

# A 3D scanning primer

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# Digital Models...

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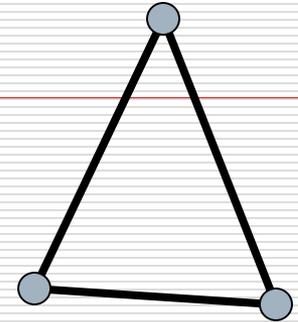
... of *real* objects.

You have seen lots of them.

Digital representation of the surface of an object through the use of a triangular mesh

We will discuss models that *faithfully* represent objects that exist in reality, generated using 3D scanning

What is 3D scanning ?



# 3D scanning

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3D scanning is not a technology, but a *family* of technologies (and a quite large one)

In all its incarnation, it is a form of **automatic measurement of geometric properties** of objects.

The produced digital model is formed by geometric information that have been measured and have a **metric** quality.

It may be imprecise and incomplete, but still has all the characteristics of a measurement result

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**The long and  
winding road**

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# Unfortunately

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3D scanning is not, as 2D scanning is, a “single button” operation... Things are slowly changing, but still, some skill and work is needed to turn raw data into usable 3D models.

Measuring 3D information is just *a step* in the process of creating a 3D model.

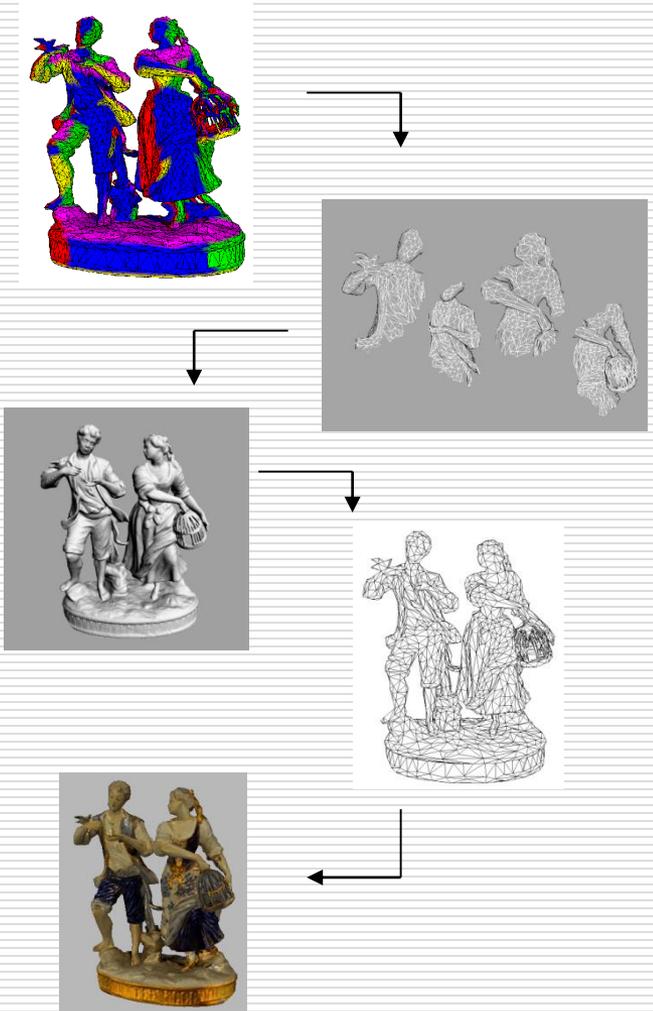
This process generally goes under the name of

**3D Scanning Pipeline**

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# 3D Scanning Pipeline

- [ *Acquisition planning* ]
- **Acquisition** of multiple range maps
- Range map **filtering**
- **Registration** of range maps
- **Merging** of range maps
- Mesh **Editing**
- **Capturing/Integration** of **appearance** (color acquisition, registration, mapping on surface, color visualization)
- [ *Archival and data conversion* ]



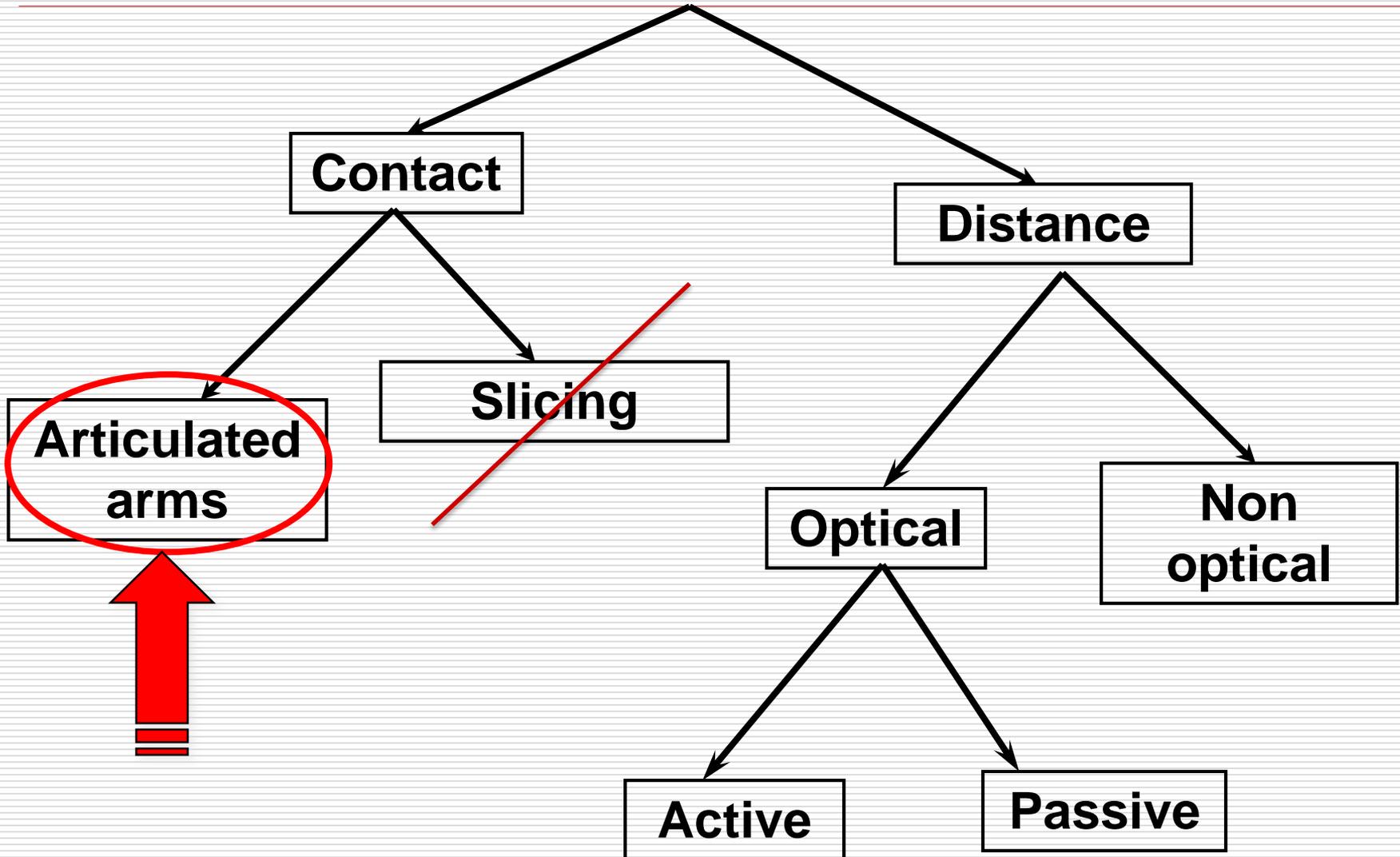
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# Measurement

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# 3D scanning: a taxonomy

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# Articulated arm

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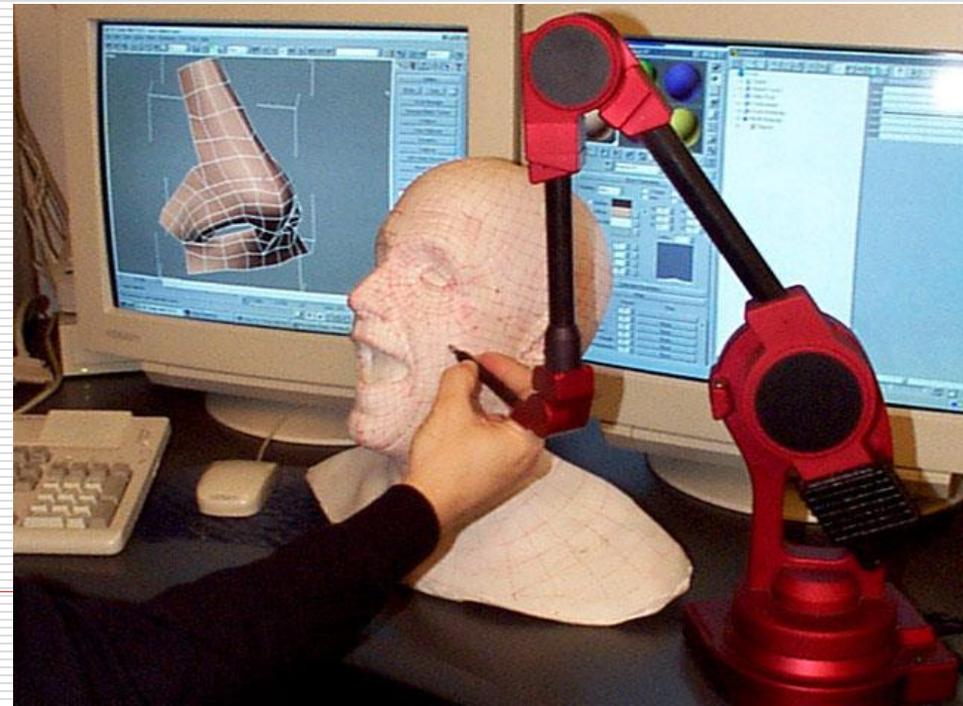
The probing point has a known position in every moment, thanks to the angle sensor at joints

Object is “probed” in various points, generating a grid that will use as a guide for modeling

Very “manual” method, still with lot of artistic influence

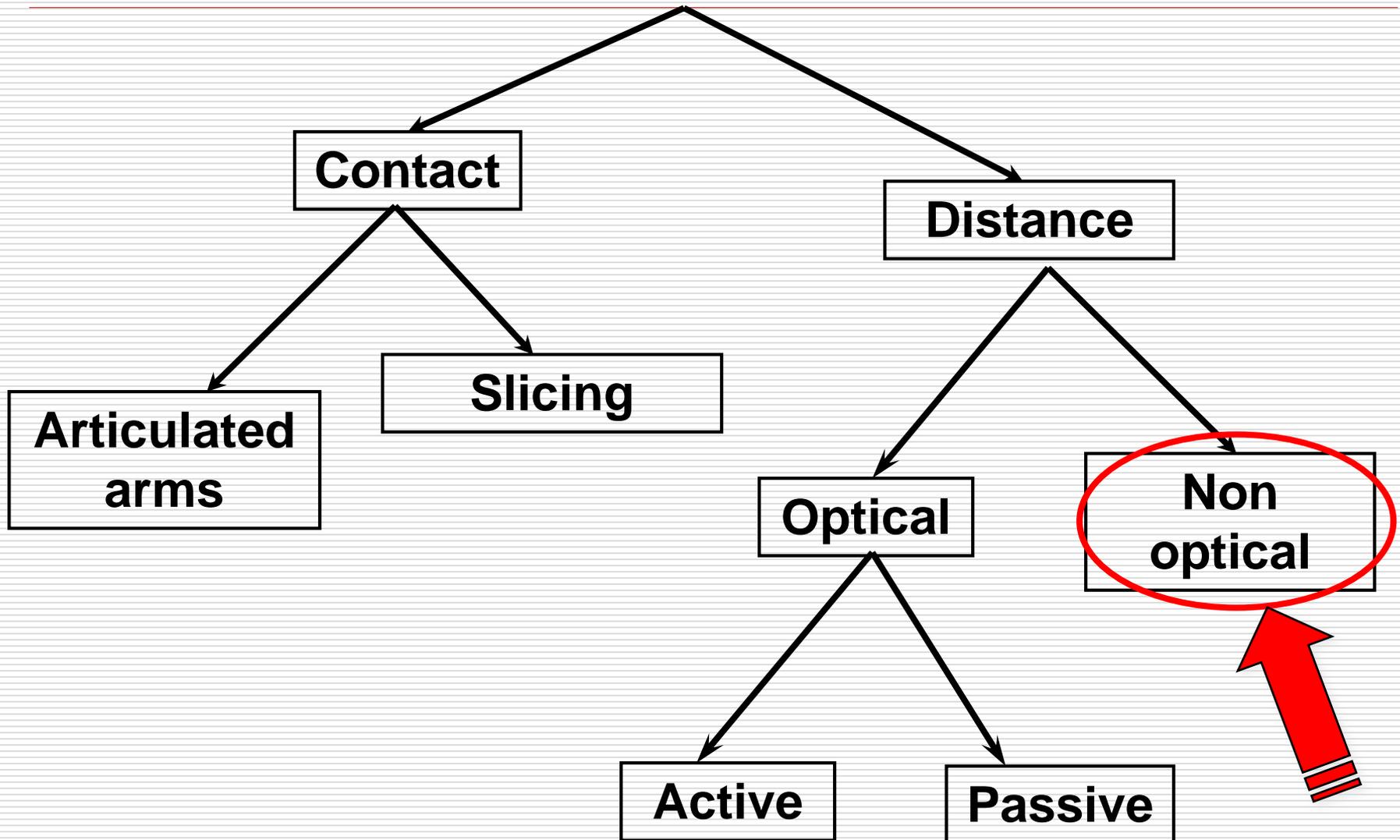
Industrial sensors:

The arm is autonomous and touches the surface using a predefined, regular, grid. Precisions in the order of microns



# 3D scanning: a taxonomy

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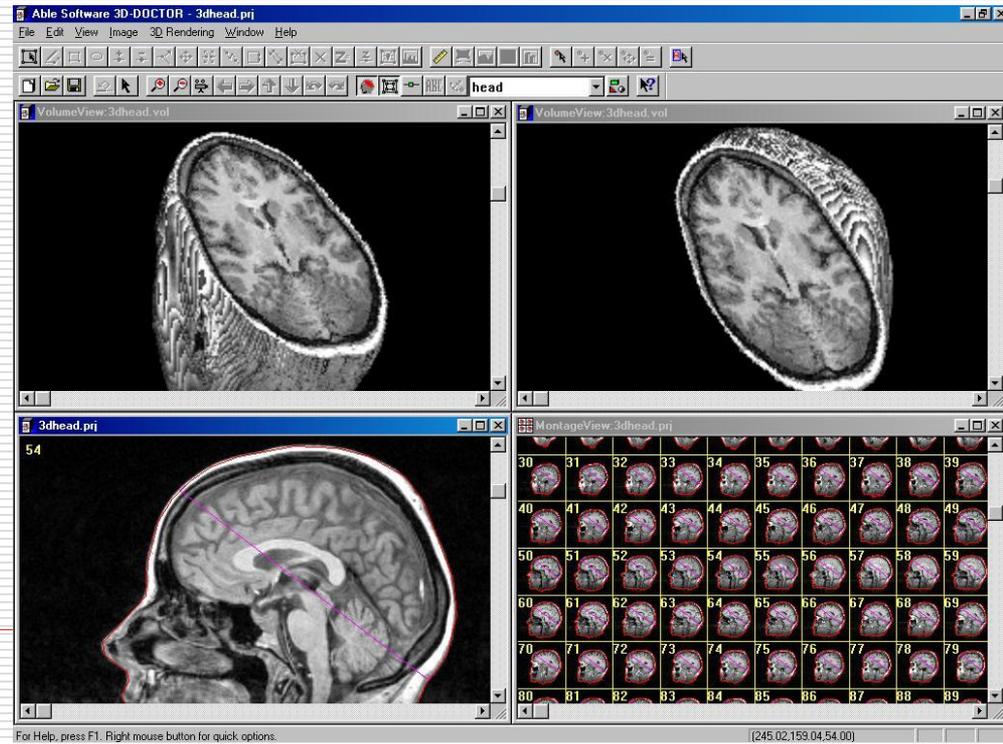
# Volumetric acquisition

