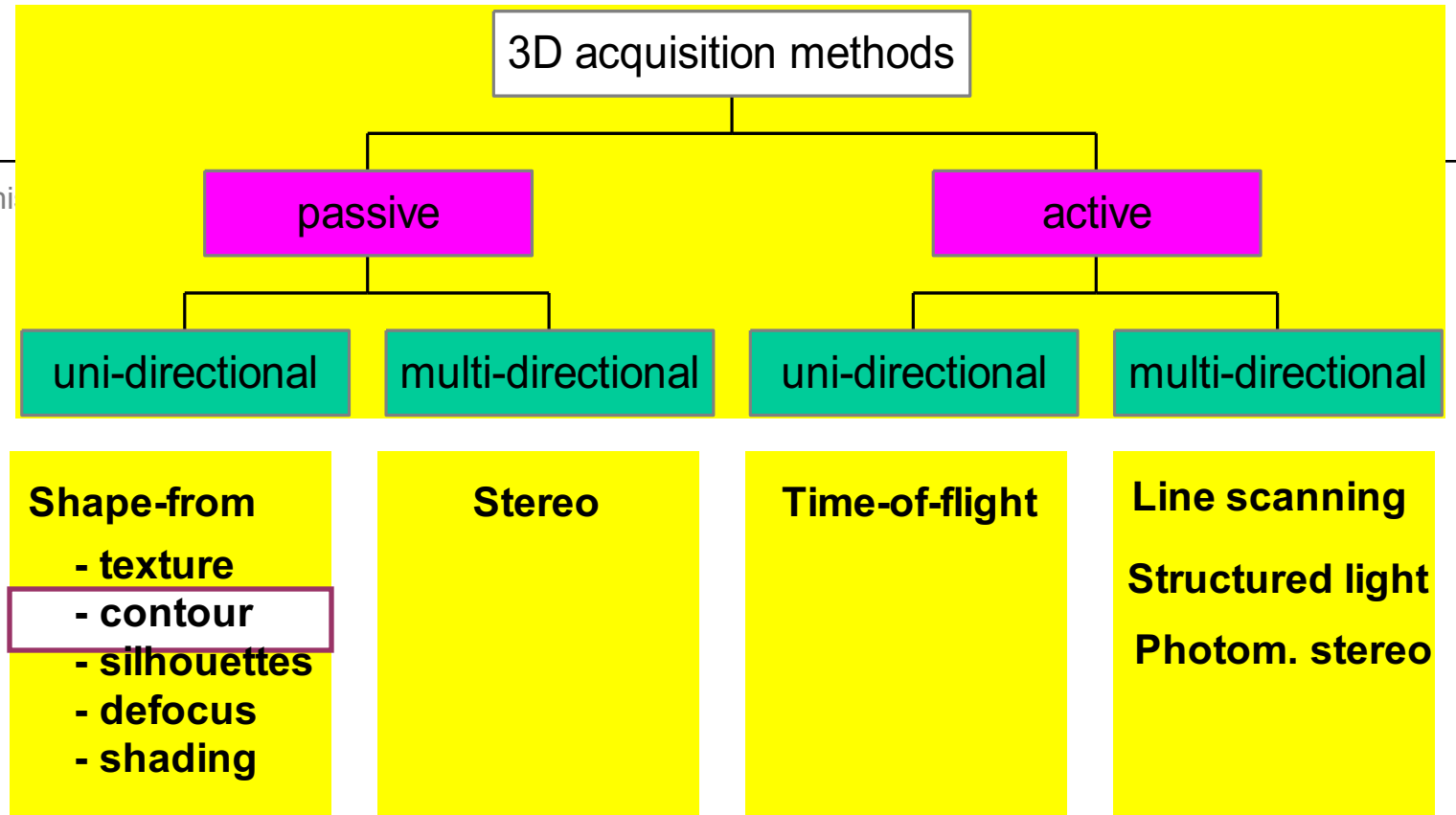
orientations deprojecting to maximally isotropic texture



# Computer Vision



# 3D acquisition taxonomy



This

## Shape-from-contour

makes assumptions about contour shape

E.g. the maximization of area over perimeter squared (compactness)

ellipse  $\Downarrow$  → circle

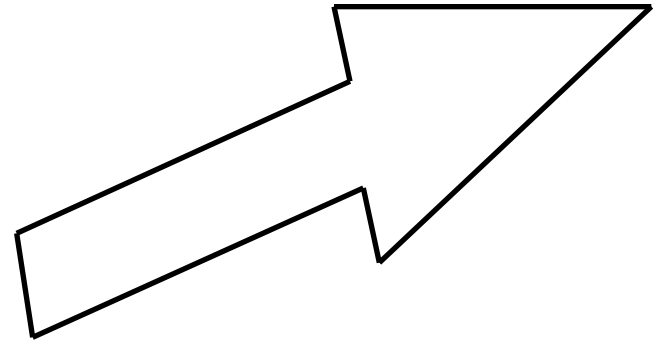
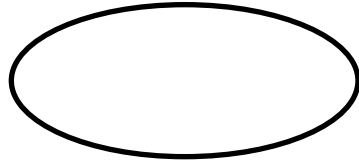
E.g. assumption of symmetry

