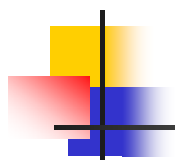




# 3-D Optical Measurement Technology

Prof. Liang-Chia Chen  
Department of Mechanical Engineering  
National Taiwan University

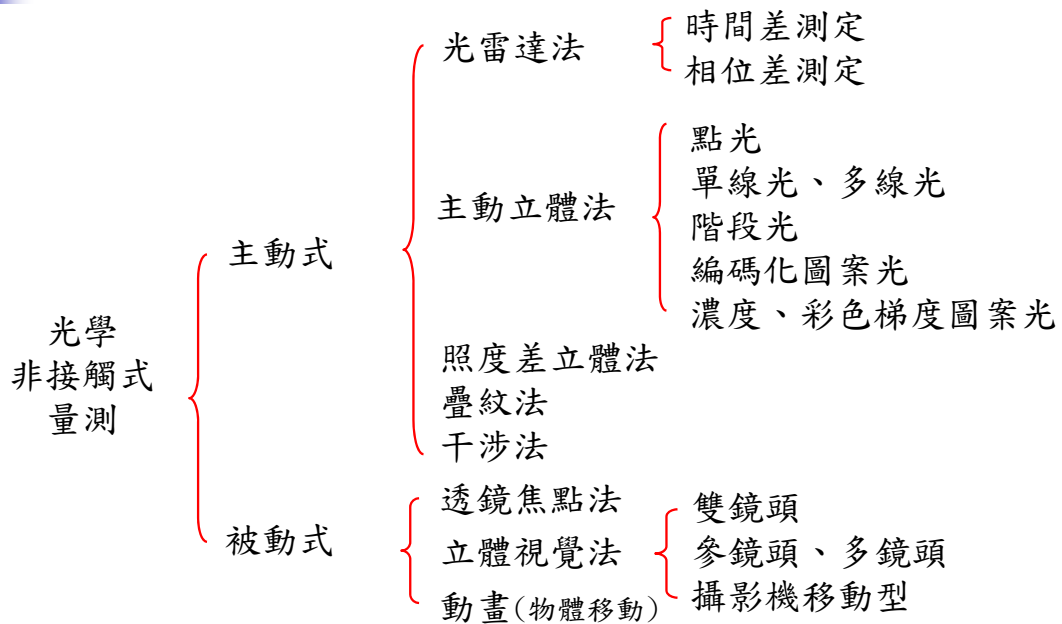
1



## 3D 機器視覺技術

- 三角法
- 飛行時間法
- 疊紋法
- 干涉法
- 光度法
- FFT 相位法
- 其他

# 光學非接觸式三維輪廓量測技術



Source from Prof. M. Chang

## Visual Cues

### Shading

### Texture

### Focus

### Motion

### Others:

- Highlights
- Shadows
- Silhouettes
- Inter-reflections
- Symmetry
- Light Polarization
- ...

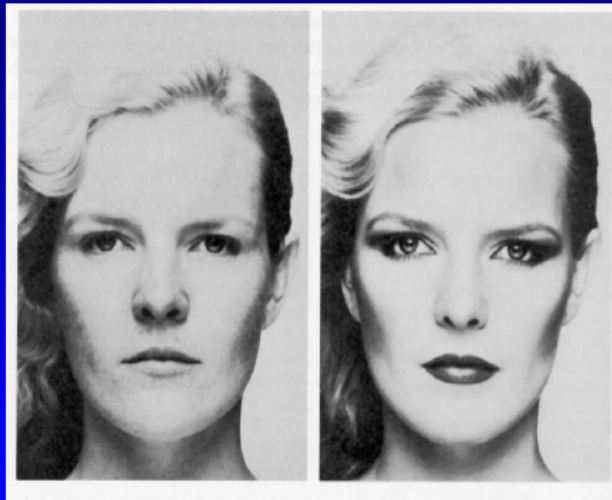
### Shape From X

- X = shading, texture, focus, motion, ...

## Visual Cues

---

### *Shading*



**Merle Norman Cosmetics, Los Angeles**

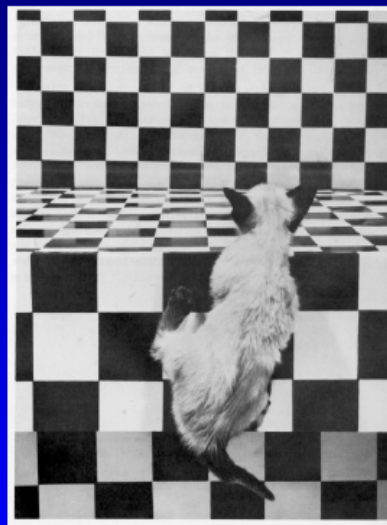
Materials taken from Prof. S. Seitz, Carnegie Mellon University, 2001