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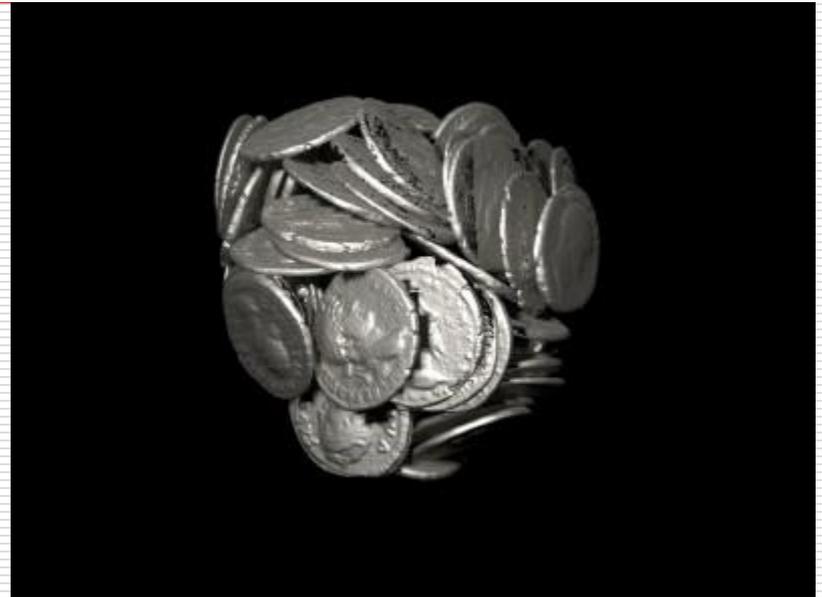
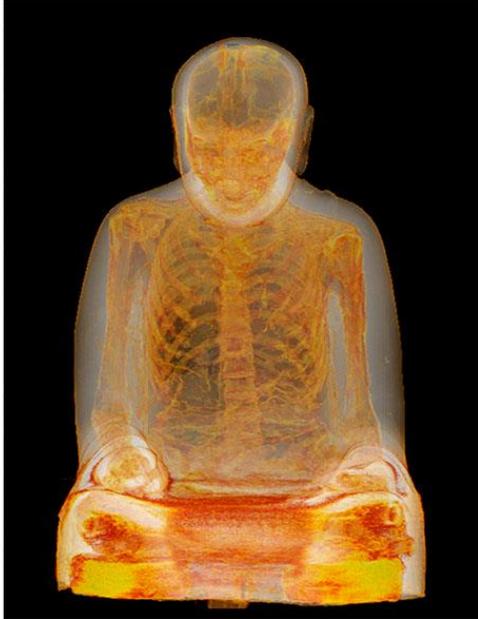
Positron Emission Tomography (**PET**)  
Computerized Axial Tomography (**CAT**)  
Magnetic Resonance (**RM**)

Used in medical field for analysis, they return a value of density for every point in the object space

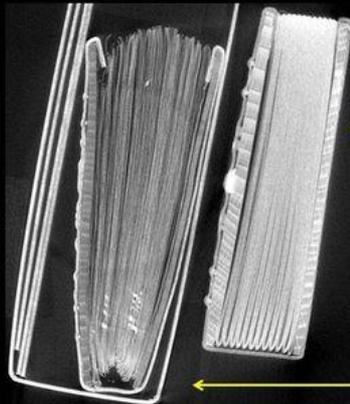
well... it is not really 3D scanning... but have been used for cultural heritage too



# Volumetric acquisition



## Facsimile comparison



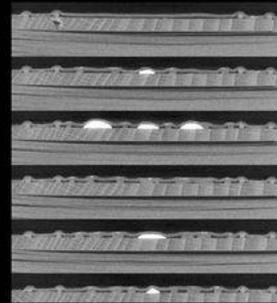
← Facsimile

← Original in phase box

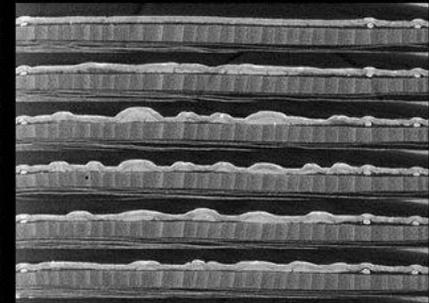


Folio size 138 x 92 millimetres

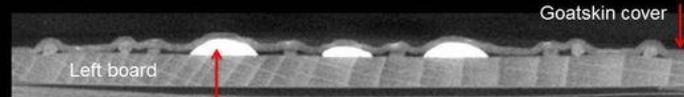
## Central motif filling



Facsimile



St Cuthbert Gospel



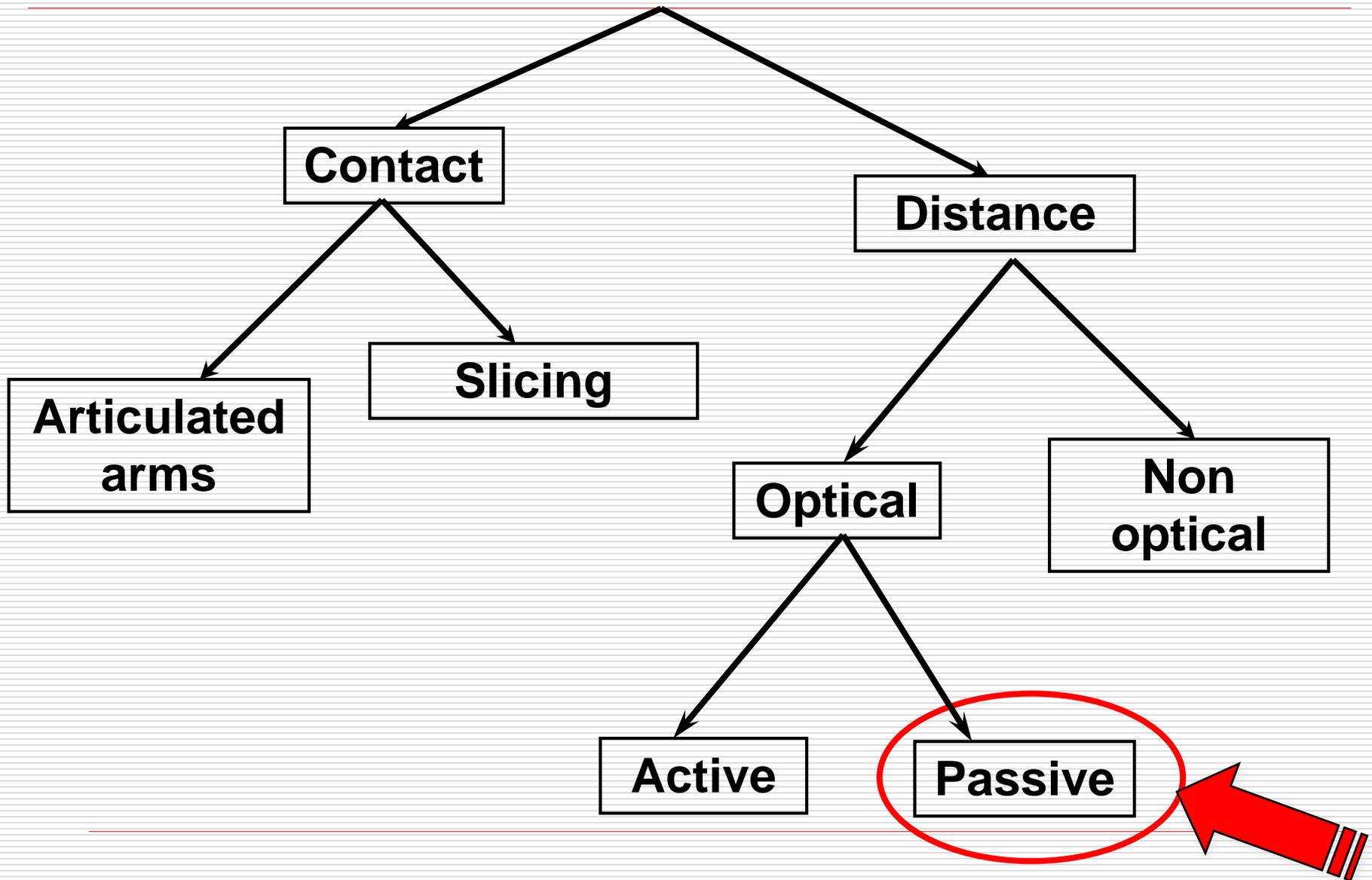
Left board

Gesso used as filler in the facsimile

Goatskin cover

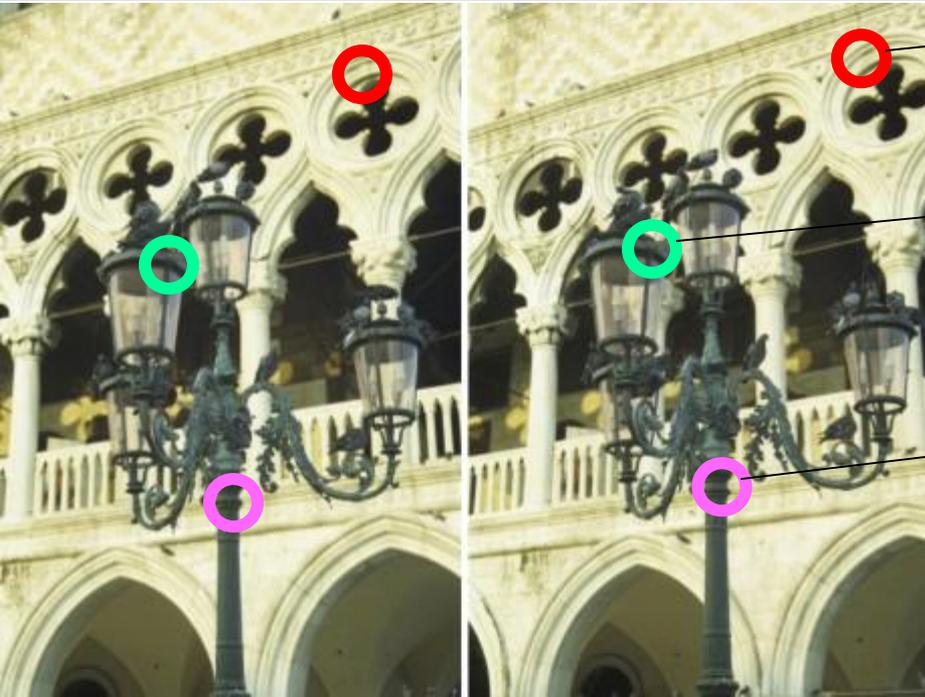
# 3D scanning: a taxonomy

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# Shape from Stereo

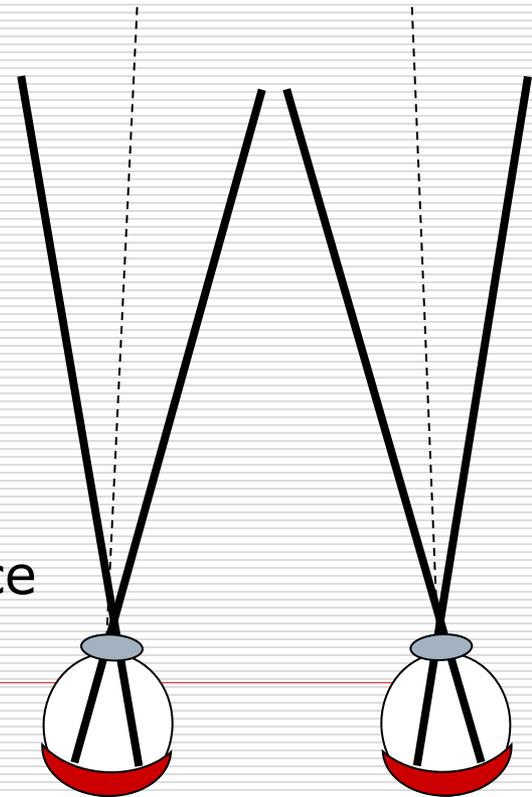
Based on the same principle of human stereo vision: two sensors that perceive the world from slightly different position. From parallax it is possible to obtain a depth for each visible point  
Our brain does this in automatic... A machine can be programmed to do the same



Same position  
=> background

High variance  
=> close

Mid variance  
=> mid distance



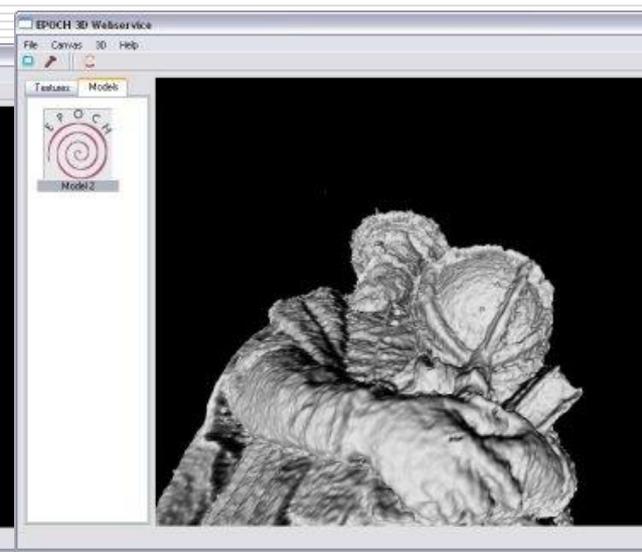
# Multi image

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From two to many... the PC can exploit multi-view parallax, and determine the geometry of the framed object.

All of this, fully automatically !!!

Started as a research trend some years ago in Computer Vision, now it is a solid technology.



# The new trend

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In the past 4-5 years, from zero to hero... Now is one of the most used digitization technologies in the CH field, under many names

- Multiview stereo
- Dense stereo match
- 3D from photos
- Dense Photogrammetry

Many different tools, all uses the same basic technique.

We will spend at least one day on this...

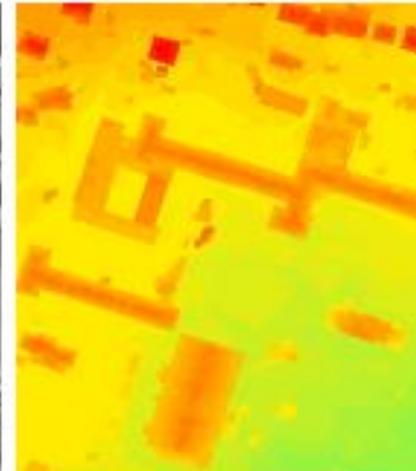
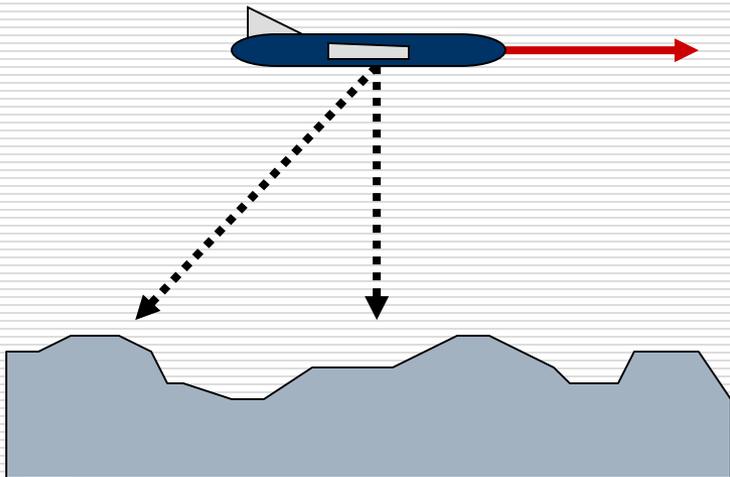
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# Aerial / Satellite

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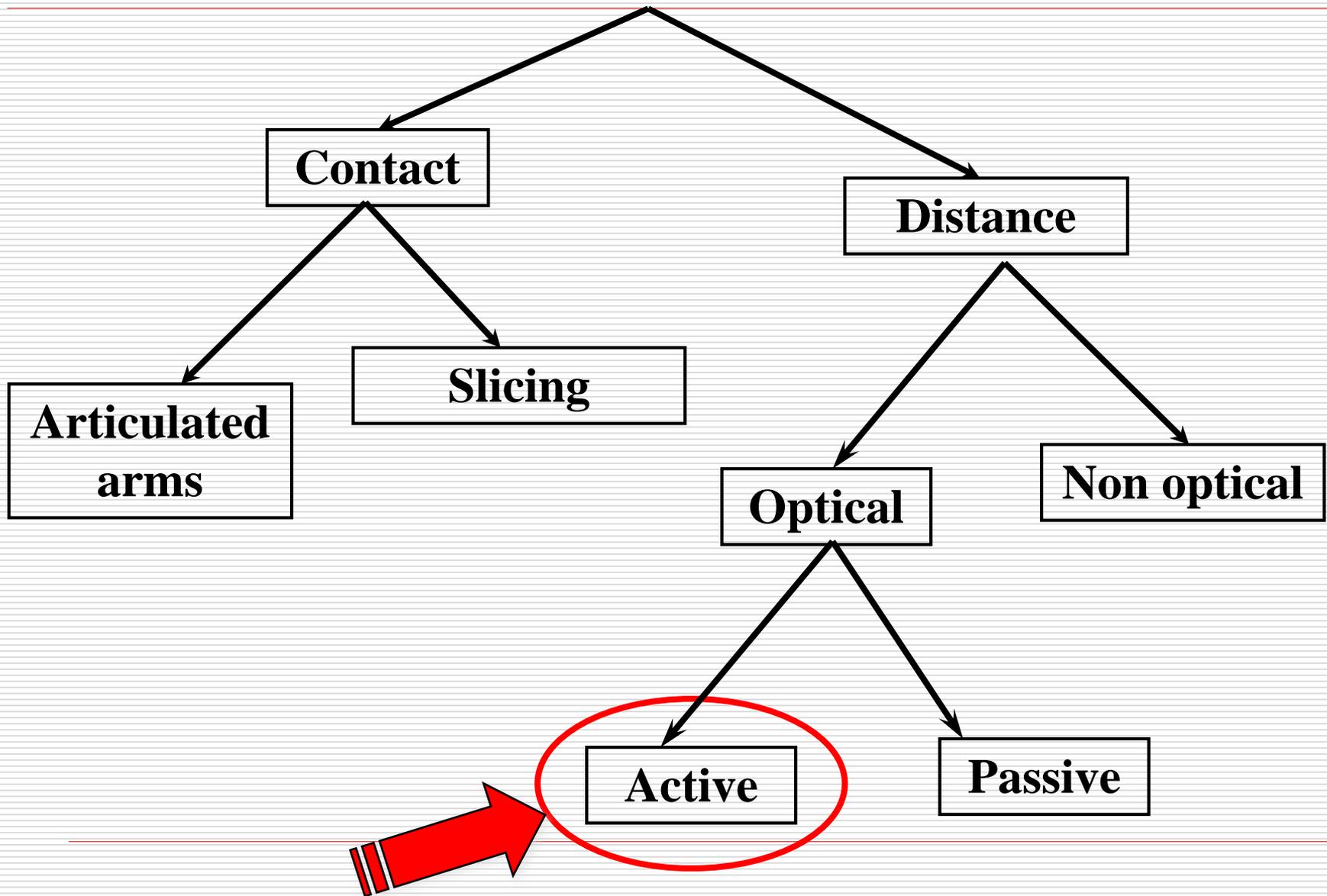
Same principle, disparity comes from different view directions and/or the movement of the plane, features are isolated and matched to generate a depth map... Same strategy is used also from satellites