Symmetric contours  $\Downarrow$  → surface of revolution

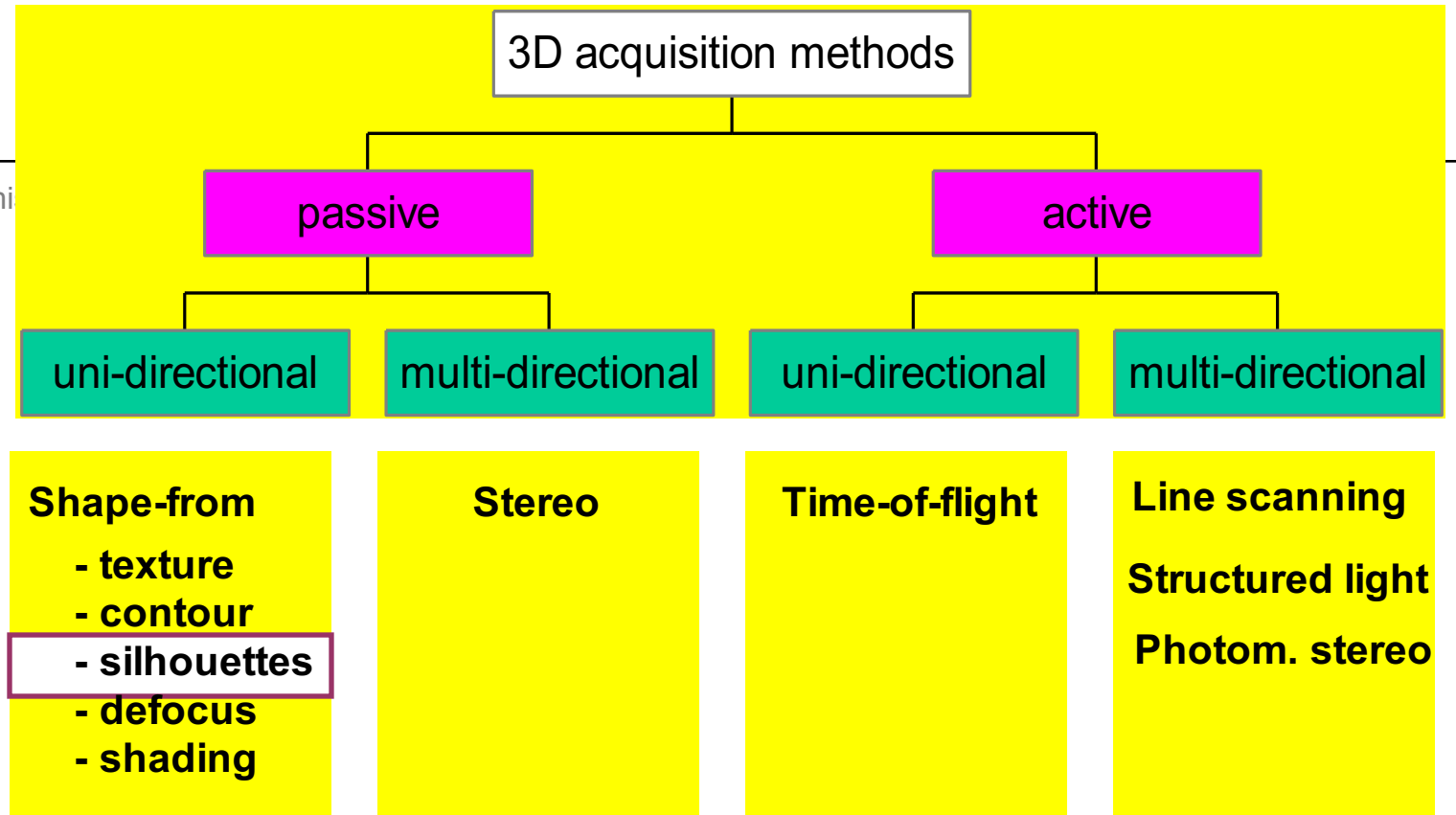




## Shape-from-contour

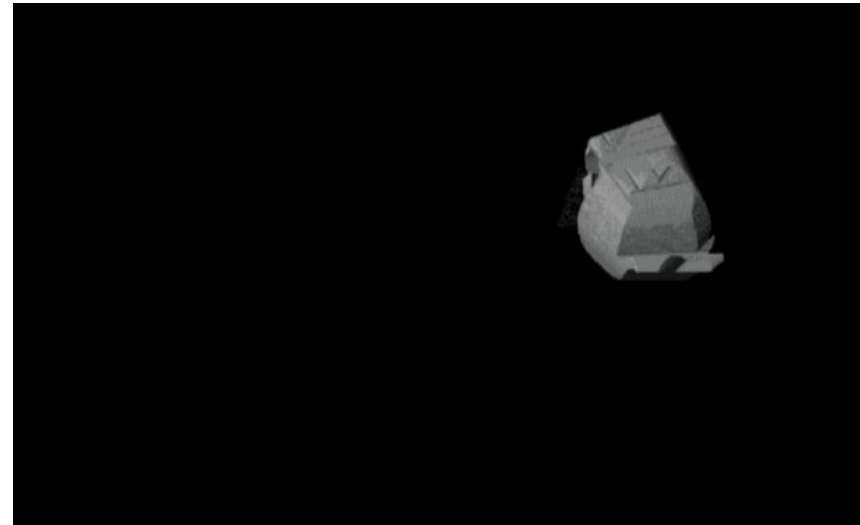