## Visual Cues

---

### *Shading*

### *Texture*



***The Visual Cliff*, by William Vandivert, 1960**

## Visual Cues

---

*Shading*

*Texture*

*Focus*



*From The Art of Photography, Canon*

Materials taken from Prof. S. Seitz, Carnegie Mellon University, 2001

## Visual Cues

---

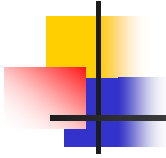
*Shading*

*Texture*

*Focus*

*Motion*



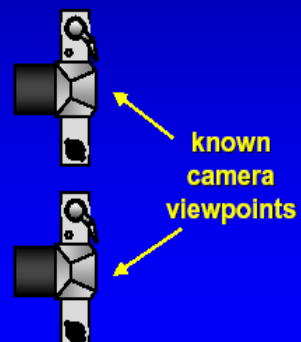


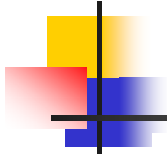
# Stereo Detection

## Stereo Reconstruction

### *The Stereo Problem*

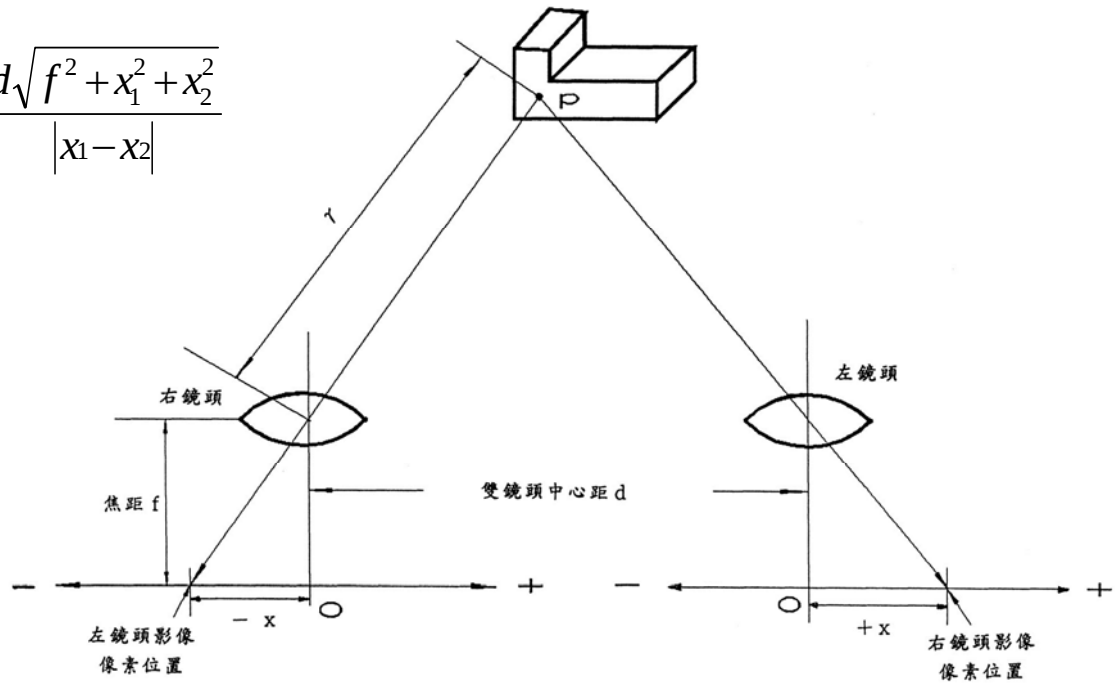
- Shape from two (or more) images
- Biological motivation





## 雙鏡頭法

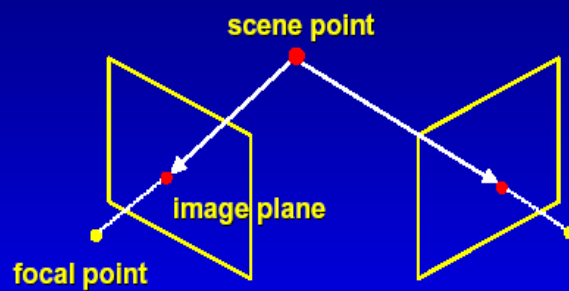
$$r \approx \frac{d \sqrt{f^2 + x_1^2 + x_2^2}}{|x_1 - x_2|}$$



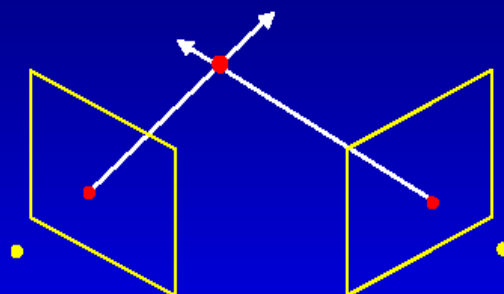
Source from Prof. Chang

AOI  
Lab

## Stereo



## Stereo



### *Basic Principle: Triangulation*

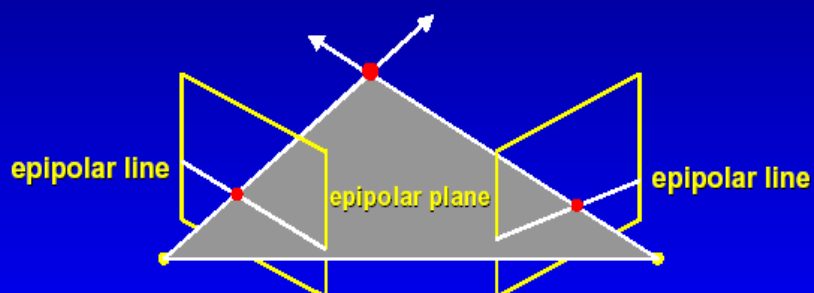
- Gives reconstruction as intersection of two rays
- Requires **point correspondence**

Materials taken from Prof. S. Seitz, Carnegie Mellon University, 2001

## Stereo Correspondence

### *Determine Pixel Correspondence*

- Pairs of points that correspond to same scene point



### *Epipolar Constraint*

- Reduces correspondence problem to 1D search along **conjugate epipolar lines**

Materials taken from Prof. S. Seitz, Carnegie Mellon University, 2001

## Stereo Matching Algorithms

---

### *Match Pixels in Conjugate Epipolar Lines*

- **Assume color of point does not change**
- **Pitfalls**
  - > specularities
  - > low-contrast regions
  - > occlusions
  - > image error
  - > camera calibration error
- **Numerous approaches**
  - > dynamic programming [Baker 81, Ohta 85]
  - > smoothness functionals
  - > more images (trinocular, N-ocular) [Okutomi 93]
  - > graph cuts [Boykov 00]

Materials taken from Prof. S. Seitz, Carnegie Mellon University, 2001

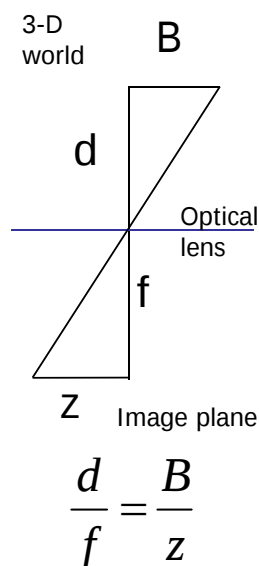
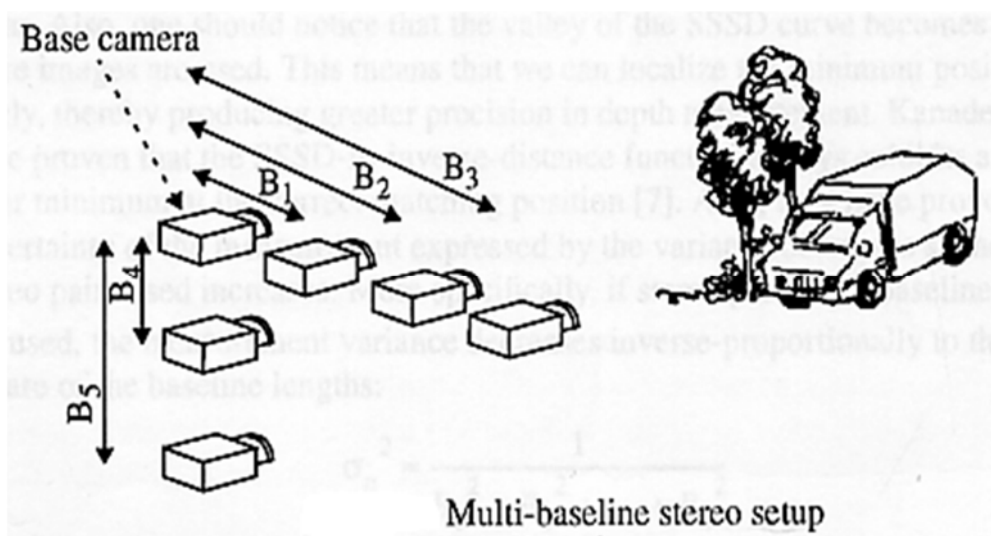