Now, with drones, everyone is using the above mentioned 3D from photos methods



# 3D scanning: a taxonomy

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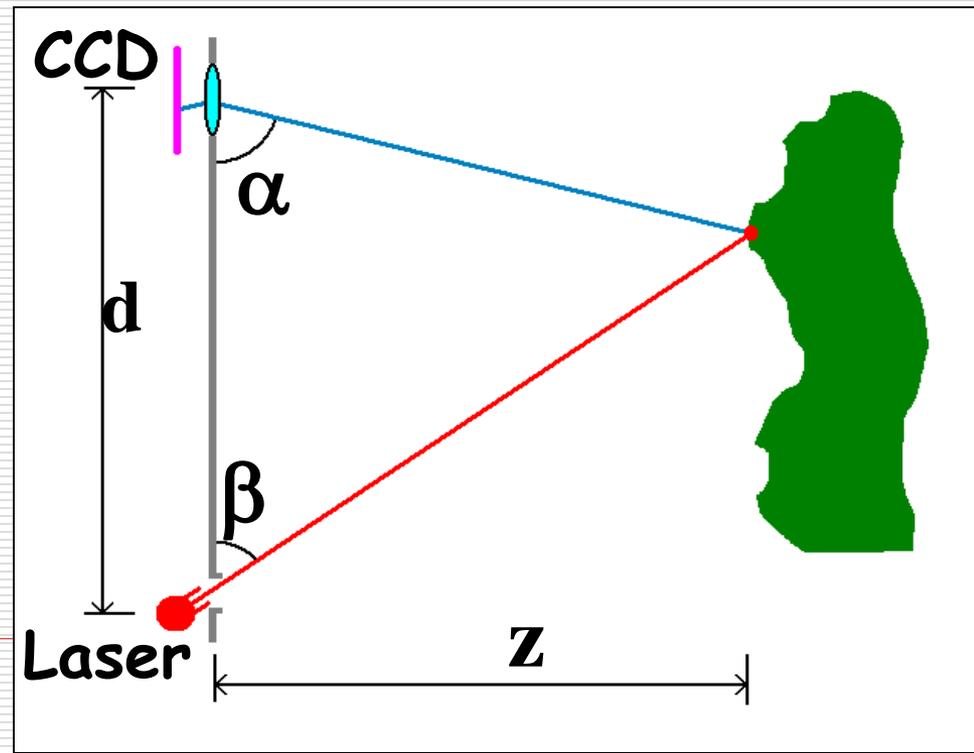
# Triangulation

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A light is projected on the surface and its reflection is read back by a sensor... Using trigonometric calculation it is simple to recover the 3d position of the illuminated points

The geometric principle is the simplest possible! The real problem, to obtain precision, is to carefully calibrate each component

Knowing the emission and reception angle, and using the distance between the emitter and the sensor, the distance of each sampled point is calculated



# Minolta Vivid 910

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- ❑ A commercial scanner, with high precision (0.2-0.3mm), but high cost (>30K euros).
- ❑ A laser line is swept over the object: 300K points are measured in 2.5 seconds.



Accuracy: 0.3 mm  
Cost: 15k Euro (only 2nd hand)



# A cheap scanner: NextEngine

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Entry-level 3D scanner, simple and cheap. Good quality/price ratio. Ideal to investigate the possible use of this technology in a laboratory/museum/superintendence

Pro:

- Small price (around 2k Euros)
- Good resolution and result coherence.
- Highly portable (small and lightweight)

Cons:

- Fixed working distance
- Sloooooow
- Need parameter tweaking
- Does not work well on some materials (dark & shiny)

Accuracy: 0.2-0.5 mm

Cost: 2k Euro

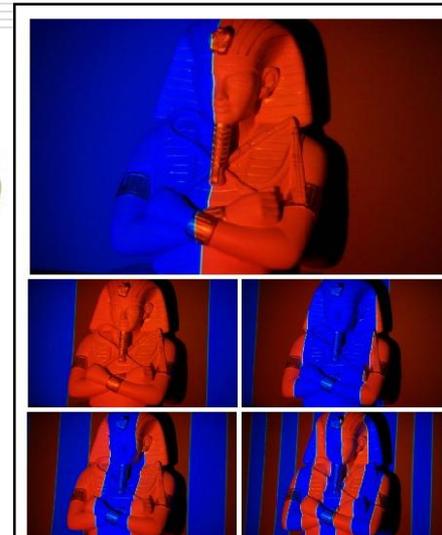
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# Structured Light

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- ❑ The principle is still **triangulation**, but different patterns are projected on the object. Can be more precise than laser-line triangulation, and more resilient to some material-related problems, but require additional hardware and calibration
- ❑ Different companies are offering software able to control a camera and a projector. There are also free/open projects which do so...
- ❑ Many ready-to-use products on the market



# Breuckmann GmbH

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Industrial sensor, designed for optical metrology



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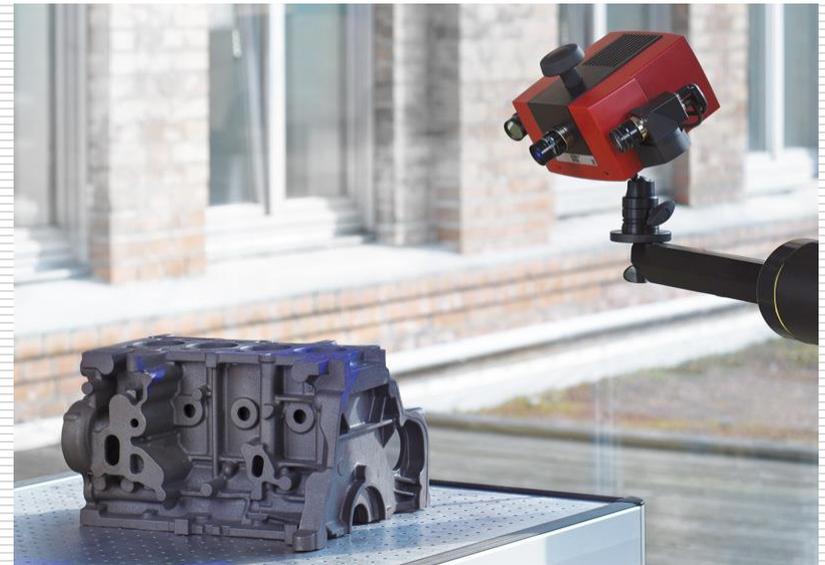
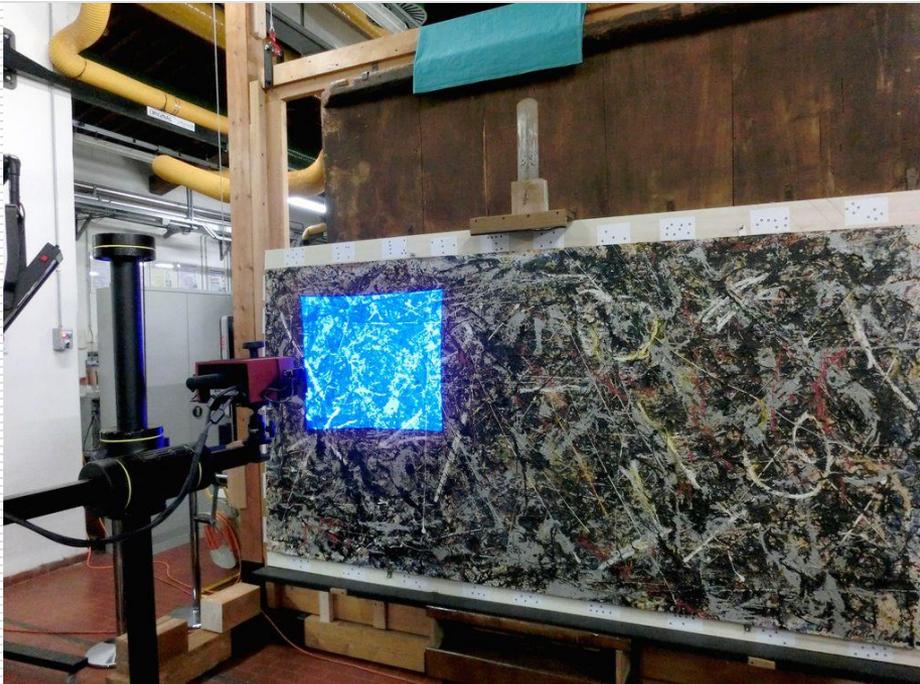
Accuracy: 0.1 mm (or less)

Cost: 70-80k Euro

# GOM

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Industrial sensor, designed for optical metrology



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Accuracy: 0.1 mm (or less)

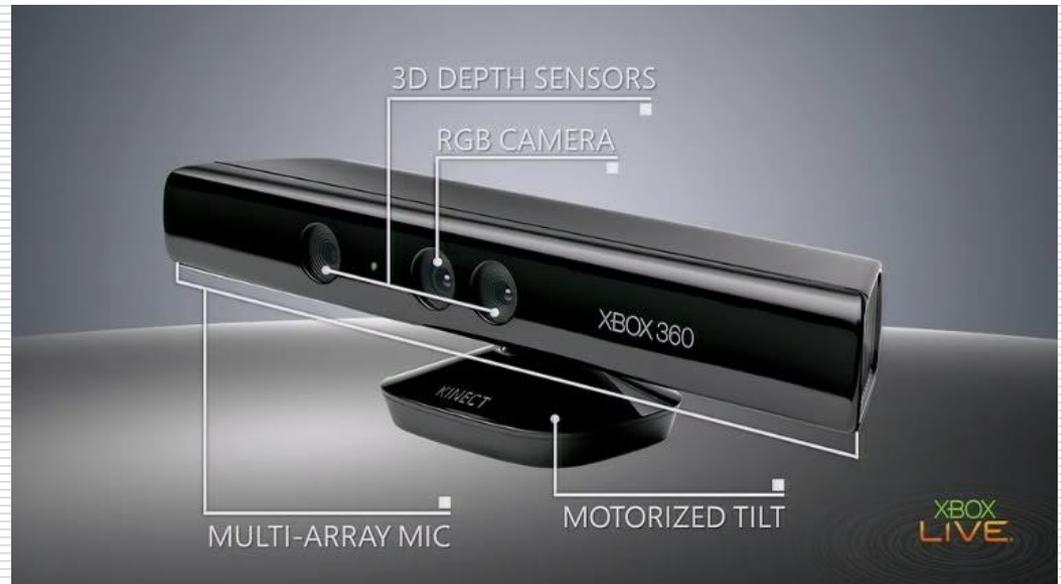
Cost: 70-80k Euro

# Microsoft KINECT (old version)

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- ❑ It is basically a very fast (30fps) structured light scanner. Resolution is not great, very low precision.
- ❑ However, its cost and performances have shaken the community of 3D hobbyists but also of professionals

Accuracy: 2-5 mm  
Cost: 200 Euro



# Microsoft KINECT

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It is possible (in theory) to use the Kinect to do a 3D scanning, however:

- The kinect has been built for speed, not precision: you need a stable position of both the device and the subject. You may need to get more than a shot from the same position and combine it to reduce noise
  - The depth information is compressed, especially in the far area: the subject should stay as close as possible to the device
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# A home-made one: David Laser Scanner

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- ❑ A DIY scanner: you need a webcam and a laser line (plus a couple printed target images).
- ❑ Has a simple calibration procedure and easy-to-use scanning process. But beware! to obtain good results you will need a careful setup and a steady hand...
- ❑ Quite versatile: can work at different scales (with larger/ smaller targets), setup gives some freedom of placement of the components.

Accuracy: 1 mm ?

Cost: (nearly) free!



# David Laser Scanner

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- ❑ Free version output a lower resolution meshes, but still good enough for home-made projects... Pay version has higher resolution, more options and implement the complete processing pipeline (even if MeshLab still works better :) ).
  - ❑ In the latest version, is also supported the use of a digital projector (structured light).
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# Hand-held 3D scanners

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These scanners are a bit less accurate than metrology-oriented devices, but they are easy to handle and quite fast.



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Accuracy: varies a lot  
Cost: varies a lot

# Hand-held 3D scanners

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They use:

- Time of flight camera (more info later)
- Triangulation
- Phase shift (more info later)
- Stereo
- A combination of the above methods

This market segment is expanding... There is a progressive separation of the market between high-end metrology devices and this kind of "quick and easy" scanners...

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# Artec scanners

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Quite diffused in CH, the maker community, and industry.

"Relatively" cheap, fast and versatile.

Ideal for no-so-large unmovable objects

They also capture color



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Accuracy: 0.5-0.1 mm

Cost: 15-20k Euro

# Kinect-derived

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Use an updated/re-engineered version of the Kinect sensor.

Very cheap and extremely portable!

Human-size to room-size



Accuracy: 1-2 mm

Cost: 500-?k Euro

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# What about larger Objects ?

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This is a very common question... The answer is, you do need a different instrument

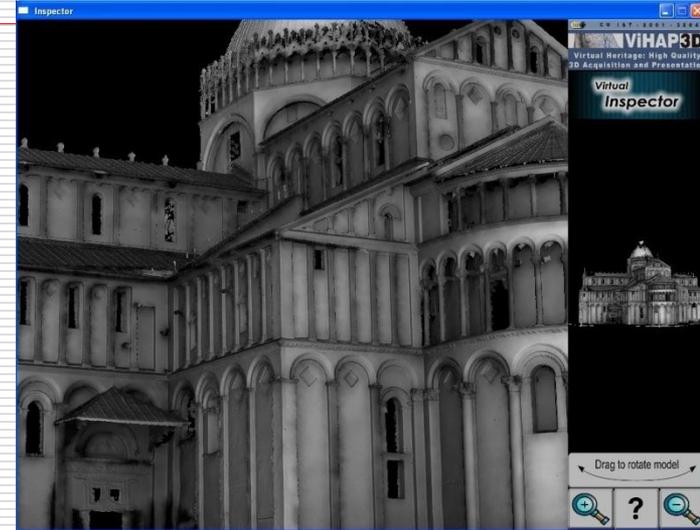
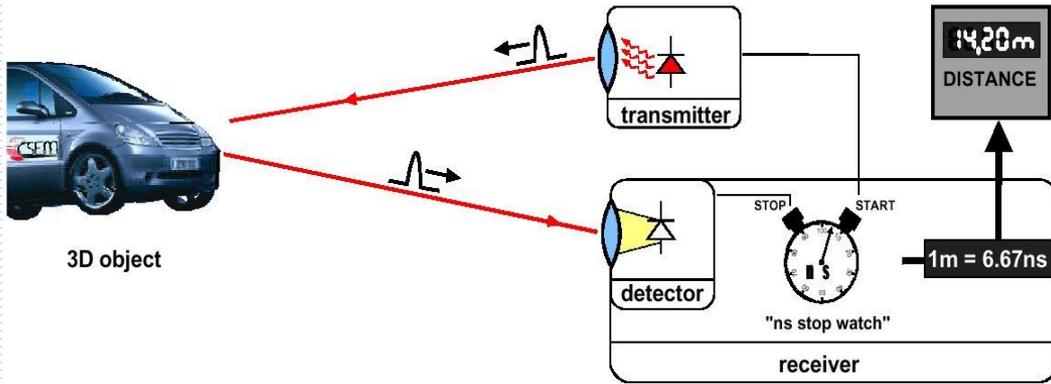
Triangulation cannot work on very large objects, it would require an extremely large baseline...

Always remaining in the kingdom of light signals and optical properties, a different strategy is used

These scanners are often indicated as **TERRESTRIAL LASER SCANNERS...**

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# Time of Flight (TOF)



The distance of sampled point is obtained by measuring the time between the laser impulse and the sensor read-back, divided by (two times) the speed of light...