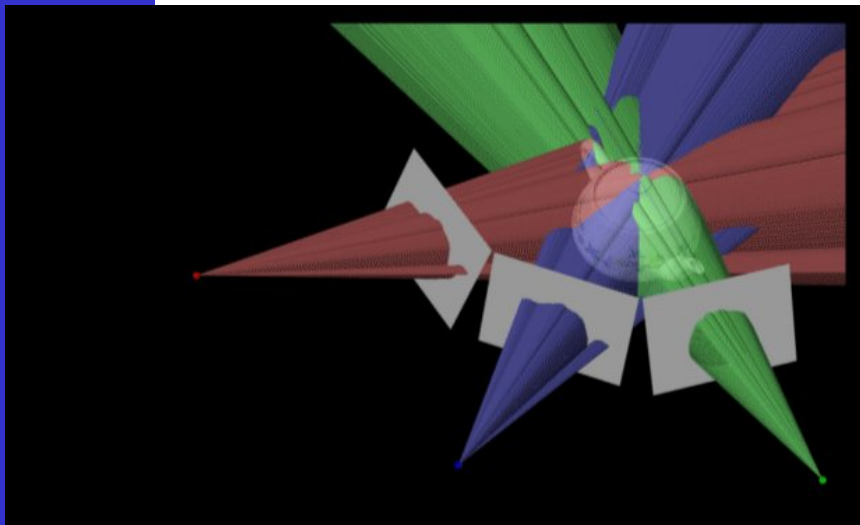
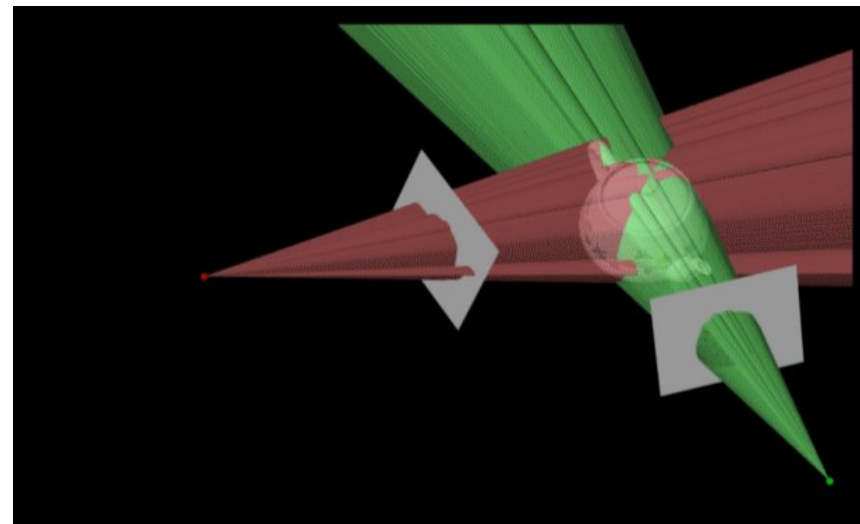
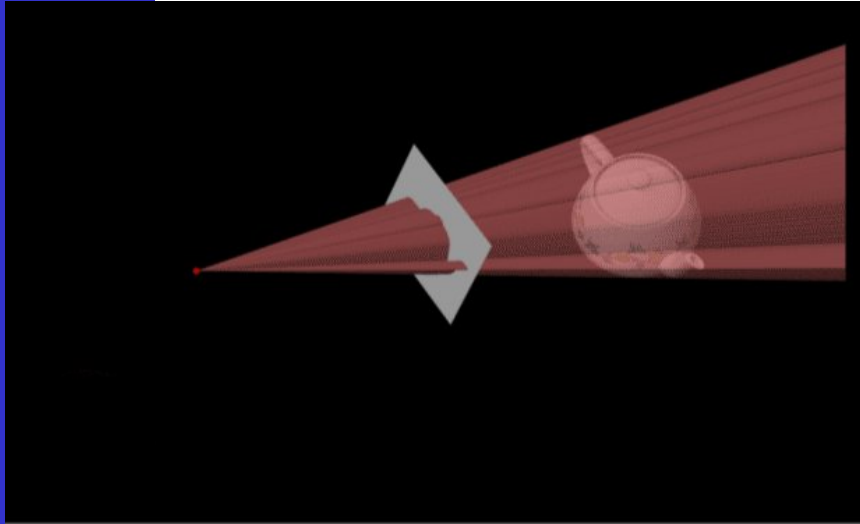