## Multiple image-based SSSD Method

### **SSSD algorithm**

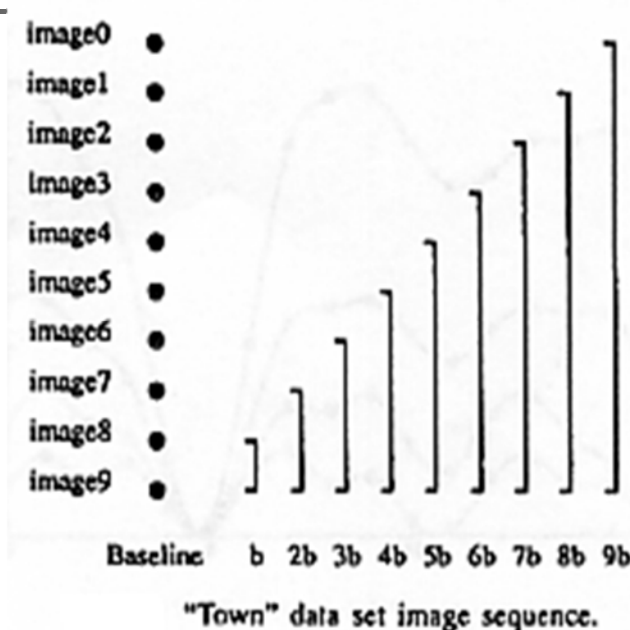
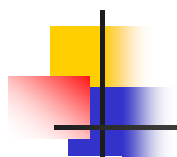
( Sum of Sums of Squared Difference)

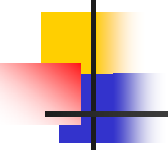
# Multi-baseline stereo



Inverse distance  $\zeta = \frac{d}{BF} = \frac{1}{z}$

## Inverse distance: different base distance

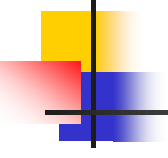




## 圖樣比對(Template Matching)

比對則法做介紹，可以分為五大類：

- 相關係數法(Correlation Measures)
- 亮度差異量測(Intensity Difference Measures)
- 循序相似偵測演算(Sequential Similarity Detection Algorithms)
- 正負號改變準則(Sign Change Criteria)
- 矩量法(Moments)



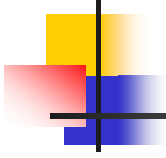
### 相關係數法

在一幅 $W \times H$ 的影像 $I(u, v)$ 中尋找和圖樣 $T(i, j)$ 相匹配的子影像乃利用影像相關的觀念。

$I(u, v)$ 和 $T(i, j)$ 影像之間的相關定義如下：

$$c(u, v) = \sum_{i=0}^M \sum_{j=0}^N I(u + i, v + j) T(i, j)$$

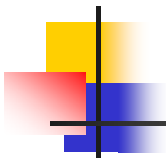
其中  $i=0, 1, 2, \dots, M-1$ ;  $j=0, 1, 2, \dots, N-1$ ，而且運算的範圍總是在 $I$ 和 $T$ 相重疊的影像區域上進行的。



## Normalization

$$r(u, v) = \frac{N \sum_{i=0}^M \sum_{j=0}^N I(i+u, j+v)T(i, j) - \left( \sum_{i=0}^M \sum_{j=0}^N I(i+u, j+v) \right) \left( N\bar{T} \right)}{\sqrt{N \sum_{i=0}^M \sum_{j=0}^N I^2(i+u, j+v) - \left( N\bar{I} \right) \sum_{i=0}^M \sum_{j=0}^N I(i+u, j+v)}} \sqrt{N \sum_{i=0}^M \sum_{j=0}^N T^2(i, j) - \left( N\bar{T} \right) \sum_{i=0}^M \sum_{j=0}^N T(i, j)}$$

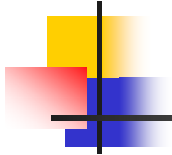
$$r(u, v) = \frac{N \sum_{i=0}^M \sum_{j=0}^N I(i+u, j+v)T(i, j) - \left( \sum_{i=0}^M \sum_{j=0}^N I(i+u, j+v) \right) \left( \sum_{i=0}^M \sum_{j=0}^N T(i, j) \right)}{\sqrt{\left[ \left( N \sum_{i=0}^M \sum_{j=0}^N I^2(i+u, j+v) \right) - \left( \sum_{i=0}^M \sum_{j=0}^N I(i+u, j+v) \right)^2 \right] \left[ \left( N \sum_{i=0}^M \sum_{j=0}^N T^2(i, j) \right) - \left( \sum_{i=0}^M \sum_{j=0}^N T(i, j) \right)^2 \right]}}$$