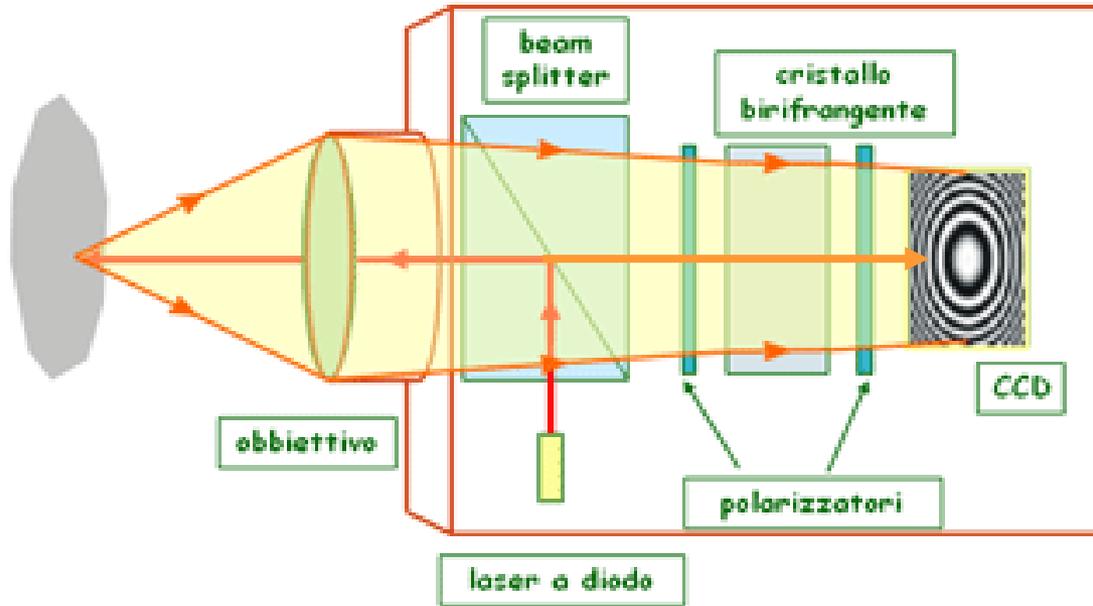
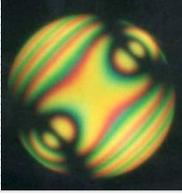
The measurements is repeated on a regular grid on the object surface

WARNING: working with the *speed of light* reduce the measurement precision...

Accuracy: 5-10 mm  
Cost: 50-100k Euro



# Phase interference



The direct and the reflected beam arrive on the crystal, frequencies are no longer aligned, producing interference... interference bands are used to determine the distance of the sample

The same principle is used on two different scales:

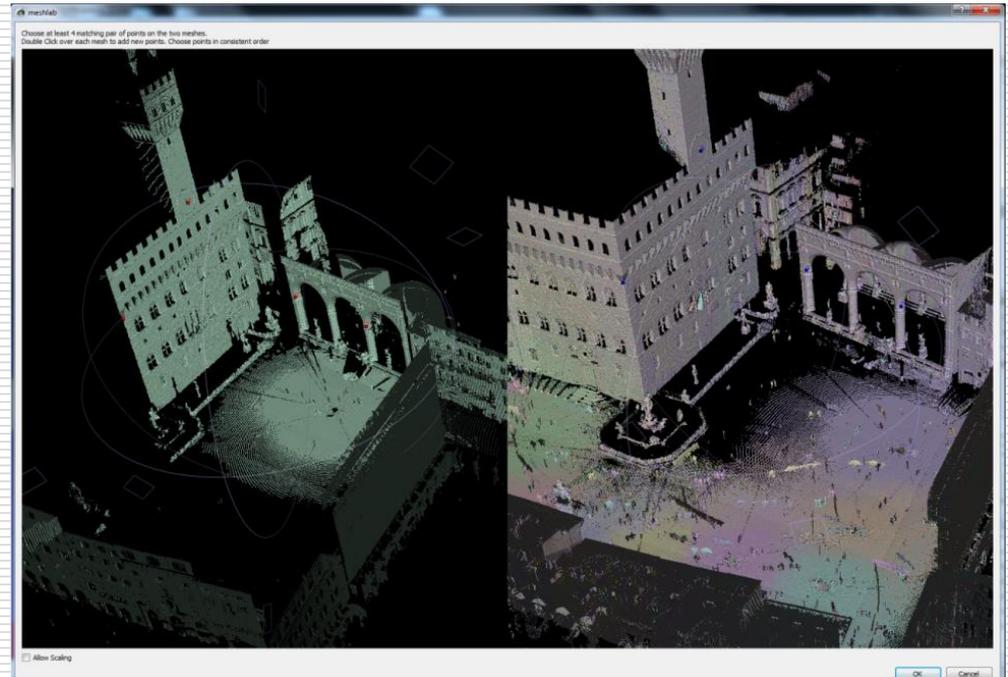
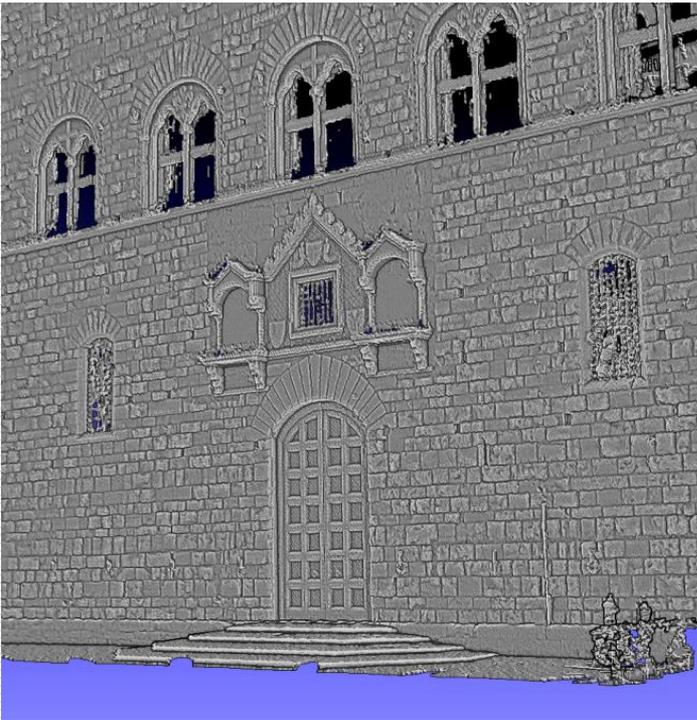
CONOSCOPY: coins, paintings, small relief

INTERFERENCE TOF: buildings

actually, three: interference cameras for human-size objects, using fast, synchronized "flashes"

# Time of Flight + interference

- The use of interference means more precision and a faster acquisition
- May reduce the working range.
- Nowadays, this is the most used family in CH



Accuracy: 1-2 mm  
Cost: 30-80k Euro

# Big Names

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- ❑ **Leica** (Cyrax): most diffused, produces all possible tools for survey
  - ❑ **FARO**: affordable and most portable, also produces small-scale 3D scanners
  - ❑ **RIEGL**: long range scanners, and inertial platforms
  - ❑ **Z+F**: produces sensor hardware, sometimes re-branded by other companies
  - ❑ **TOPCON**: extremely popular in US for engineering and construction works
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# LIDAR / SLR

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Elevation data measured by satellites. But not only geometry...

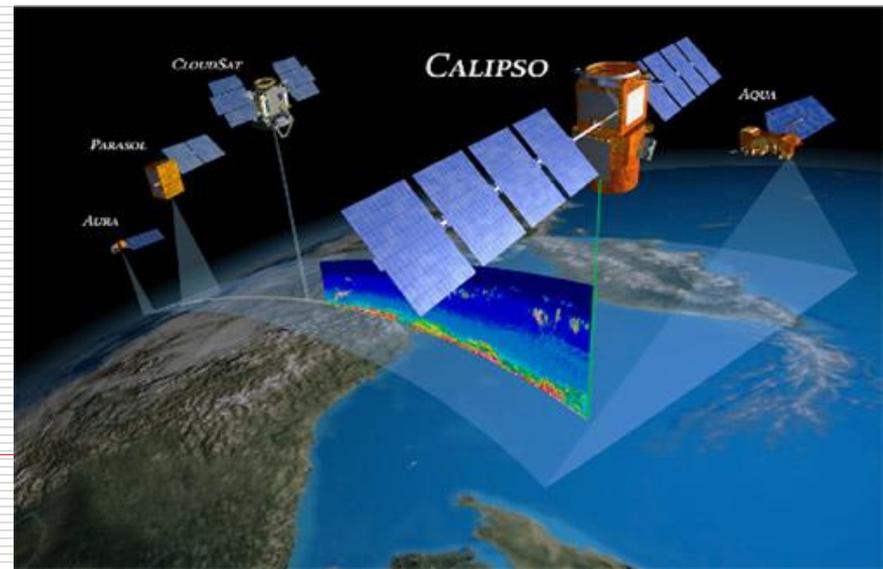
Used in combination with analysis of multiple returning signals, can “see” through vegetation

Using different frequencies and analyzing the returned signal, it is possible to distinguish the nature (building, road, water, cultures ...) of the probed area.

Average error on distance: less than a meter

**SLR**  
**satellite laser ranging**  
**LIDAR**  
**light detection and ranging**

Accuracy: < 1m  
Cost: hahaha...



# Microsoft KINECT v2

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- ❑ New version, much better capabilities... Uses a Time of Flight camera. Resolution is better, as also accuracy.
- ❑ The kind of noise is different, some of the software tools for kinect V1 do not work with the new version

A set of tools to exploit this new performances is still missing 😞

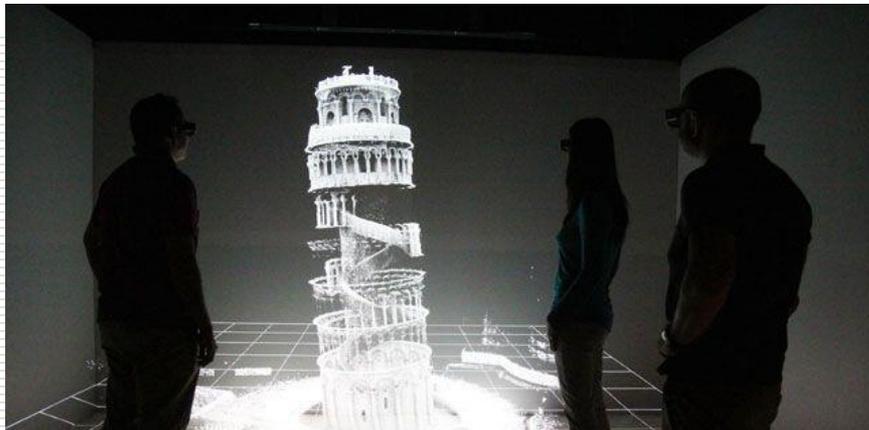
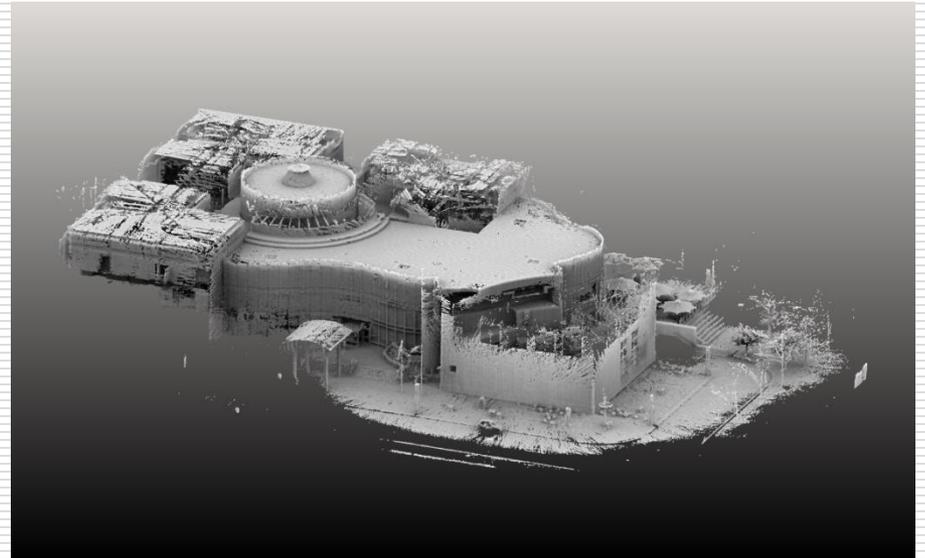


# Large areas/low cost?

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An interesting solution is the Zebedee scanner: a line scanner on top of a spring. You just walk and acquire...

Accuracy in the order of a couple of cms, but not bad for big areas.



Accuracy: 2-3 cm

Cost: 15k Euro (+ processing)

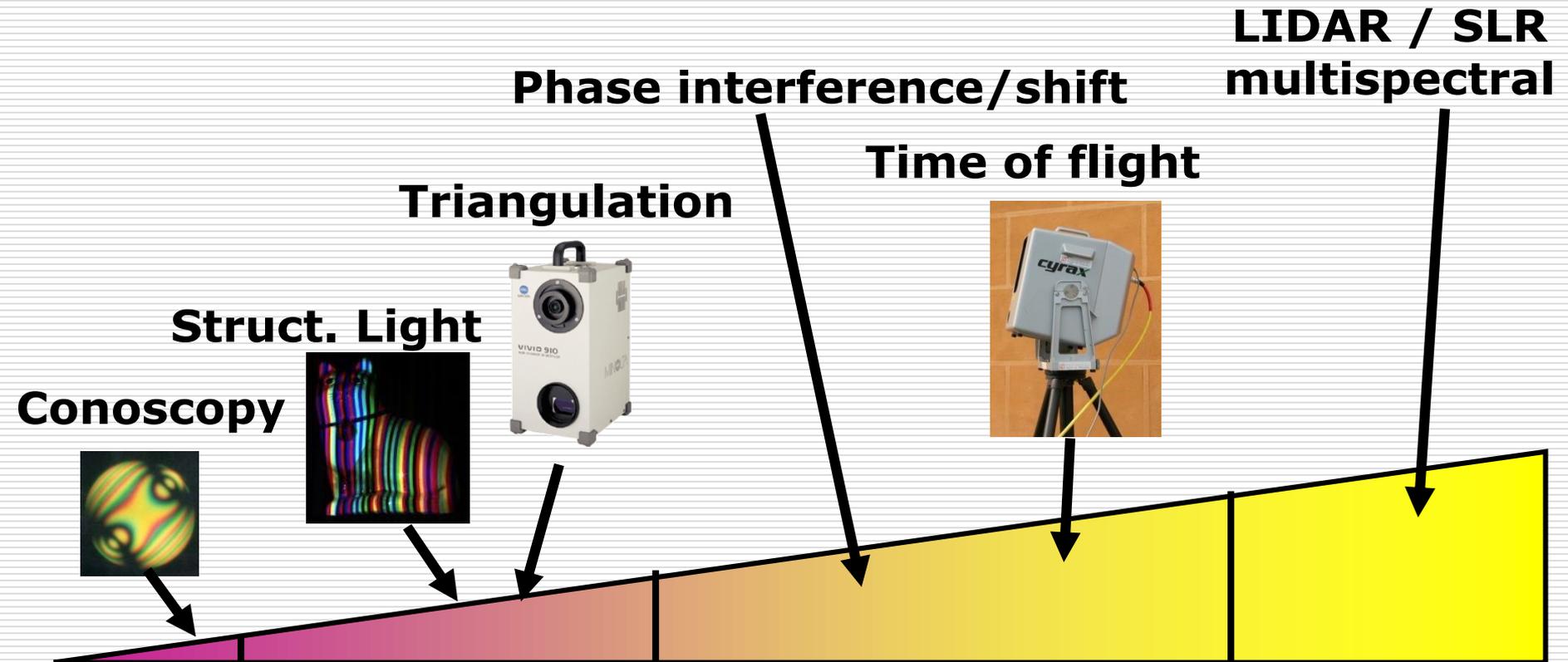
# 3D scanning devices

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Sensor is no longer the main problem...

The gamut of measurable object is increasing, in terms of both size and material

New hardware is made available as we speak...



# Only points

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Regardless of the technology, 3D scanners only measure the spatial position of POINTS.

All that is returned from a single “shot” is just a series of points in the 3D space.

The characteristics of the points generated by the scanner do depends from the kind of scanner used.

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# Range map

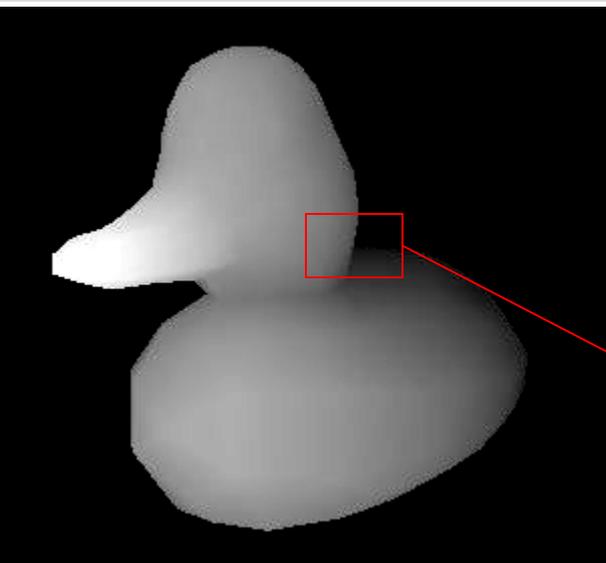
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Almost all optical scanners uses a **camera** as input device.