# 3D acquisition taxonomy



✖ Thi

# Shape-from-silhouettes



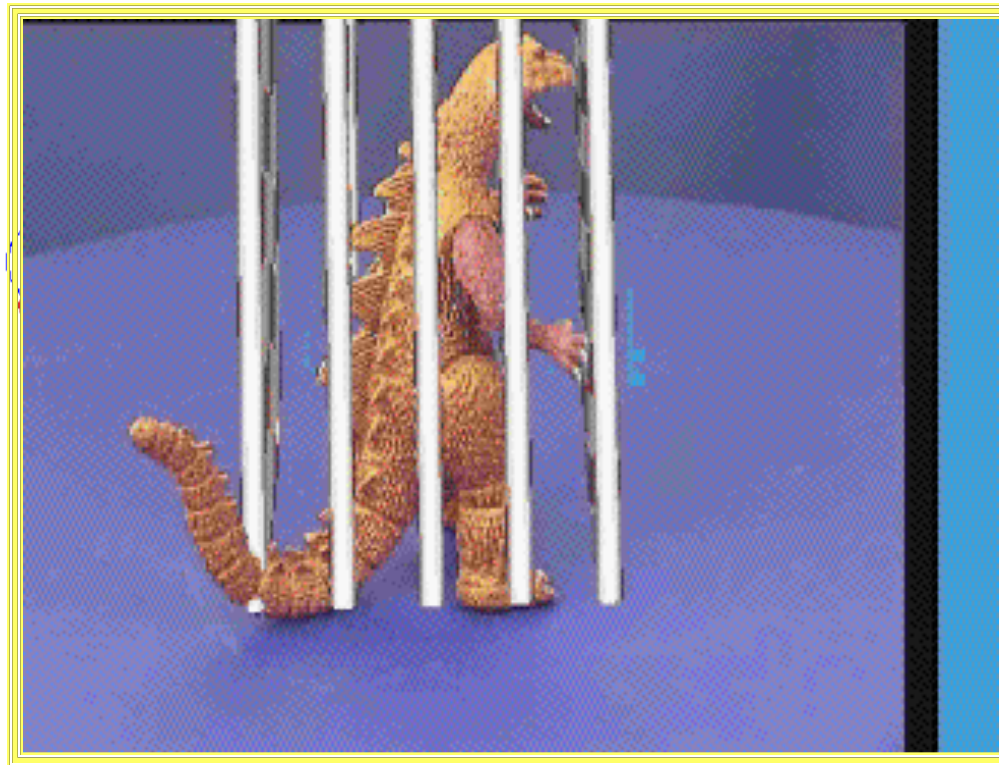
# Shape from silhouettes - uncalibrated

## tracking of turntable rotation

- volumetric modeling from silhouettes
- triangular textured surface mesh