## 亮度差平方(Sum of Squared Differences or Squared Error)(SSD)：

這個相似性的量測方法等效於均方根距離，而且計算量少，速度較快。其定義如下：

$$d_{ssd}(f, g) = \sum_{x=1}^M \sum_{y=1}^N (f(x, y) - g(x, y))^2$$

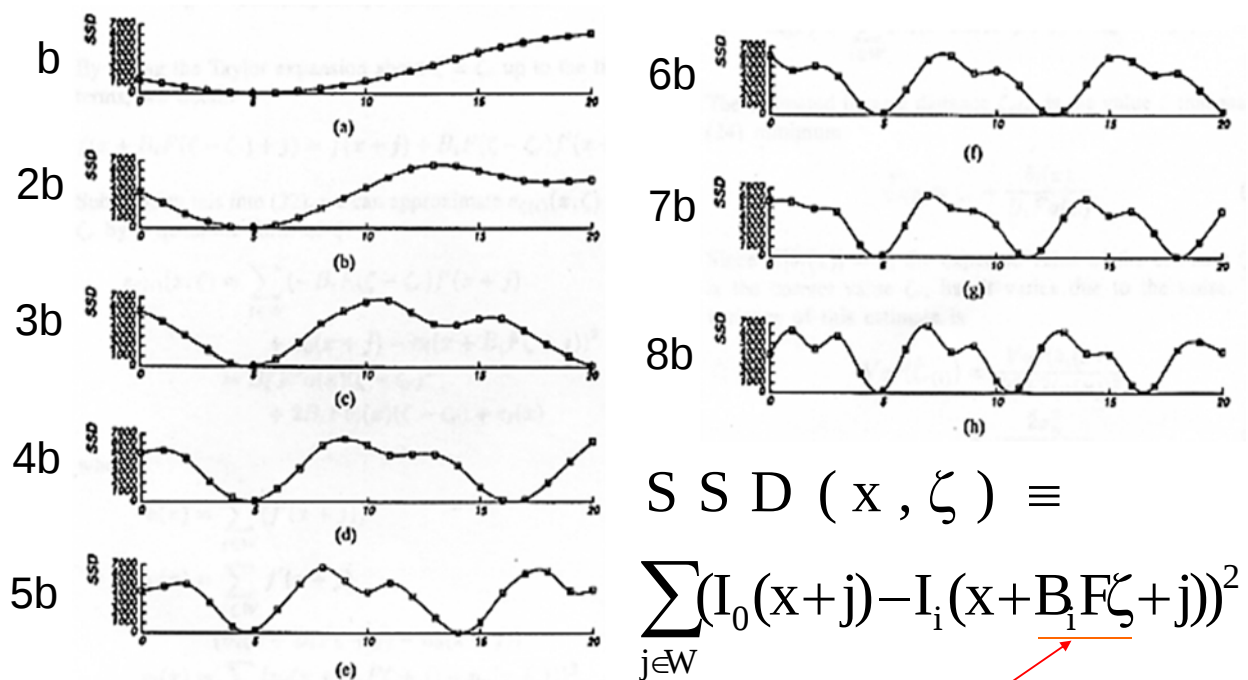


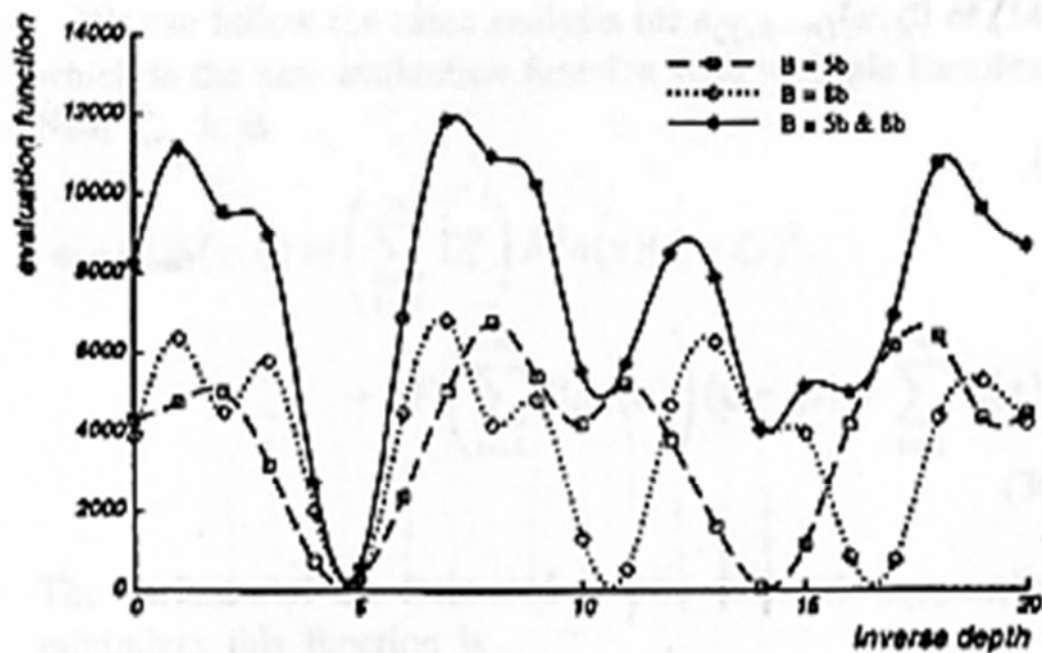
## 差異絕對值總和(Sum of the Absolute Valued Differences)(SAVD)：

為最簡單且常用的方法，其定義如下：

$$d_{savd}(f, g) = \sum_{x=1}^M \sum_{y=1}^N |f(x, y) - g(x, y)|$$

## Inverse distance: Different base distance

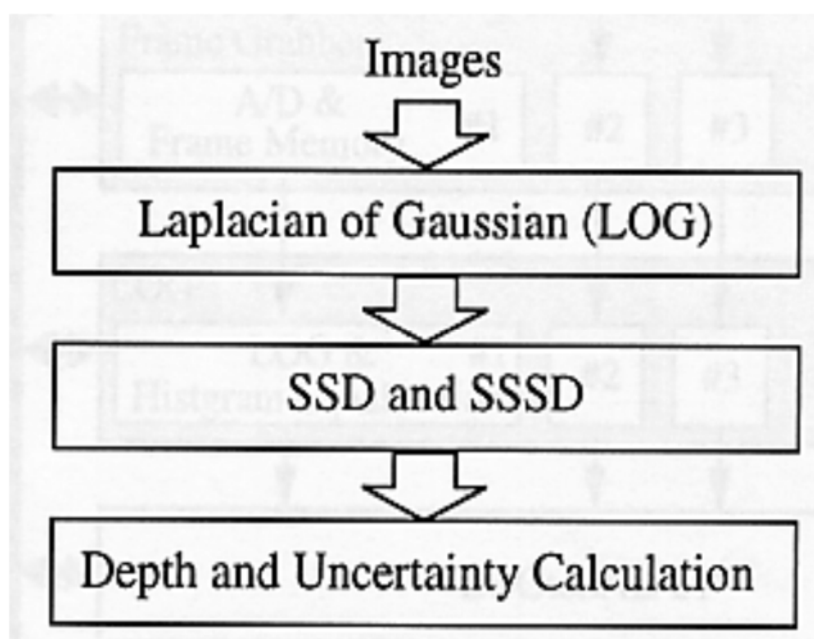




Combining two stereo pairs with different baselines.

Materials taken from Prof. T. Kanade, Carnegie Mellon University, 1995

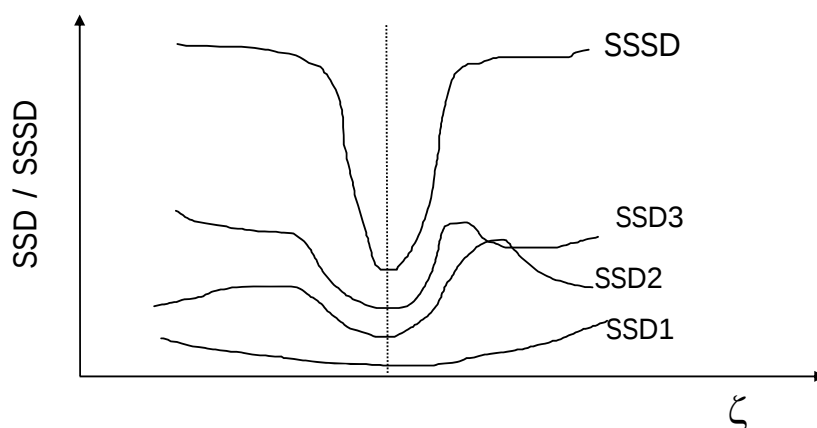
## Outline of Multi baseline stereo detection



Materials taken from Prof. T. Kanade, Carnegie Mellon University, 1995

$$SSD(x, \zeta) \equiv$$

$$\sum_{j \in W} (I_0(x + j) - I_i(x + B_i F \zeta + j))^2$$



( the inverse distance)