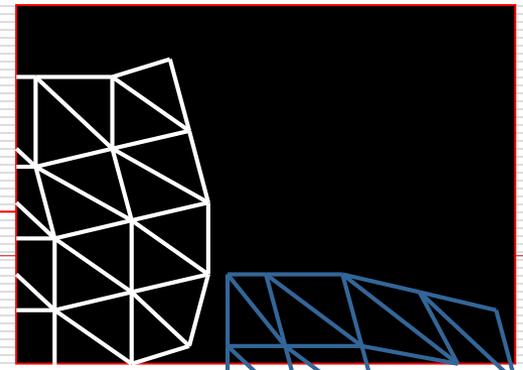
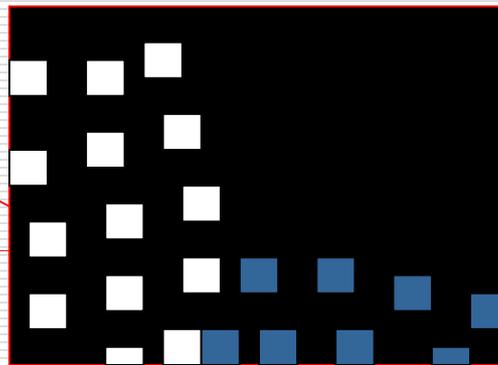
What is recovered after a single shot is a depth value for each pixel in its sensor which is converted in a 3D point.

So, from the point of view of the scanner, all the 3D points are on a REGULAR GRID, that is promptly triangulated using this intrinsic regularity.

This is possible (without introducing much error) because of the limited Z-span.



The result of a single scan is generally called a RANGE MAP

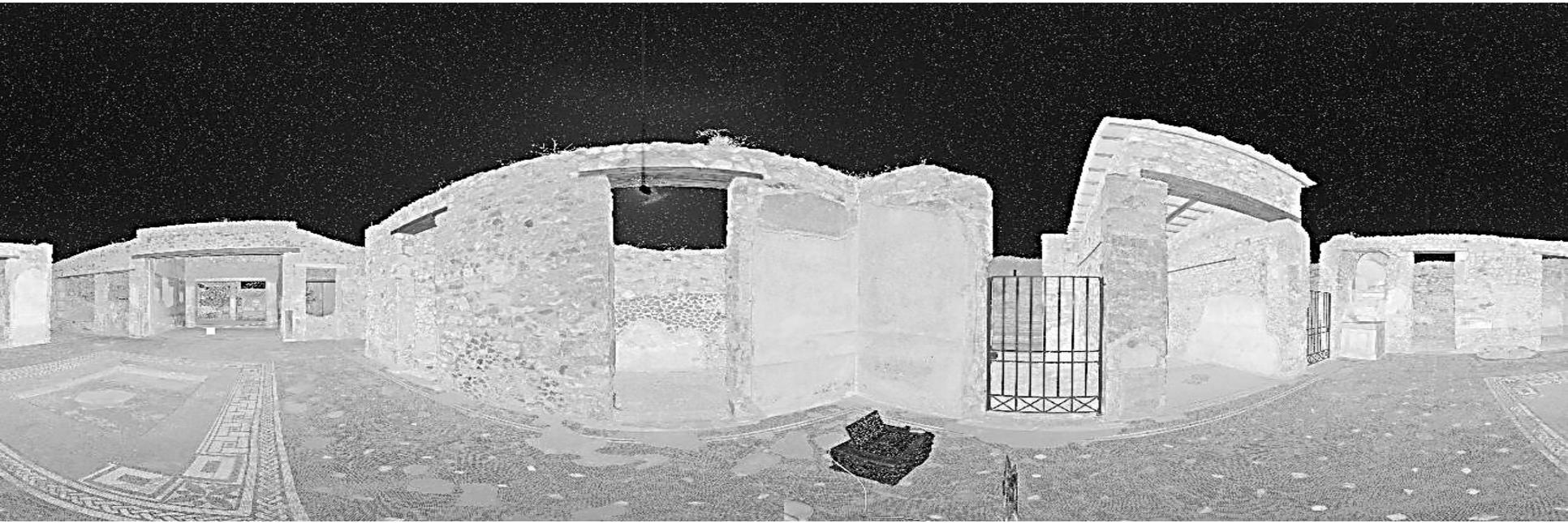


# Polar Range map

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Terrestrial laser scanners measure **one point at a time**. This distance measurement is iterated rotating along two axis. Each scan, thus, creates a polar grid.

There is still a regular grid, but as the Z-span is too large, it is generally not advisable to triangulate them. TLS scans are normally kept and processed as pointclouds.



# Aggregated clouds

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Some scanners (mostly handhelds) do produce aggregated clouds, where the grid/radial structure is lost.

This is because some processing (alignment, as we will see later) has already been done.

This restricts the kind of filtering, cleaning and processing you may do on the raw data.

There is not much you can do about it, save that to use it as a whole.

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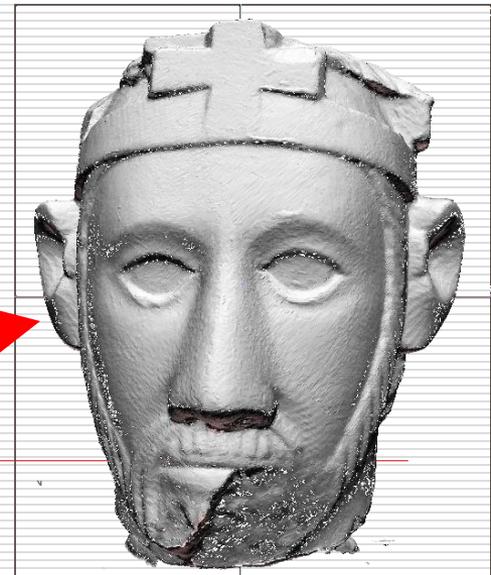
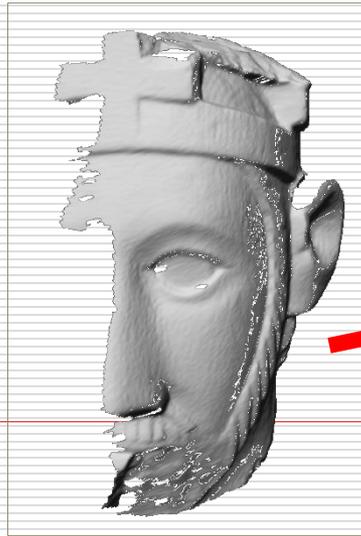
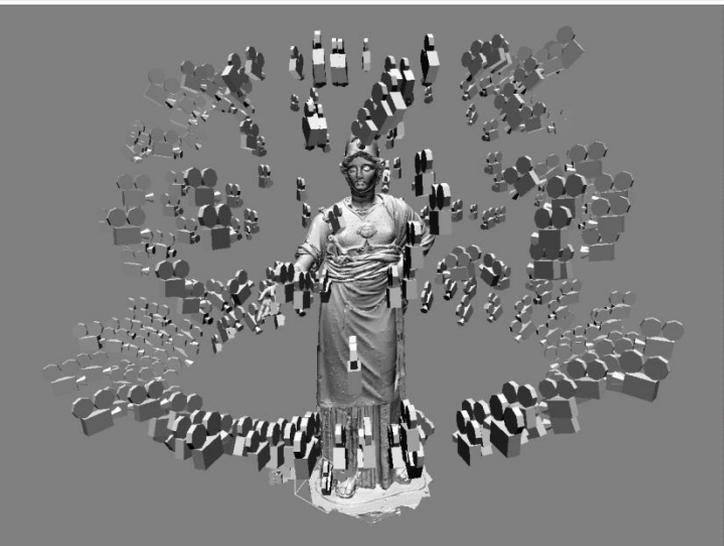
# All that remains

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A range map is already a 3D model... but it will be surely incomplete

A single acquisition **IS NOT** enough to reconstruct an entire object  
Multiple shots are needed... How many? Which one to choose ?

The scanning is just the first step to obtain a complete model



# 3D scanning technology: limitations

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3D scanners can cover a variety of objects, but there are still some limitations. Some of them can be overcome, others are intrinsic:

- Visibility (direct, cone of visibility)
  - Color (black, pure color)
  - Material (reflective, transparent and semi-transparent, peculiar BRDFs)
  - Acquisition environment (temperature, illumination, crowded places)
  - Size vs. Single map acquired (accumulation of alignment error)
  - Non-rigid stuff
-

# The «Error»

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Everyone asks “how precise is this scanner / 3D model?”. But this is a very tricky question...

Scanner data sheets are laboratory condition, determined with metrology tests. They are significant as the tech specs of your car (i.e. not that much)

On-the-field conditions do affect the data quite a lot, so do the material of the object, so do the scanner distance/angle. So, it is not even possible to give a single number for the accuracy of a single shot of the scanner, as the value changes point by point.

X-Y error is different from Z error:

- X-Y position is determined by the scanning grid (low error)
  - Z (depth) is calculated, and here is most of the error
-

# The «Error»

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It has been proven error in a single scan is not “white noise”, but still, it can be lessened by redundancy.

There are systematic and recurring errors, sometimes local (specular highlights, black-to-white), sometimes global (vibrations, moiré patterns).

Determination of the error is often a matter of “thumbing it”

Error is bound by the greatest of:

- Resolution (how far are two measured points)
    - Actually, should be half of the resolution for the sampling theorem
  - Scanner sampling error (at least the value in the data sheets, but normally higher)
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# Model Generation

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# And now?

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Now the real work begins... From single shots to a complete, usable 3D model.

Every scanner is bundled with a control software. The software is able to do all the processing. This is true in some cases, but often you will rely on external tools

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# Software tools

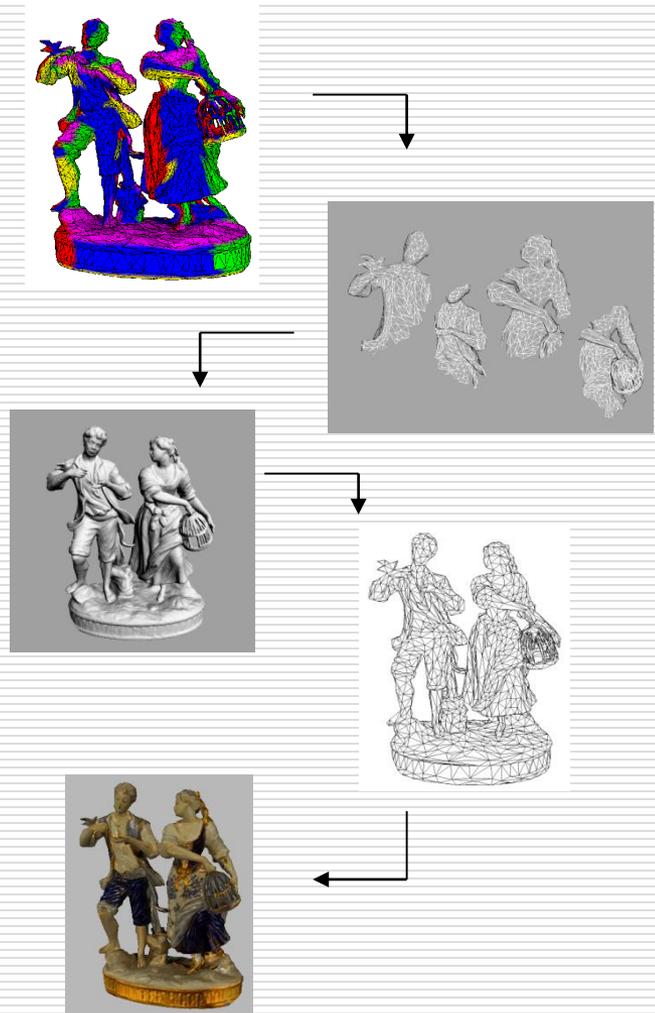
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Beside a series of very specialized tools for 3D data processing, these three software are the most used general-purpose tools in CH:

- ❑ **GEOMAGIC**: commercial, the most used tool by professionals.
  - ❑ **MeshLab**: opensource, 3D meshes and pointclouds processing, powerful and versatile. Not really user friendly.
  - ❑ **CloudCompare**: opensource, for the processing of pointclouds. Very advanced and versatile. Even less user friendly.
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# 3D Scanning Pipeline

- [ **Acquisition planning** ]
- **Acquisition** of multiple range maps
- Range map **filtering**
- **Registration** of range maps
- **Merging** of range maps
- Mesh **Editing**
- **Capturing/Integration** of **appearance** (color acquisition, registration, mapping on surface, color visualization)
- [ **Archival and data conversion** ]



# Alignment

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Each part of the model is in its own coordinate system. There is no spatial relationship between the different parts, as they have been generated in a different shot

Goal: bring all the parts in a common reference system (like a 3D jigsaw puzzle)

Beware: lot of manual intervention is needed!

Two steps:

- 1. Rough** alignment: user manually positions the various chunks in more or less the correct position
- 2. Fine** alignment: the computer automatically perfects the alignment using the shared area between the range maps

Redundancy is MANDATORY

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# Manual Alignment

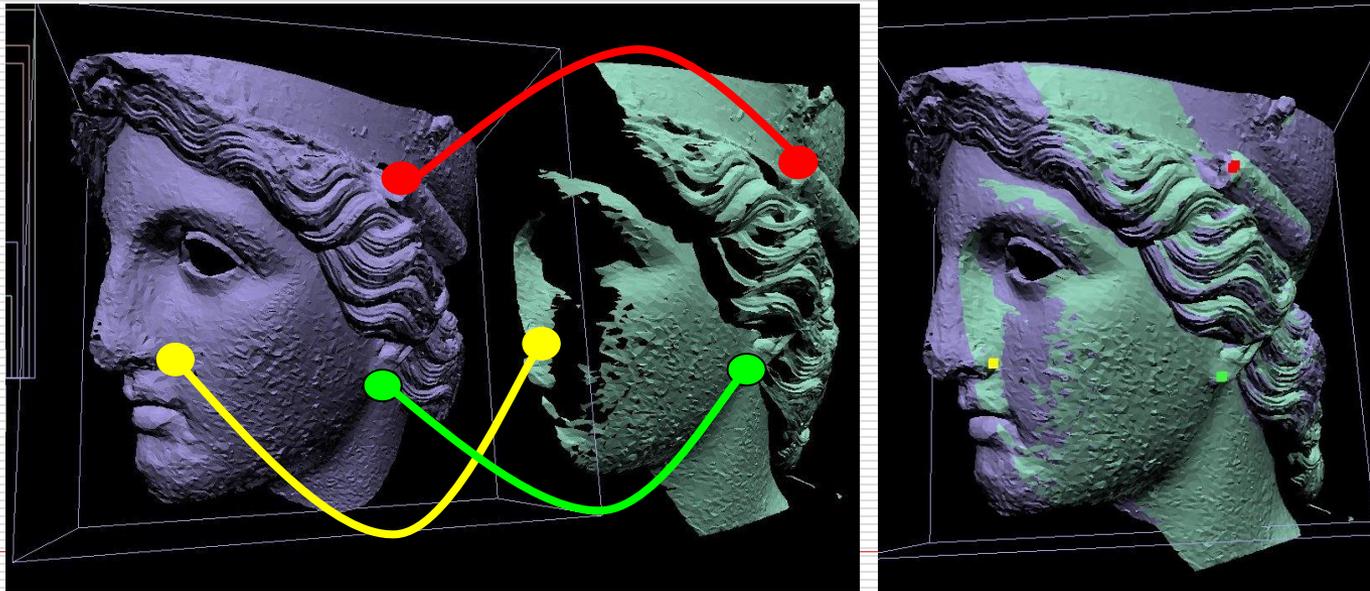
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First step.

It is necessary to have an overlap region with some common feature

Common method: picking shared reference points.