*Turntable sequence*

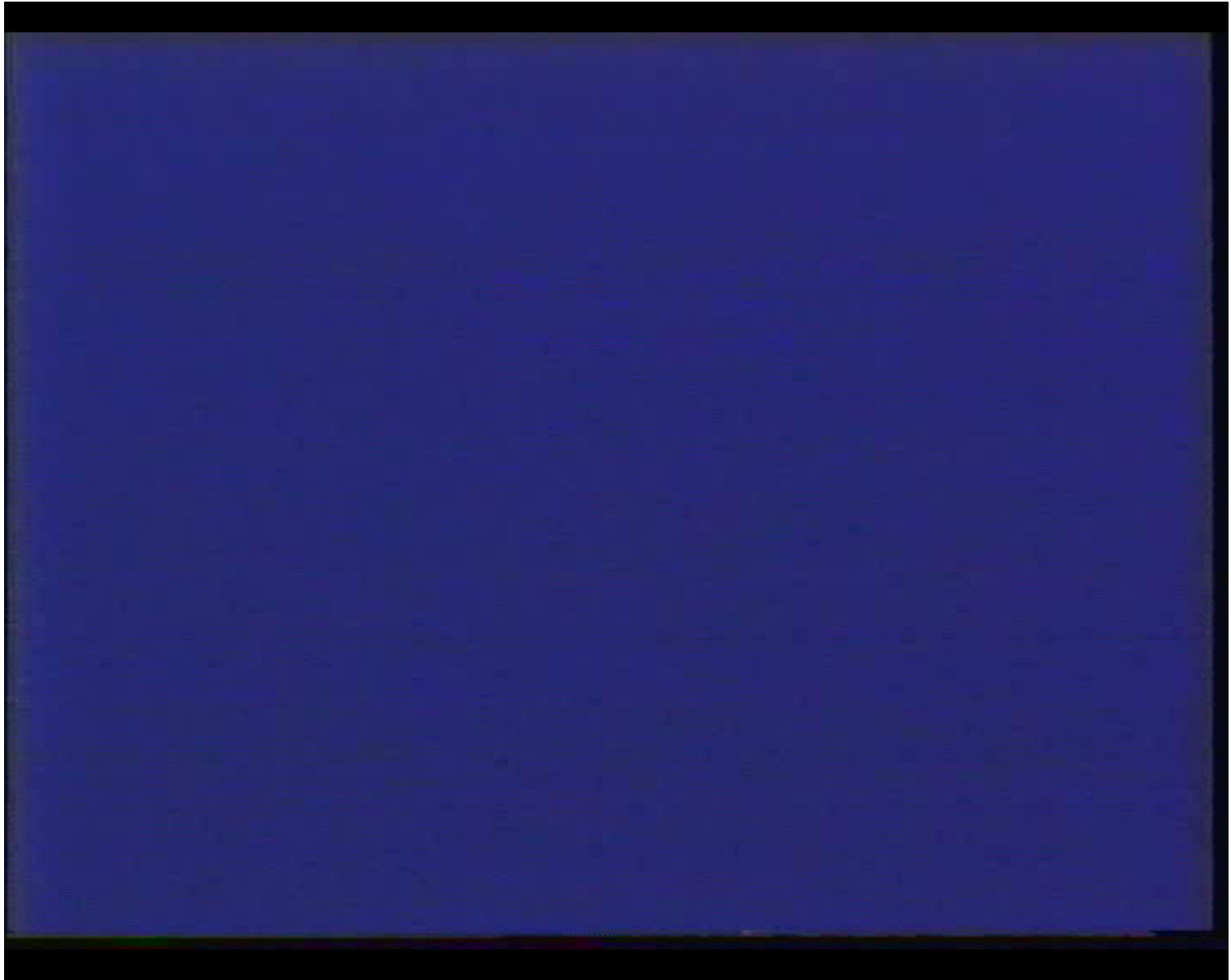


*Camera tracking*



*VRML model*

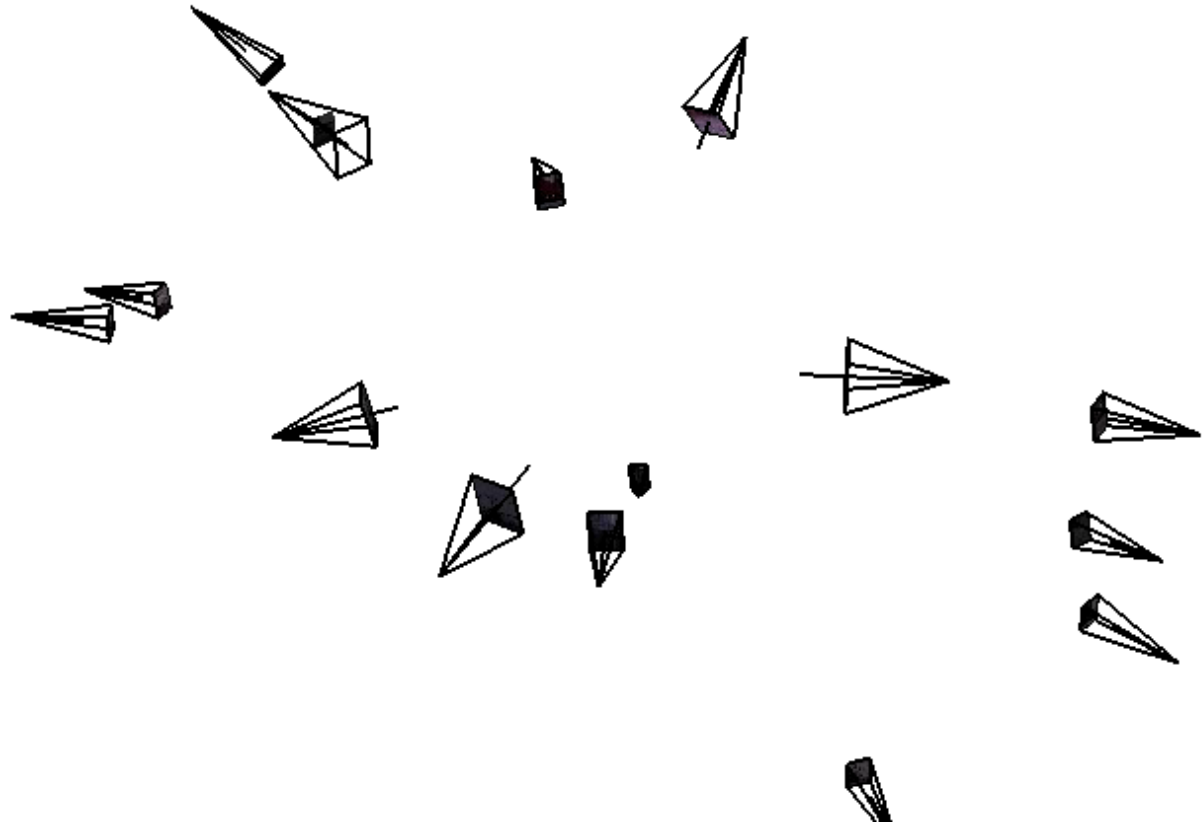
# Computer Vision



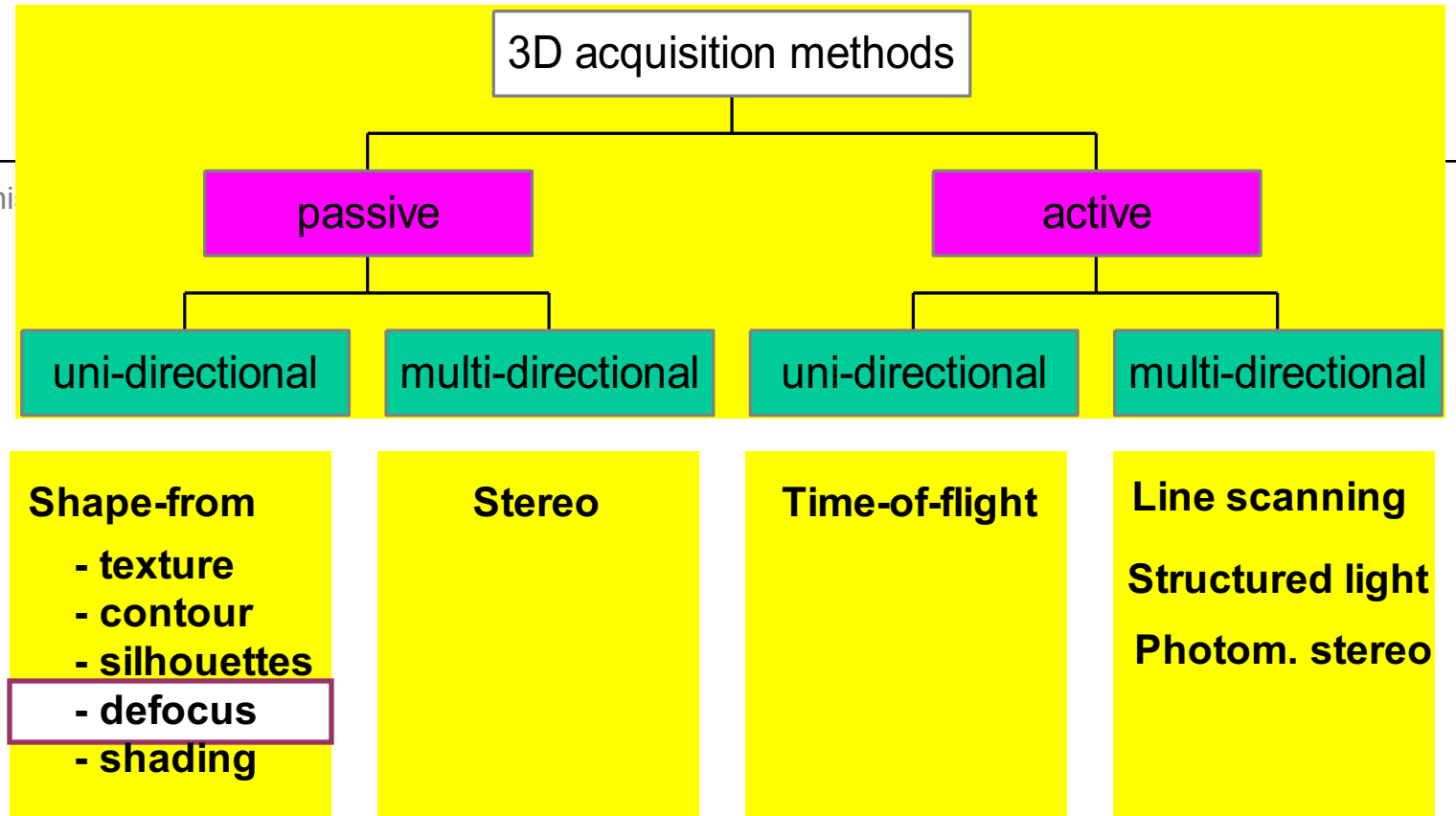