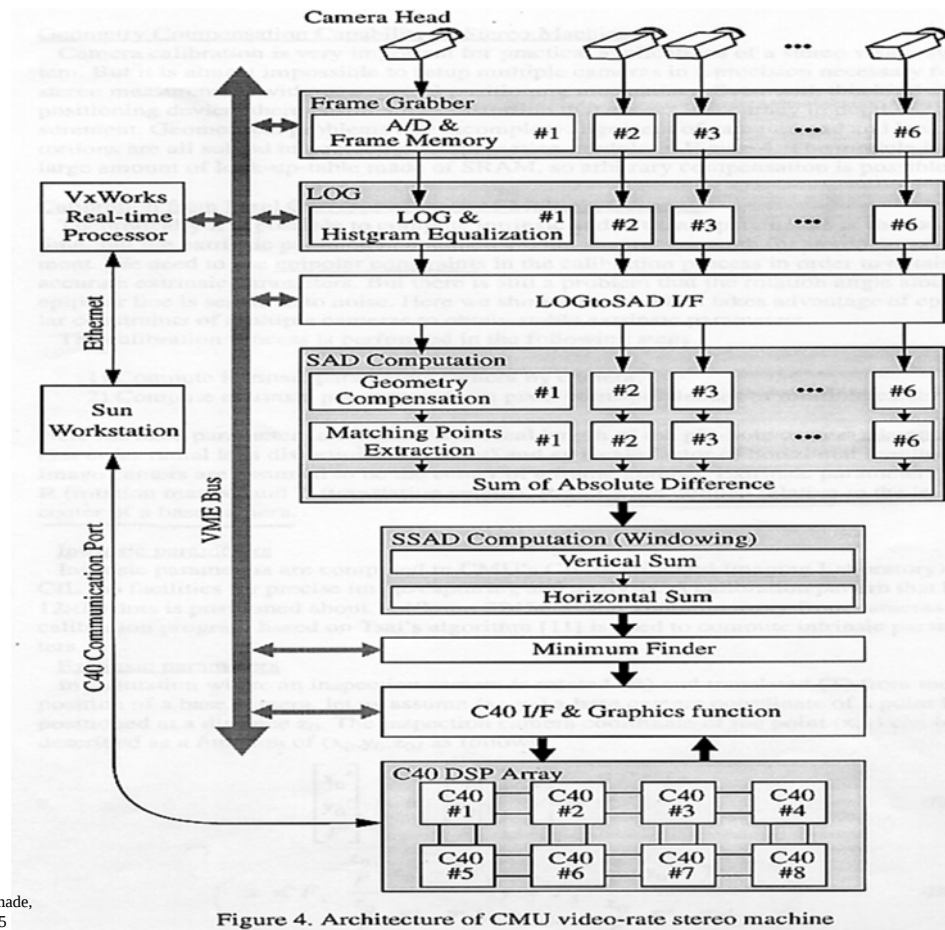
Materials taken from Prof. T. Kanade, Carnegie Mellon University, 1995

## Measurement Variance

$$\sigma_n^2 \approx \frac{1}{B_1^2 + B_2^2 + \dots + B_n^2}$$

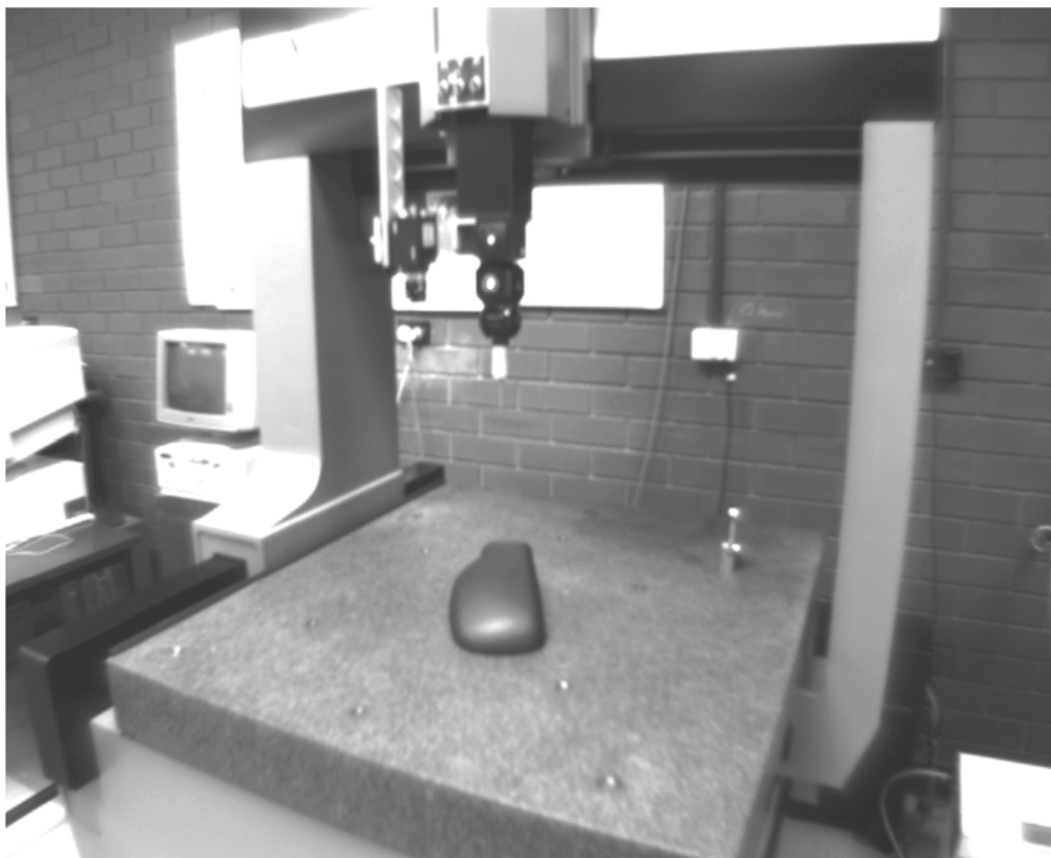
the measurement variance decreases inverse-proportionally to the sum of the square of the baseline lengths:

Materials taken from Prof. T. Kanade, Carnegie Mellon University, 1995



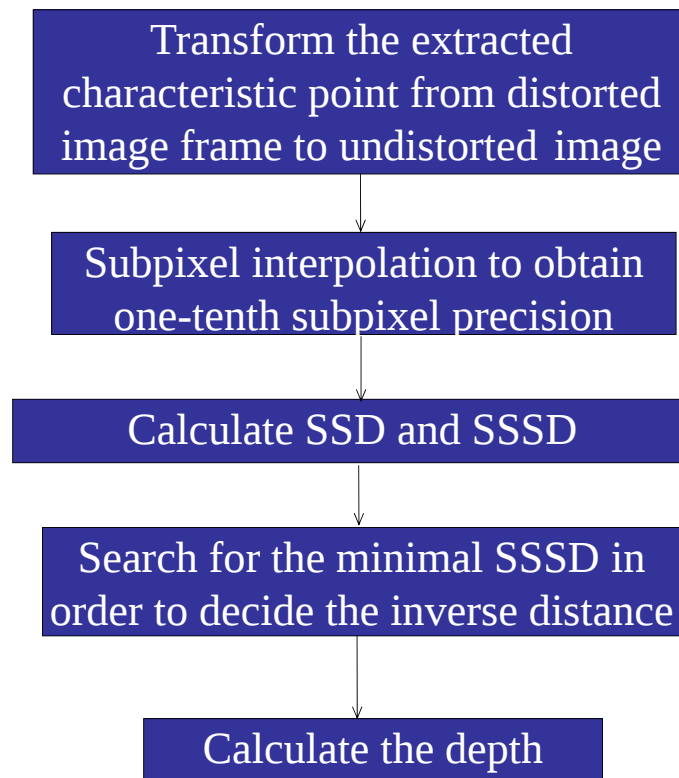
Materials taken from Prof. T. Kanade,  
Carnegie Mellon University, 1995