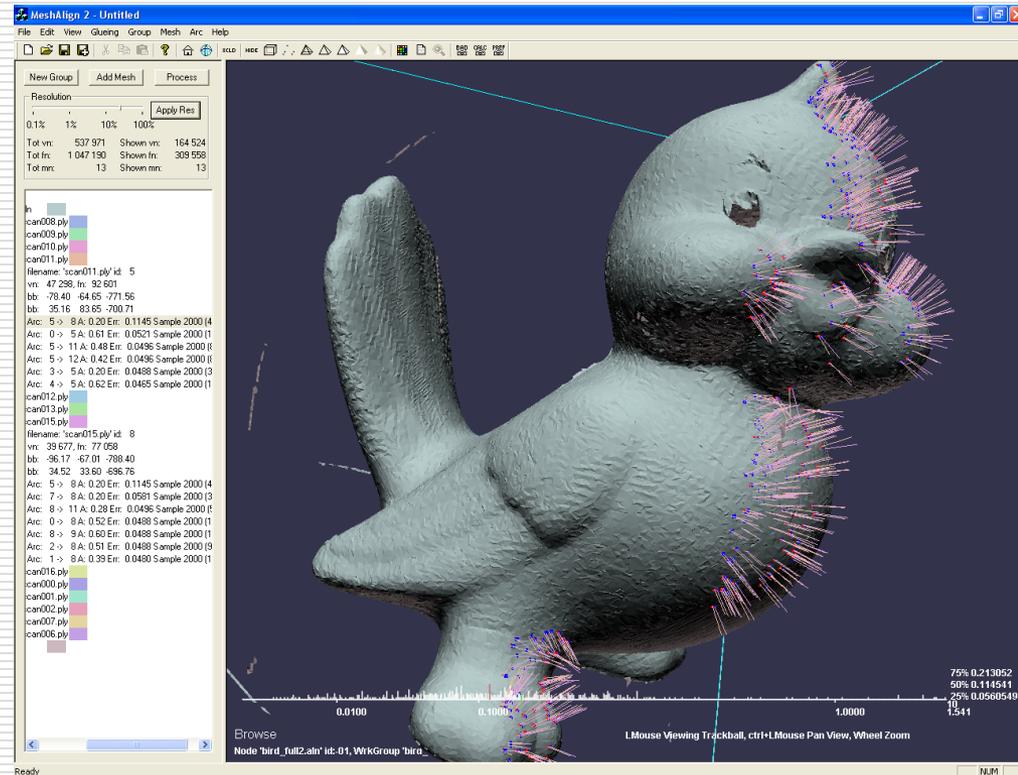
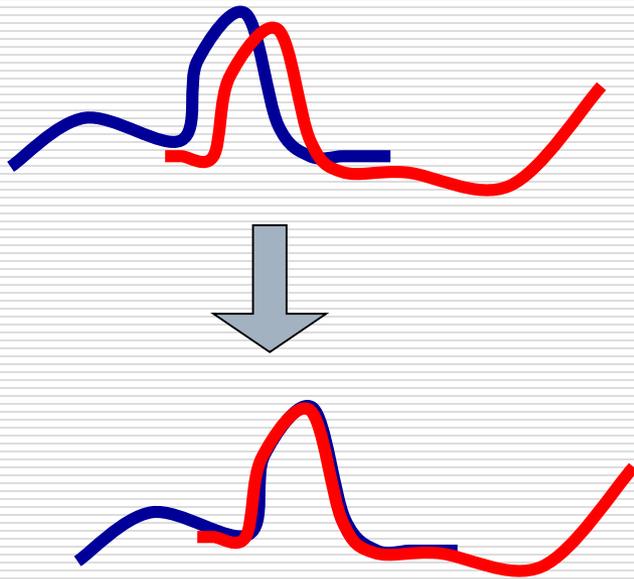
Models are roughly positioned according to the point couples selected. Not a perfect alignment, but enough to start the next phase



# Fine alignment

All the range maps are finely registered using redundant areas that are present in adjacent range maps.

Range maps are moved until the common parts are stucked together



# More than 2

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This strategy is for two meshes. What happens when there are more than 2?

- ❑ ICP alignment is done on all the overlapping couples
- ❑ Global optimization, a.k.a. Bundle adjustment is used to combine all individual movements, and evenly distribute the error

This ICP+global strategy is used by all software tools, with a lot of differences in implementation and interface.

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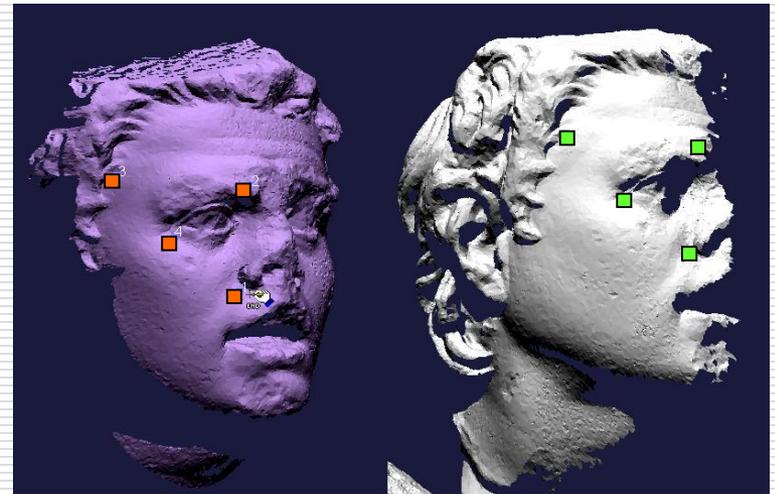
# Example: MeshLab

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MeshLab does implement ICP+global alignment

Can work on pretty large datasets, and it is not so complex to use (after a few tries)

- 4 or more point matching
- Global optimization
- Tweakable alignment parameters
- Good feedback on error
- Works on triangulated surfaces  
AND pointclouds (with normal)

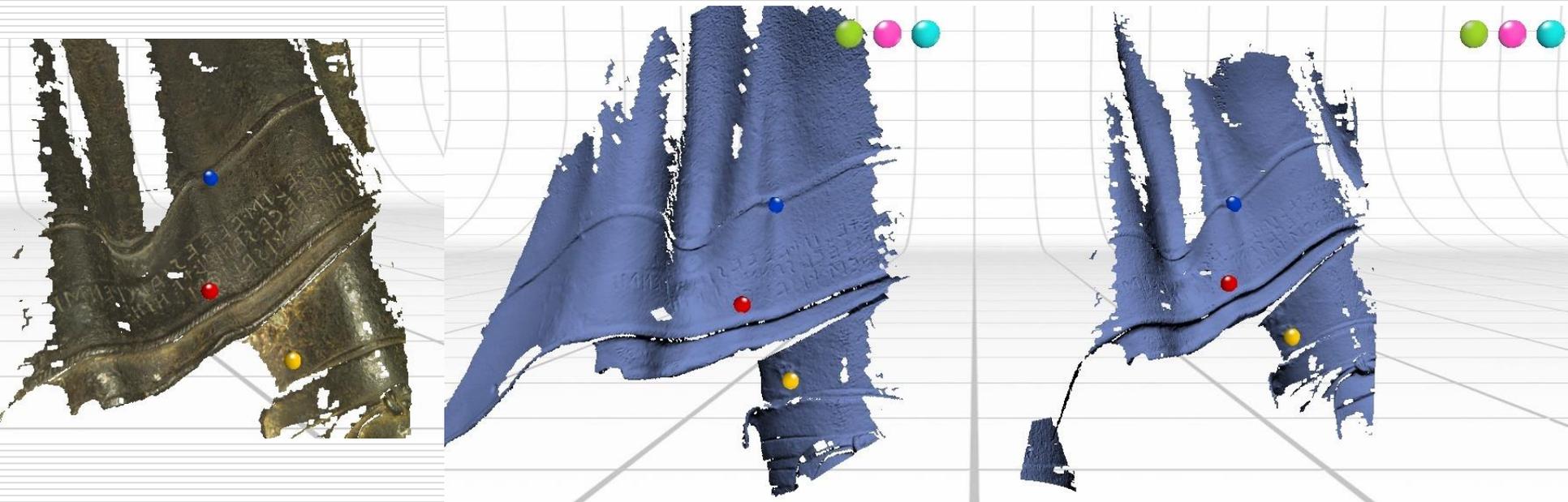


# Example: NextEngine ScanStudio

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Bundled with NextEngine Desktop Scanner

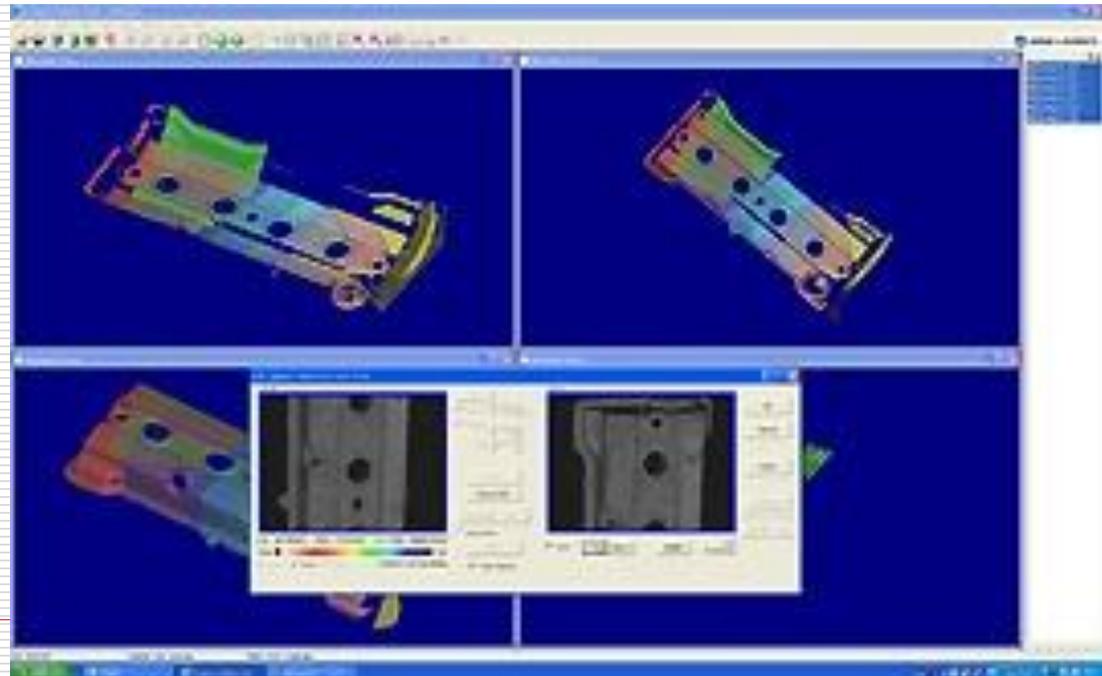
- 3 or more points rough alignment (on geometry or geometry +color)
- semi-automatic alignment for rotary stage scans
- Fully automatic fine alignment (just with target error)



# Example: Minolta PET

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- alignment during acquisition, selecting points on the viewfinder
- 1 point alignment (if possible)
- Automatic alignment for rotary stage scans
- Fully automatic fine alignment (some parameters)



# Example: Breuckman / GOM

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Metrology devices have a more advanced processing software...

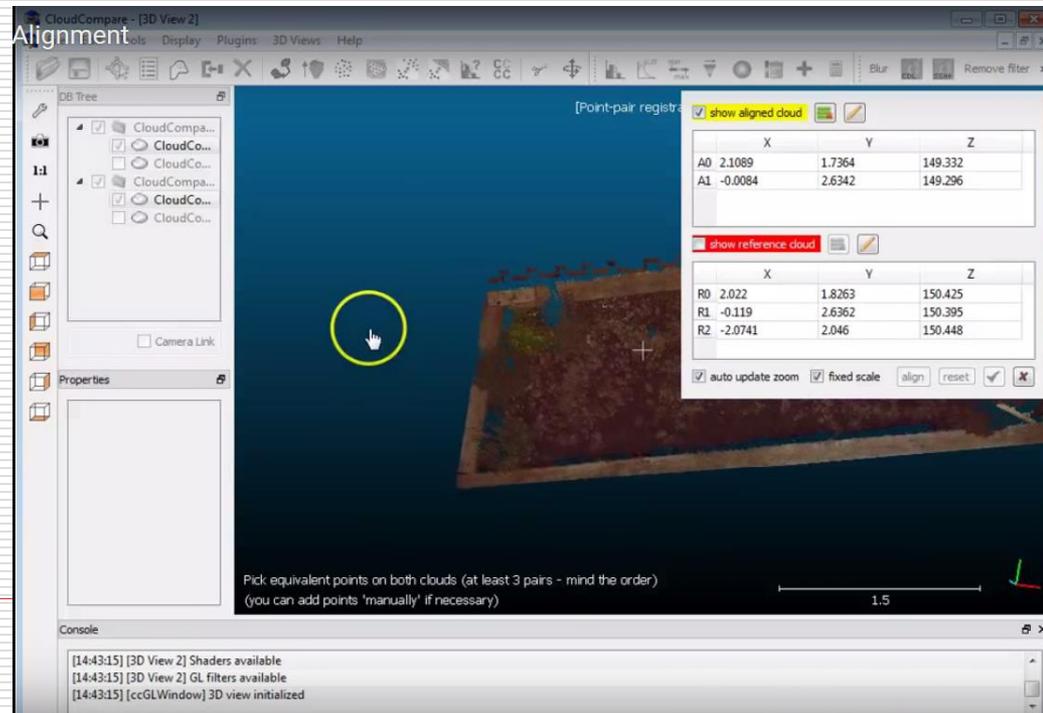
- Align while scanning: software automatically finds alignment of new scans, comparing the new scan with the previous one and what has already been scanned.
  - If automatic alignment fails, software asks for 1 reference point (GOM) or multiple reference points until convergence (Breuckman)
  - Fully automatic fine alignment
-

# Example: CloudCompare

Cloudcompare has a series of tools for align pointclouds

- Reference points alignment (see later)
- 3 points rough alignment of pointclouds
- ICP fine alignment (even without normals)

No global or multicloud  
(this may be not true)



# Not always necessary

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Not all scans need the alignment step or, at least, an explicit alignment step.

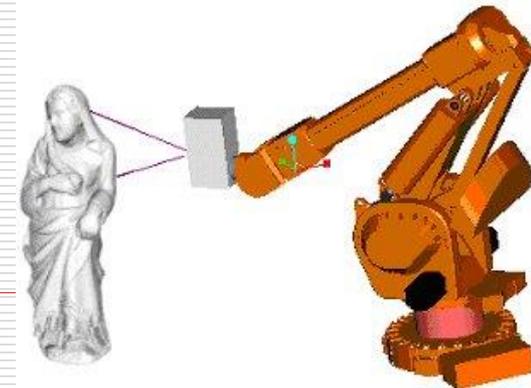
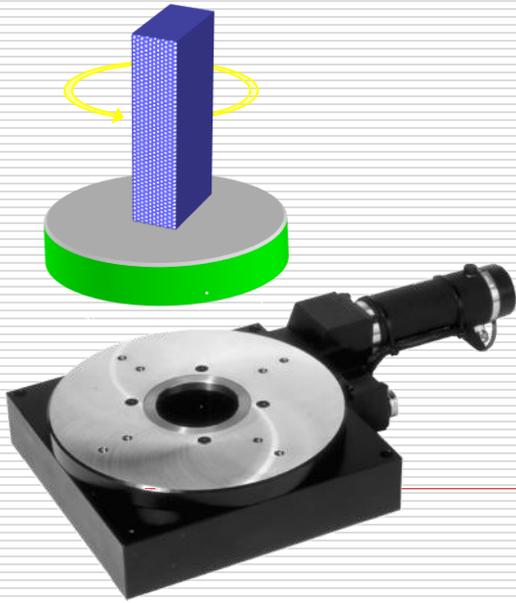
- Satellite data generally comes already geo-referenced
  - Scanner tracking / Progressive tracking
  - Scans can be aligned using reference markers...
  - Automatic matching and alignment is possible in some cases
-

# Scanner tracking

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If scanner position is known in each shot, alignment phase can be reduced (rough alignment) or completely eliminated

- **Rotary stage:** PC-controlled, 1 DOF angle rotation. Simple and effective
- **Arm positioning system:** 2 to 6 axis, complex and costly, but very high precision (active or passive)
- **Tracking system:** generally wireless, less precise than a physical tracking, but flexible



# Progressive tracking

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Most hand-held scanners scan continuously (or a few times per second)...

Each «shot» is aligned to the previous one (or to the accumulated pointcloud)

Error accumulates... So, in most cases, a global optimization is carried out at the end of the scan session.

Different session has to be aligned as described here.