# Outdoor visual hulls



# Outdoor visual hulls



# 3D acquisition taxonomy



This



**REAL-TIME  
FOCUS RANGE SENSOR**

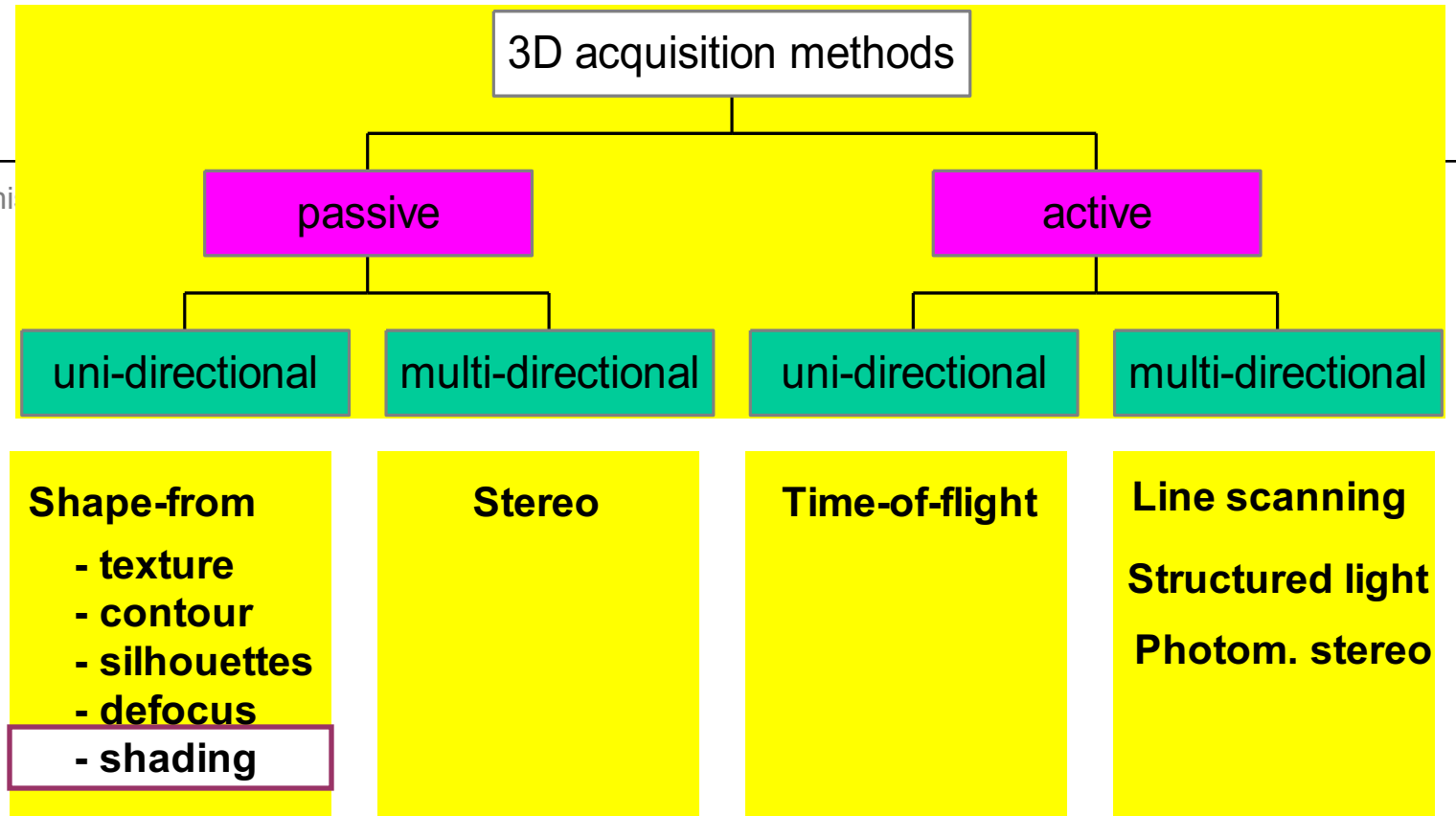
**SHREE K. NAYAR**

**MASAHIRO WATANABE**

**MINORI NOGUCHI**

**COLUMBIA UNIVERSITY**

# 3D acquisition taxonomy



This