Figure 4. Architecture of CMU video-rate stereo machine



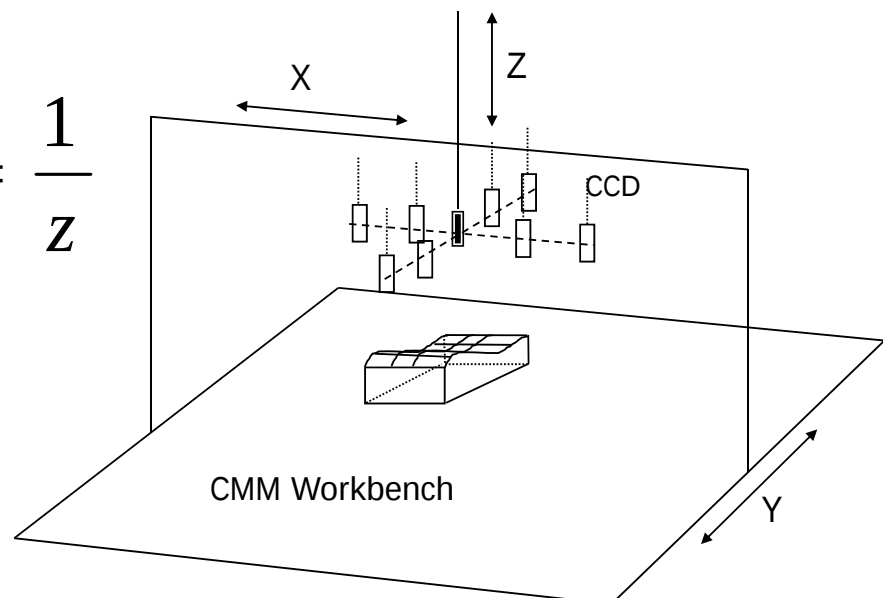
AOI  
Lab

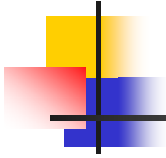
## Flow chart of the stereo detection method



## Calculation of Inverse distance

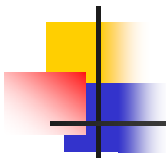
$$\zeta = \frac{d}{BF} = \frac{1}{z}$$



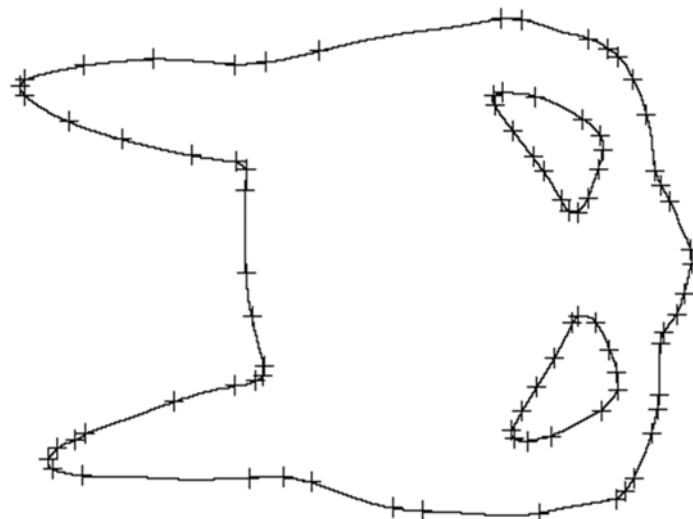


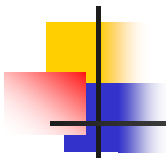
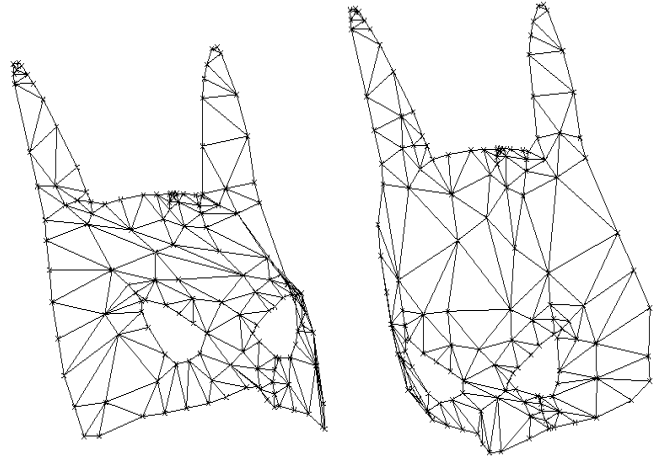
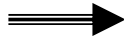
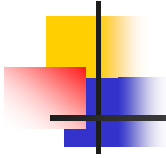
## Experimental result from the stereo image detection method

| Sample No. | Real Depth<br>(mm) | Measured<br>Depth (mm) | Error (%) |
|------------|--------------------|------------------------|-----------|
| 1          | 370.0              | 379.0                  | 2.4       |
| 2          | 370.0              | 367.0                  | -0.8      |
| 3          | 370.0              | 355.0                  | -4.0      |
| 4          | 420.0              | 412.3                  | 1.7       |
| 5          | 420.0              | 427.5                  | 1.8       |
| 6          | 420.0              | 422.4                  | 0.5       |
| 7          | 320.0              | 318.8                  | -0.4      |
| 8          | 320.0              | 329.5                  | 2.9       |
| 9          | 320.0              | 315.5                  | -1.4      |



## Extraction of the boundary characteristic points

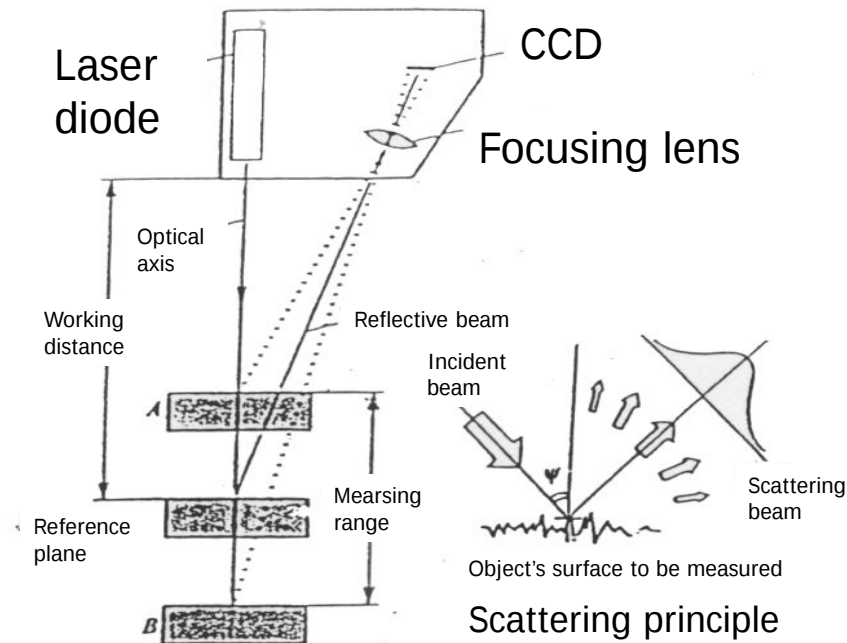




## Active 3-D Vision Methods

1. Laser triangulation principle
2. Mapping method
3. Binary encoding method

# Laser triangulation principle



**Laser Probe using scattering principle**

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# Light reflection model

The reflected color of the measured surface can be roughly described by considering the coefficients of ambient and diffuse reflection as having red, green and blue components:

$$I_R = \int_{\lambda_{R1}}^{\lambda_{R2}} I_{a\lambda} k_a(\lambda) d\lambda + \int_{\lambda_{R1}}^{\lambda_{R2}} \frac{I_{i\lambda} (k_d(\lambda)(\hat{L} \cdot \hat{N}) + k_s(\lambda)(\hat{R} \cdot \hat{V})^n)}{(r + k)} d\lambda$$

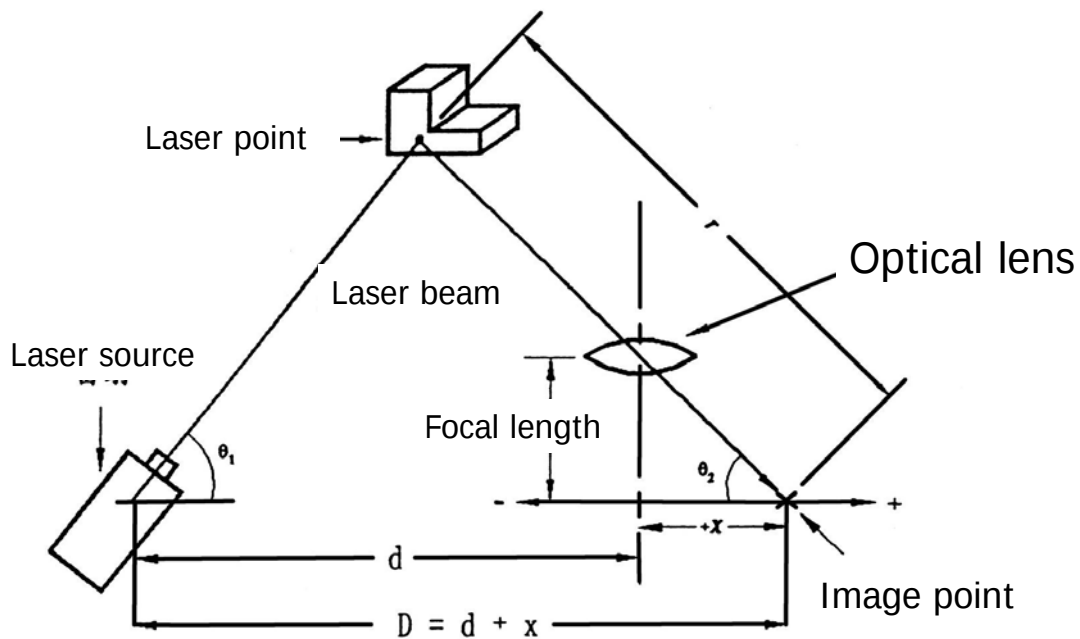
$$I_G = \int_{\lambda_{G1}}^{\lambda_{G2}} I_{a\lambda} k_a(\lambda) d\lambda + \int_{\lambda_{G1}}^{\lambda_{G2}} \frac{I_{i\lambda} (k_d(\lambda)(\hat{L} \cdot \hat{N}) + k_s(\lambda)(\hat{R} \cdot \hat{V})^n)}{(r + k)} d\lambda$$

$$I_B = \int_{\lambda_{B1}}^{\lambda_{B2}} I_{a\lambda} k_a(\lambda) d\lambda + \int_{\lambda_{B1}}^{\lambda_{B2}} \frac{I_{i\lambda} (k_d(\lambda)(\hat{L} \cdot \hat{N}) + k_s(\lambda)(\hat{R} \cdot \hat{V})^n)}{(r + k)} d\lambda$$

Key factors:

1. view direction of CCD.
2. incident direction of light.
3. coefficient of specular reflection.
4. coefficient of diffuse reflection.
5. surface properties

## Laser triangulation principle

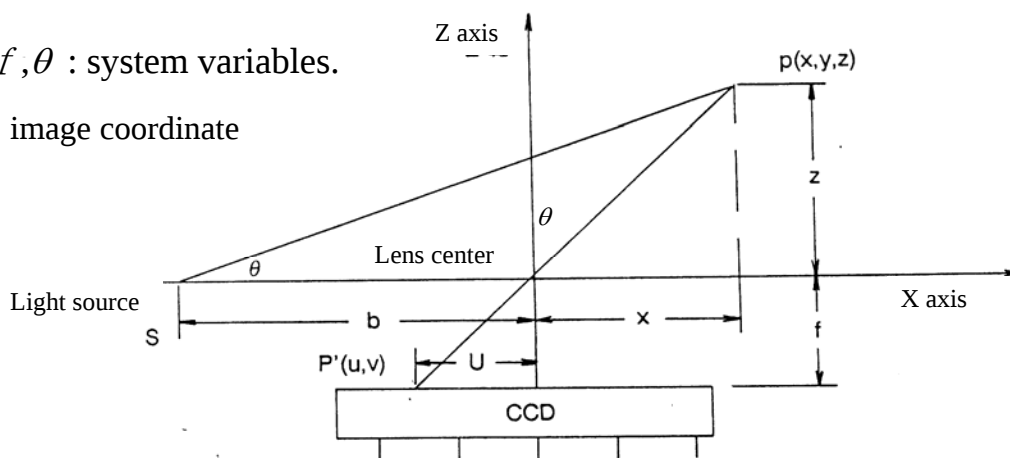


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## Linear model of laser triangulation

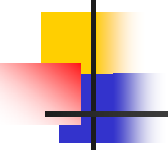
$b, f, \theta$  : system variables.