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# Markers

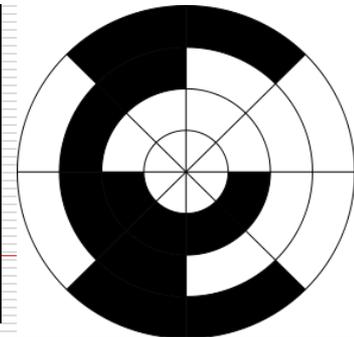
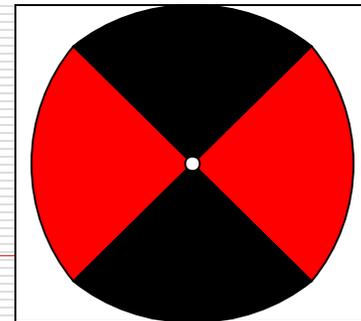
---

Markers are physical objects placed near/onto the surface to be acquired that are recognized by the scanner ( known patterns/geometries, color-codes, materials)

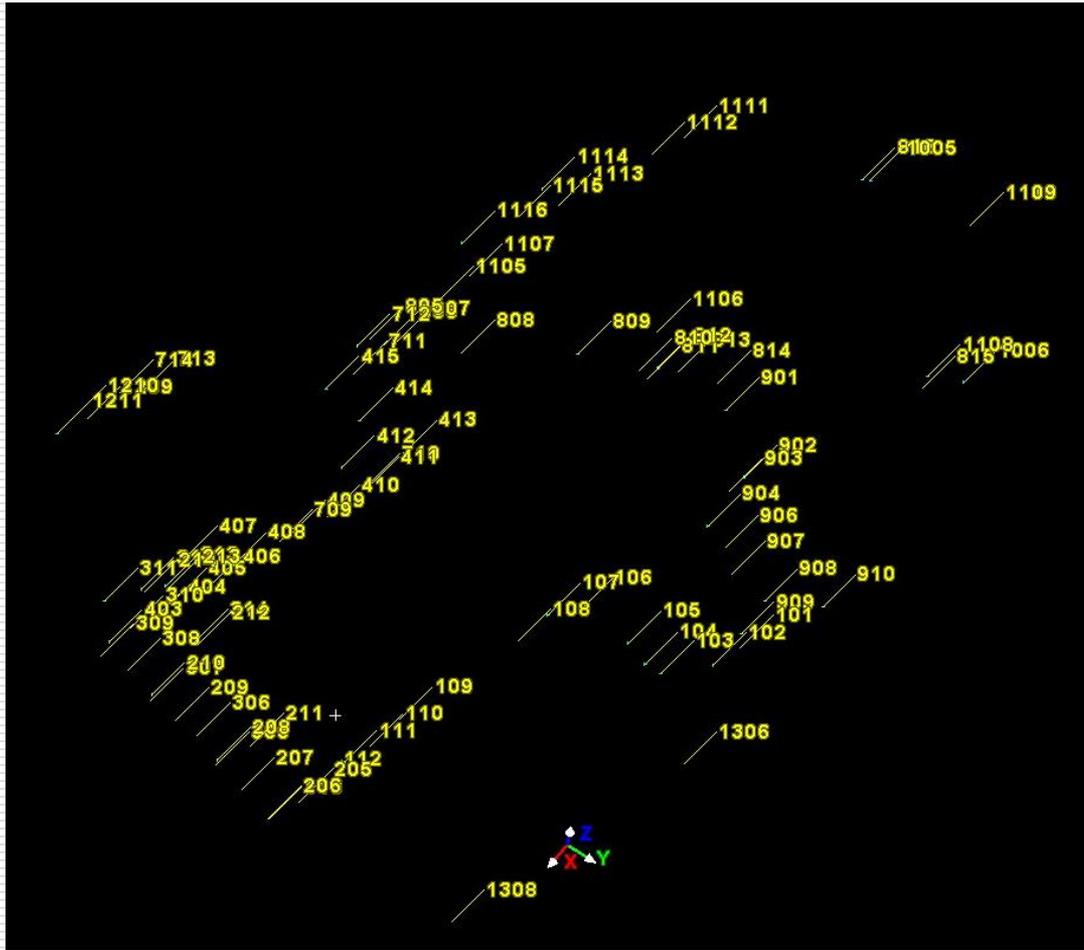
Their position is used as a reference for rough **and** fine registration

“Total Station” is used in surveying and laser 3d scanning of building a theodolite is used to determine the position of reference points.

This technique is quite slow but really precise and reliable (we have used it in the last 7000 years)



# Markers



# Markers

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- ❑ All terrestrial laser scanners uses markers, and this option is natively present in their software
  - ❑ All terrestrial laser scanners software tools do accept external total station reference points
  - ❑ Some triangulation scanners support markers (natively or with an add-on)
  - ❑ It may be possible to mix reference points / markers / geometric alignment, but heavily depends on the software.
-

# Alignment: comments

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The alignment step is a key one in the scanning pipeline. In order to go on with the merging phase, an indication about the error is needed. Final error is bounded by the sum of these two values, but if alignment >> acquisition, acquisition is masked out:

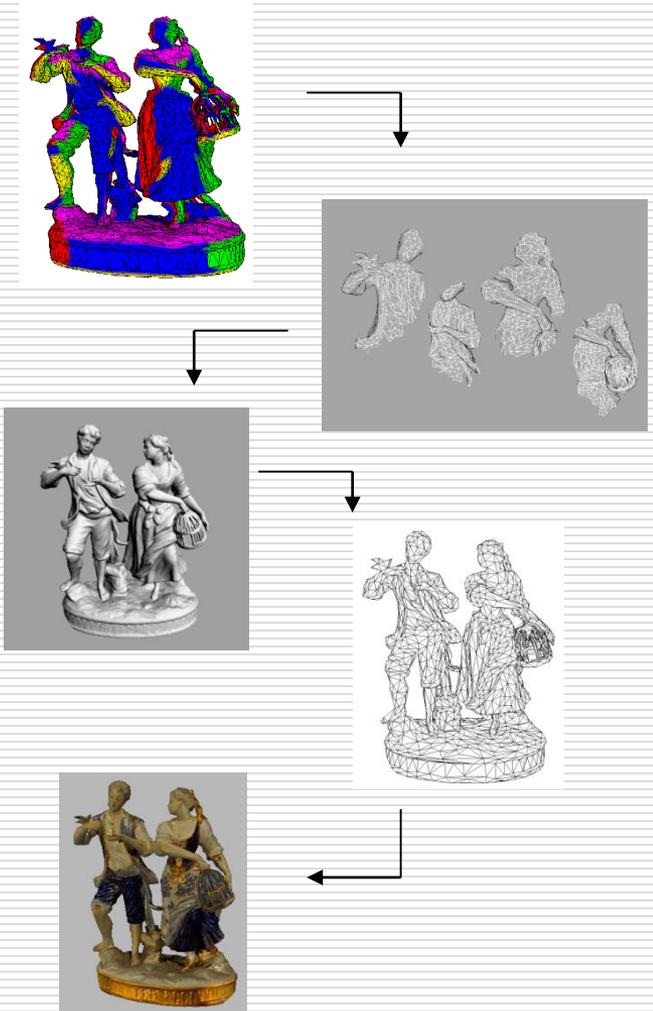
- Acquisition error: the error for the single acquisition. Dependent on object, hardware, acquisition environment.
- Alignment error: the error in alignment of the range maps. Dependent on object, scans quality and number, overlapping.

Both the values are “statistically” known, and:

- the alignment error **cannot** be less than the acquisition error.
  - the alignment error **cannot** be less than half of the acquisition resolution.
-

# 3D Scanning Pipeline

- [ *Acquisition planning* ]
- **Acquisition** of multiple range maps
- Range map **filtering**
- **Registration** of range maps
- **Merging** of range maps
- Mesh **Editing**
- **Capturing/Integration** of **appearance** (color acquisition, registration, mapping on surface, color visualization)
- [ *Archival and data conversion* ]



# Range maps Merging

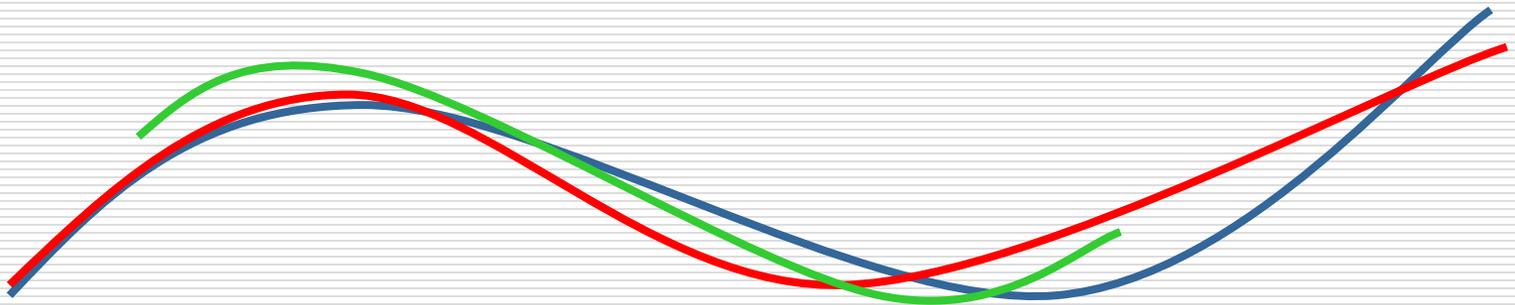
---

When all maps have been generated, cleaned and aligned, it is time to generate a single surface

Why ? to cover the entire surface we need all maps, but more maps covers the same area, with intersecting and overlapped triangles... Moreover, the sum of all map has too many triangles to be used...

Problem:

more maps covers the same area, which one is the correct one?

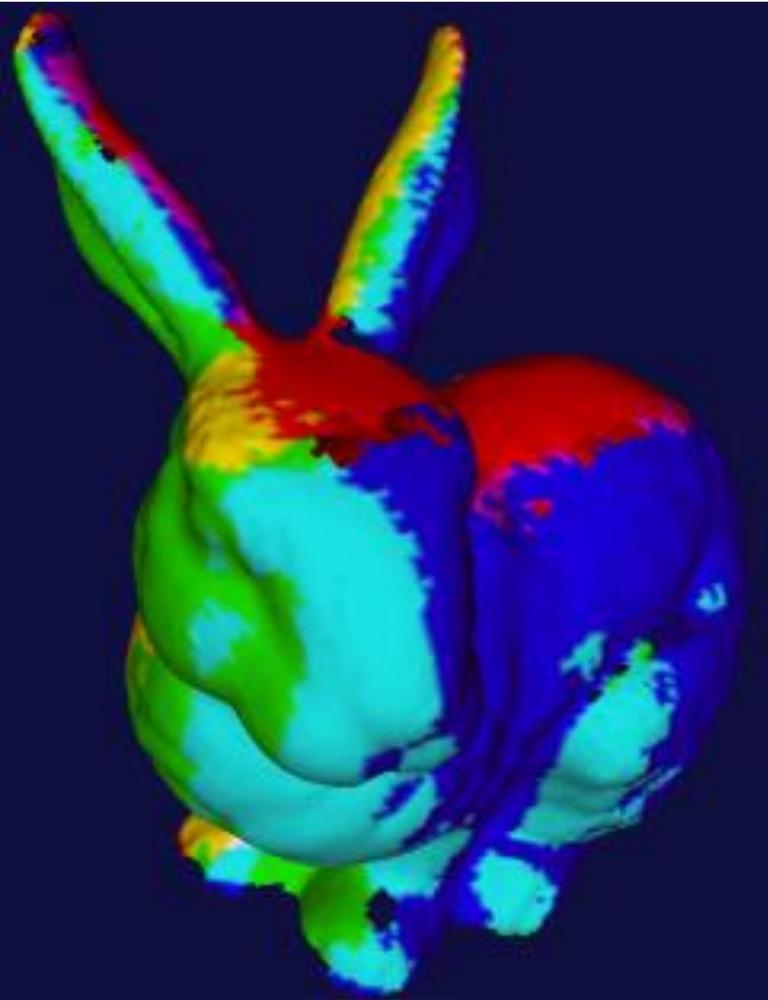


Answer: None

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# Zippering

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Quite an old method, but still used in many tools.

The surface is built using parts of each single scan, simply joined together.

Can be distinguished from triangulation: some areas are covered with a regular triangle grid, joined by strips of triangles (zipper).

It is simple and fast 😊, but does not use the geometric redundancy to eliminate some of the sampling error ☹️

If there are many overlapping scans, this method does not scale at all ☹️

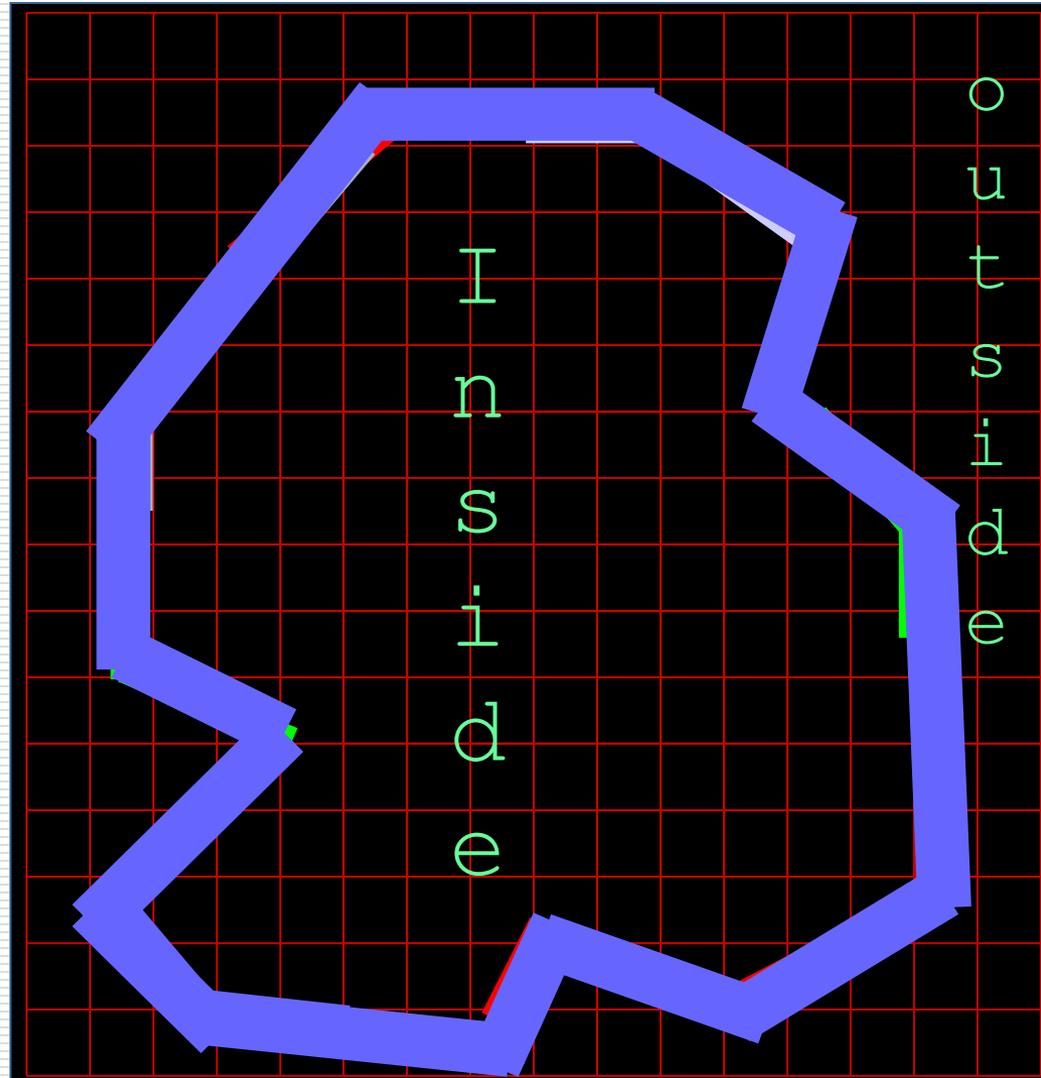
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# Volumetric Methods

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Range maps are immersed in a volumetric grid: the final surface will be built using some criteria that work in each cell that contains some part of the original model.

Inside each non-empty cell the contribution of the various range maps will be combined in order to obtain a consensus surface, extracted then using (generally) a variant of the MARCHING CUBE algorithm



# Marching Cube

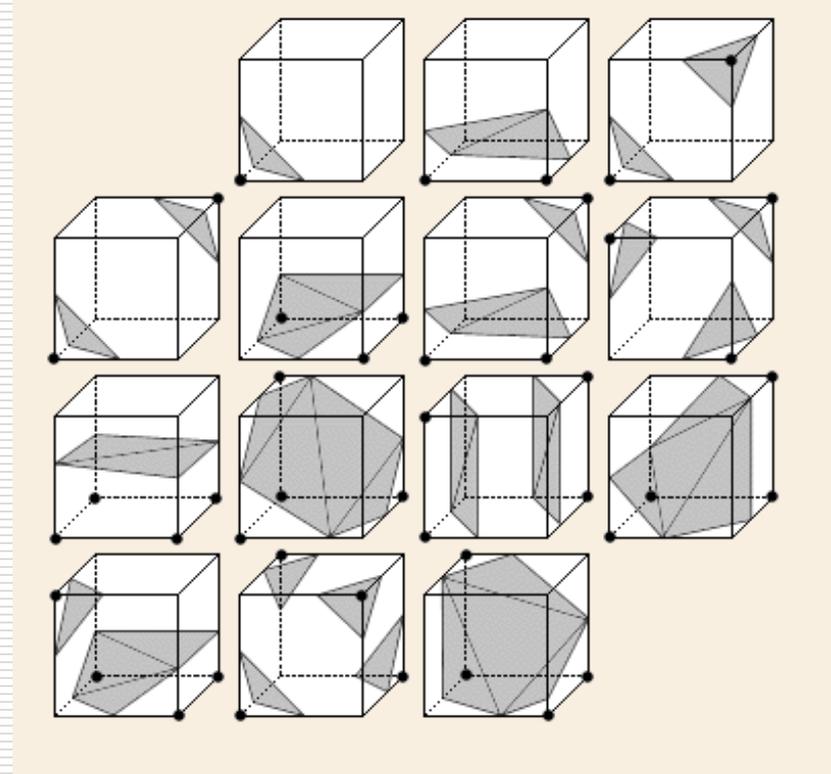
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The majority of merging software use some variant of this algorithm.. It works on a scalar field, defining for each point in space how far is from the surface to be extracted, and if we are outside or inside it

For each cell, the sign (IO/OUT) of its vertices is computed. This configuration determines the triangles that will be in that cell.

Triangle position is then chosen using the field value (isosurface level  $\theta$ )

Marching cube was a PATENTED algorithm... the patent (held by GM) expired a couple years ago.



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**Marching Cubes: A high resolution 3D surface construction algorithm**

William E. Lorensen, Harvey E. Cline (siggraph 87)



# Distance Field

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In order to use the Marching Cube, we need a scalar field in the object volume... It is easy to obtain this in medical data (density field); but what about range maps/3d scans ?