## Shape-from-shading

Uses directional lighting, often with known direction

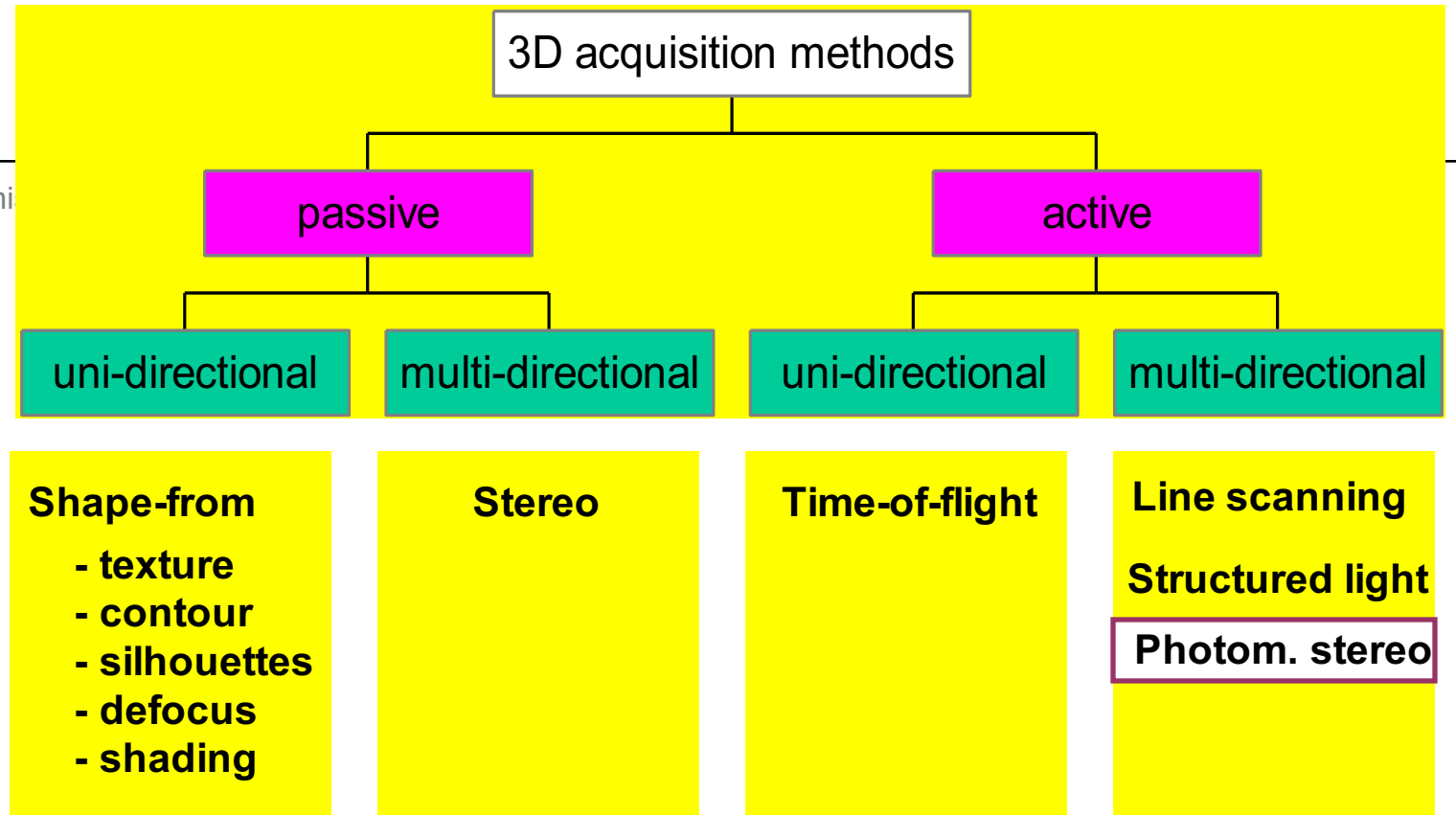
local intensity is brought into correspondence with orientation via *reflectance maps*

orientation of an isolated patch cannot be derived uniquely

extra assumptions on surface smoothness and known normals at the rim



# 3D acquisition taxonomy



✘ Thi

## Photometric stereo

constraint propagation eliminated by using light from different directions

simultaneously when the light sources are given different colours



# Mini-dome for photometric stereo

Instead of working with multi-directional light applied simultaneously with the colour trick, one can also project from many directions in sequence...

# Mini-dome for photometric stereo

KATHOLIEKE UNIVERSITEIT  
**LEUVEN**

# Mini-dome





# Mini-dome

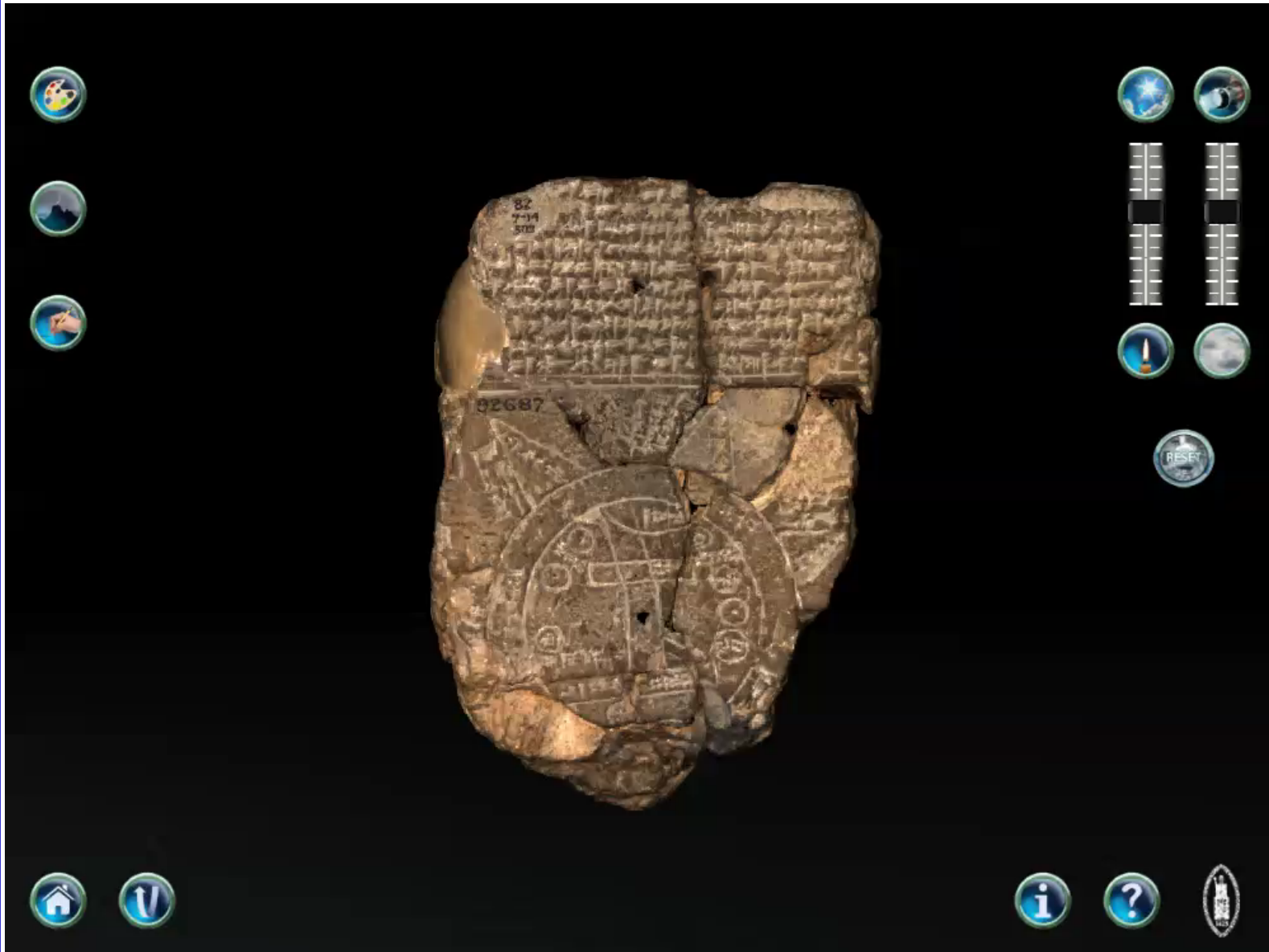


# Mini-dome for photometric stereo

Example for tablet with first world map known,  
an exhibit at the British Museum:

<http://homes.esat.kuleuven.be/~mproesma/mptmp/cuneiform>

# Mini-dome for photometric stereo



# 3D and recognition integrated

## 3D City Modeling using Cognitive Loops



# Multi-walker tracker



# Strongest 3D cues for us are 2D...