Each surface produces a field: zero on the surface itself, positive growing towards the inside, negative growing towards the outside (just following the normal orientation)

Contribution from the various surfaces are added...

The isosurface  $0$  is extracted by marching cube...

**A Volumetric Method for Building Complex Models from Range Images**

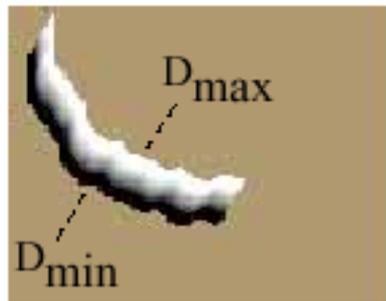
Brian Curless and Marc Levoy

**Filling Holes in Complex Surfaces using Volumetric Diffusion**

James Davis Stephen R. Marschner Matt Garr Marc Levoy

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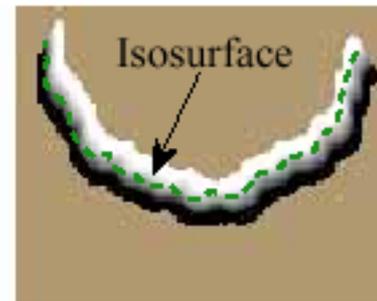
# Distance Field



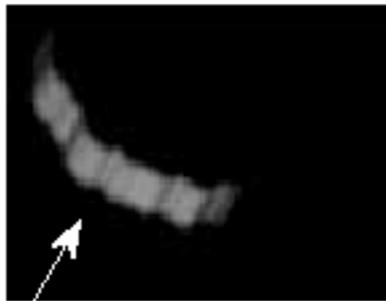
(a)



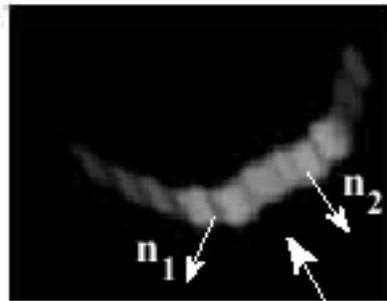
(b)



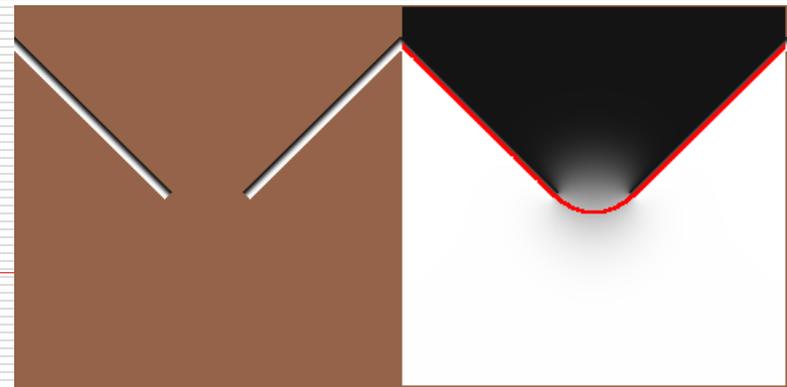
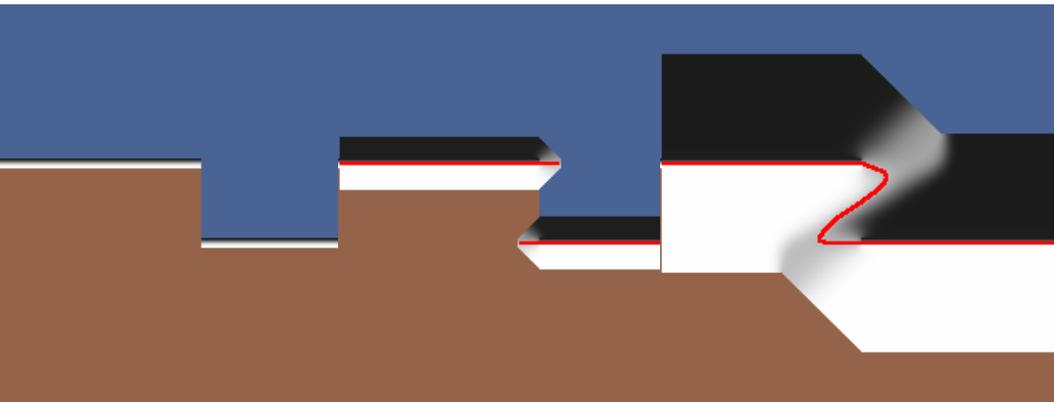
(c)



Sensor



Sensor

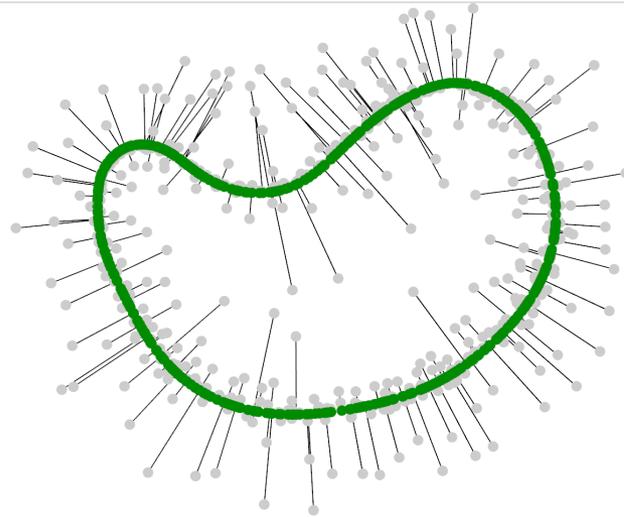


# MLS: Moving Least Squares

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Given a point cloud with normals, a point in space that is close to the object can be “projected” onto the implicit surface defined by a local subset of the cloud points. This projection is iterated (each time updating the reference subset) in order to reach convergence

The final displacement can be interpreted as the scalar field that can be used in the marching cube

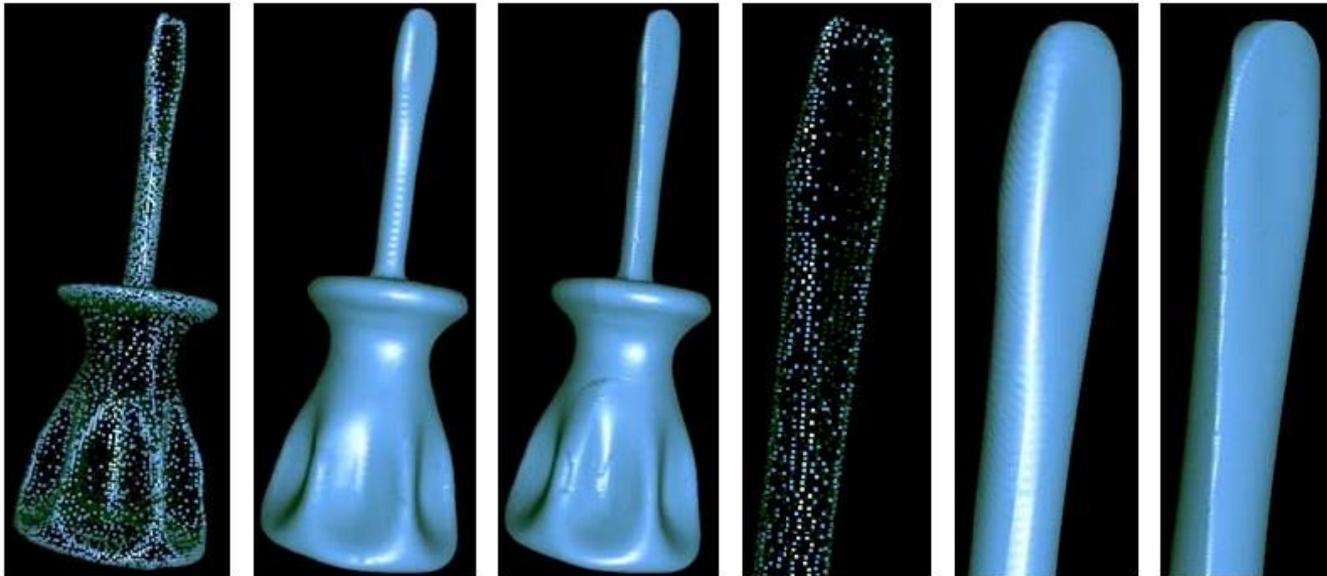


# MLS: Moving Least Squares

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MLS has been introduced for visualization (of point clouds) and to approximate/resample surfaces/pointclouds... can also be used to compute measures on noisy unstructured clouds

Used for the high robustness of the approach: it can be applied to very noisy and unstructured clouds...



# MLS: Moving Least Squares

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Original paper, general application:

## **Defining Point-Set Surfaces**

Nina Amenta, Yong Joo Kil

Another paper, both projection and merging:

## **Volume MLS Ray Casting**

C. Ledergerber, G. Guennebaud, M. Meyer, M. Bacher, H. Pfister

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# Implicit surfaces

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Another possible approach:

- Use the data to build a mathematical surface of approximation
- Triangulate the mathematical surface using some tessellation OR similarly to the volumetric methods (computing triangulation in each cell)

The use of an intermediate mathematical/analytical representation helps creating smoother surfaces and correct problems in the input data (like closing holes)

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# Radial Basis Functions

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Each point in the cloud has been sampled, thus defining a “local certainness” about the surface location in that particular point.

We are sure about that point, but as we go away, our certainness decrease...

Idea: approximate the surface using an implicit function that is the sum of many small BASIS function that express this local certainness.

## Reconstruction and Representation of 3D

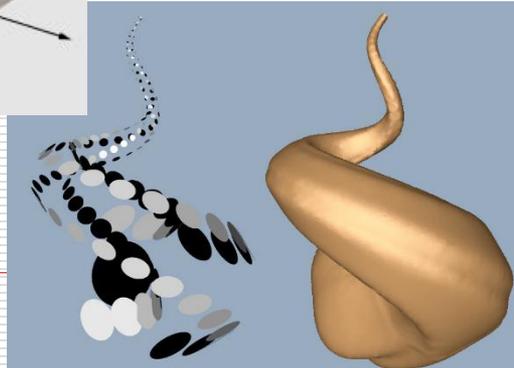
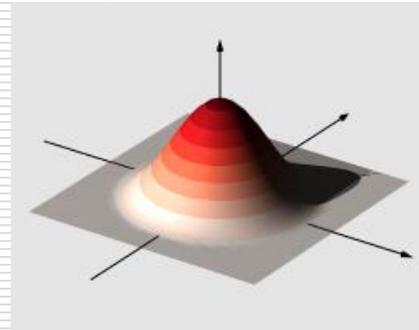
### Objects with Radial Basis Functions

J. C. Carr R. K. Beatson J. B. Cherrie

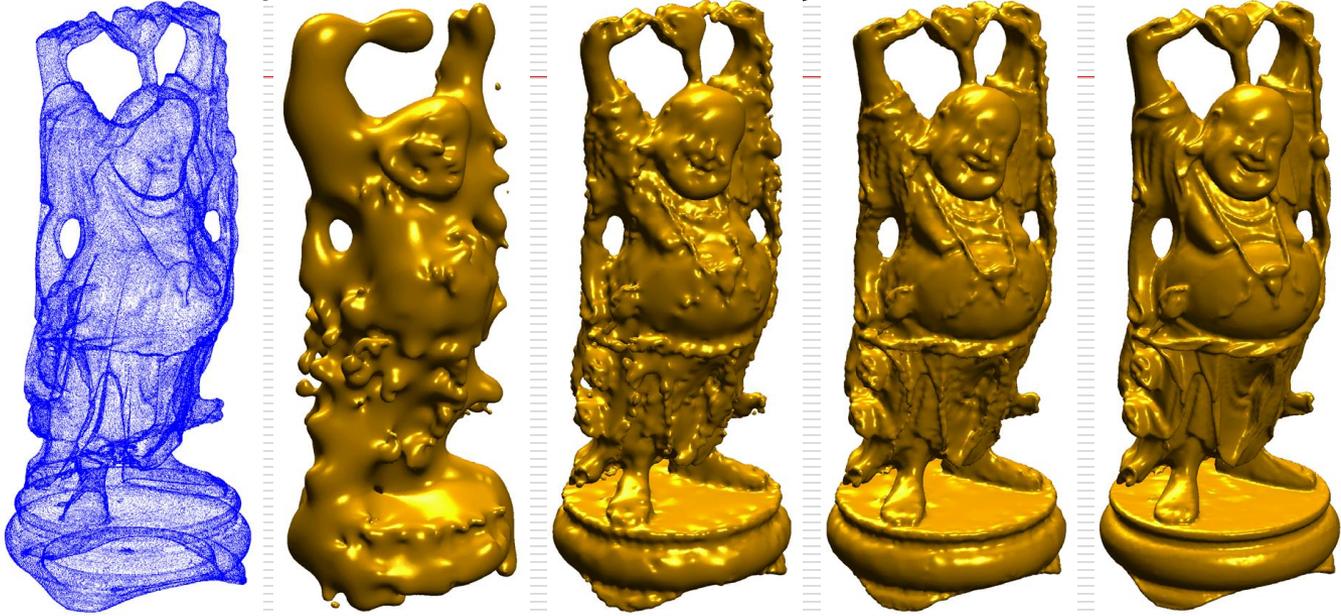
T. J. Mitchell W. R. Fright B. C. McCallum

T. R. Evans

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# Radial Basis Functions



Many kind of basis function used, different shapes/params.

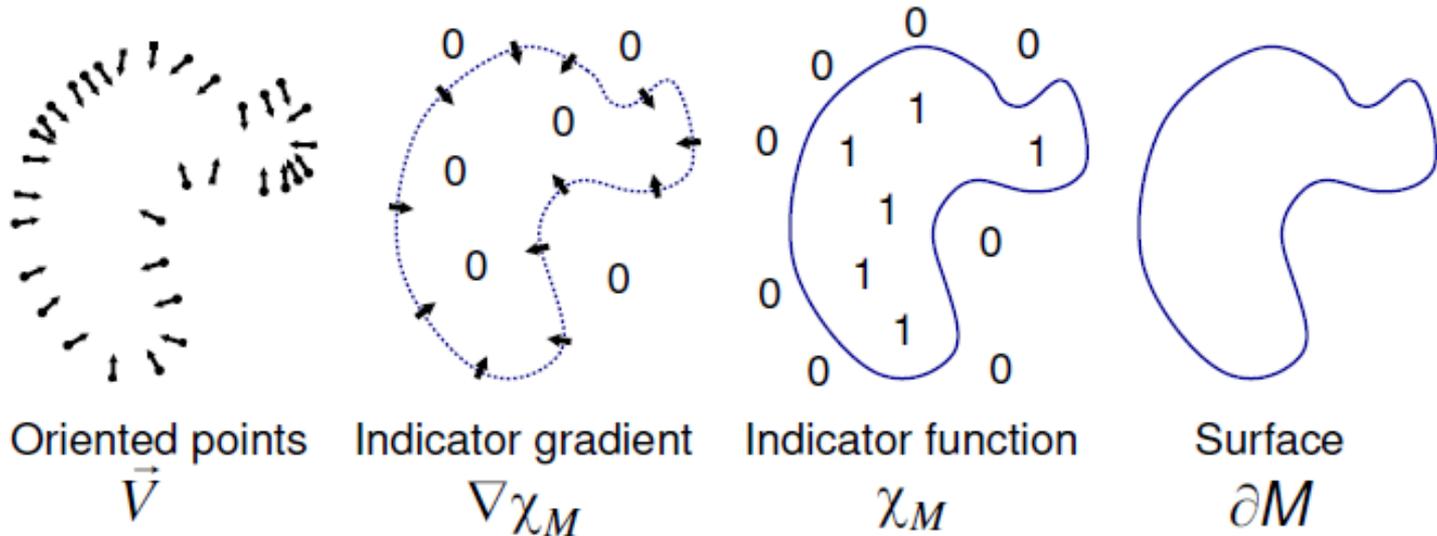
Many strategies to use the least possible number of points in this case, greedy approach...

Again, the defined function is evaluated in the volumetric grid to use the marching cube to extract the surface.

# Poisson reconstruction

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Some recent (2006 - 2013) works implementend the **Poisson** reconstruction. This formulation considers all the points at once, without resorting to heuristic spatial partitioning or blending, and is therefore highly resilient to data noise. -> Closed surface!



# Just an example



# Just an example



# Just an example



# Merging: comments

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All merging methods have pro and cons... you have to find the one suitable for your project.

The software you will use will have one (or more, if you are lucky) merging method. Problem is, in some tools, merging is a complete black box, and you do have to learn its characteristics by trial and error

Beware: some methods are restricted to certain kind of data / dataset size

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# Merging: comments

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The eternal question: what resolution should I use?

- Higher resolution means more time and memory, and a heavier 3D model. RAM, Disk, CPU and GPU have limits...
  - You cannot go beyond the limits of your error (sampling + alignment).
  - It is perfectly useless to go smaller than the sampling rate.
  - It all depends on the use you are planning for your models
  - It may be fine to try getting the highest possible resolution, and then decimate (risky, but fine, also considering technology advance)
  - Sometimes, a pointcloud is just fine.
-