$u, v$  : image coordinate



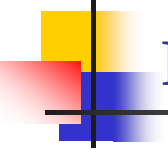
$$(x, z) \text{ Plane: } \frac{f}{u} = \frac{z}{x} \rightarrow \frac{b+x}{z} = \cot \theta \rightarrow x = \frac{bu}{f \cot \theta - u}$$

$$(y, z) \text{ Plane: } \frac{f}{v} = \frac{z}{y} \rightarrow \frac{x}{y} = \frac{u}{v} \rightarrow y = \frac{bv}{f \cot \theta - u} \quad z = \frac{bf}{f \cot \theta - u}$$

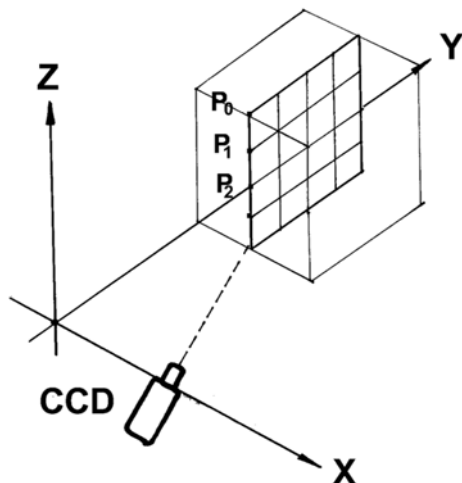


# Mapping methods used in 3D Vision

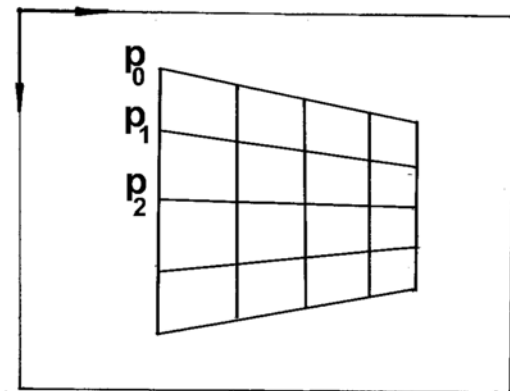
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## Perspective projection from 3D to 2D



Structured pattern in 3D space



CCD Image

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Source from Prof. Chang

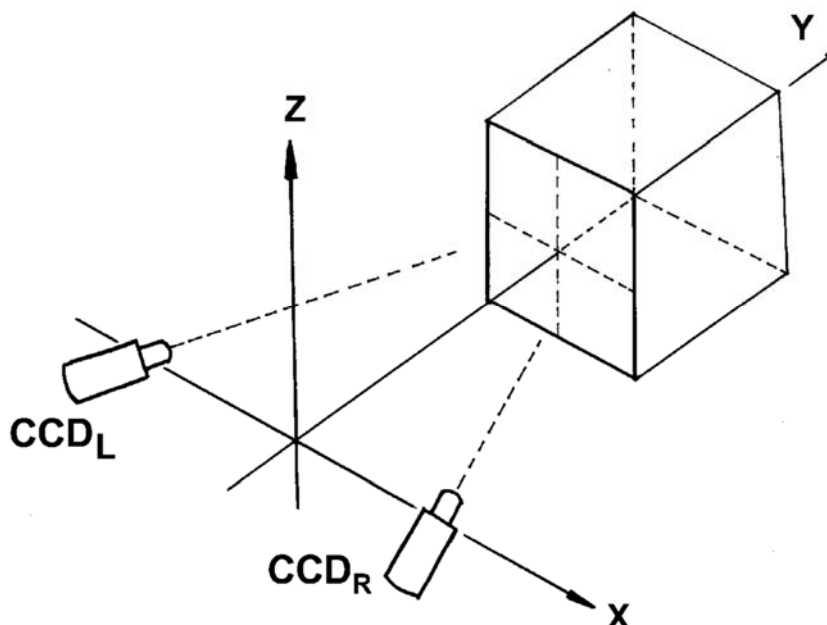
## Mapping function for (Y,Z) in 3D to 2D

- Mapping function using multi-element polynomial function
  - 3D space: (X,Y,Z)
  - CCD coordinate: (u,v)

$$Y = g(u_k, v_k) = \sum_{j=0}^n \sum_{i=0}^{n-j} b_{ij} u^i v^j$$
$$Z = h(u_k, v_k) = \sum_{j=0}^n \sum_{i=0}^{n-j} c_{ij} u^i v^j$$

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## Two-CCD optical configuration

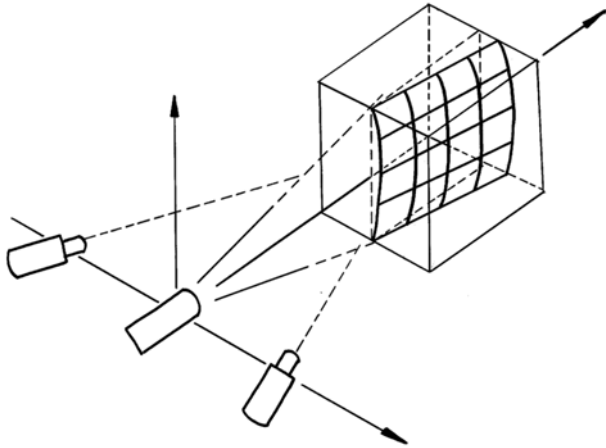


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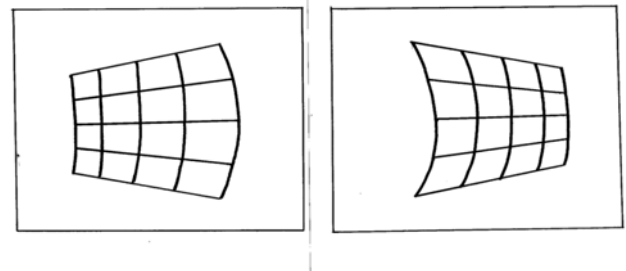
Source from Prof. Chang

## Single laser-line projection with 2 CCDs

### ■ Laser Line Projection



### ■ CCD images in left and right camera



Source from Prof. Chang 45

Source from Prof. Chang

## 3D mapping from two images

### ■ 3-D mapping from two image coordinates:

- 3D coordinate:  $(X, Y, Z)$
- Left CCD image:  $(u_L, v_L)$
- Right CCD image:  $(u_R, v_R)$

$$X_L = f_L(u_L, v_L, u_R) = \sum_{l=0}^n \sum_{k=0}^{n-k} \sum_{j=0}^{n-k-j} a_{ijk} u_L^i v_L^j u_R^k$$

$$Y_L = g_L(u_L, v_L, u_R) = \sum_{l=0}^n \sum_{k=0}^{n-k} \sum_{j=0}^{n-k-j} b_{ijk} u_L^i v_L^j u_R^k$$

$$Z_L = h_L(u_L, v_L, u_R) = \sum_{l=0}^n \sum_{k=0}^{n-k} \sum_{j=0}^{n-k-j} c_{ijk} u_L^i v_L^j u_R^k$$

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## Resolving the unknown coefficients using least-squares approximation

$$x_i = a_1 u_i^2 + b_1 v_i^2 + c_1 u_i v_i + d_1 u_i + e_1 v_i + f_1$$

$$E_i^x = a_1 u_i^2 + b_1 v_i^2 + c_1 u_i v_i + d_1 u_i + e_1 v_i + f_1 - x_i$$

$$E^x = \sum_i (E_i^x)^2$$

$$\frac{\partial E^x}{\partial a_1} = 0 \quad \frac{\partial E^x}{\partial b_1} = 0 \quad \frac{\partial E^x}{\partial c_1} = 0 \quad \frac{\partial E^x}{\partial d_1} = 0 \quad \frac{\partial E^x}{\partial e_1} = 0 \quad \frac{\partial E^x}{\partial f_1} = 0$$

$$z_i = a_2 u_i^2 + b_2 v_i^2 + c_2 u_i v_i + d_2 u_i + e_2 v_i + f_2$$

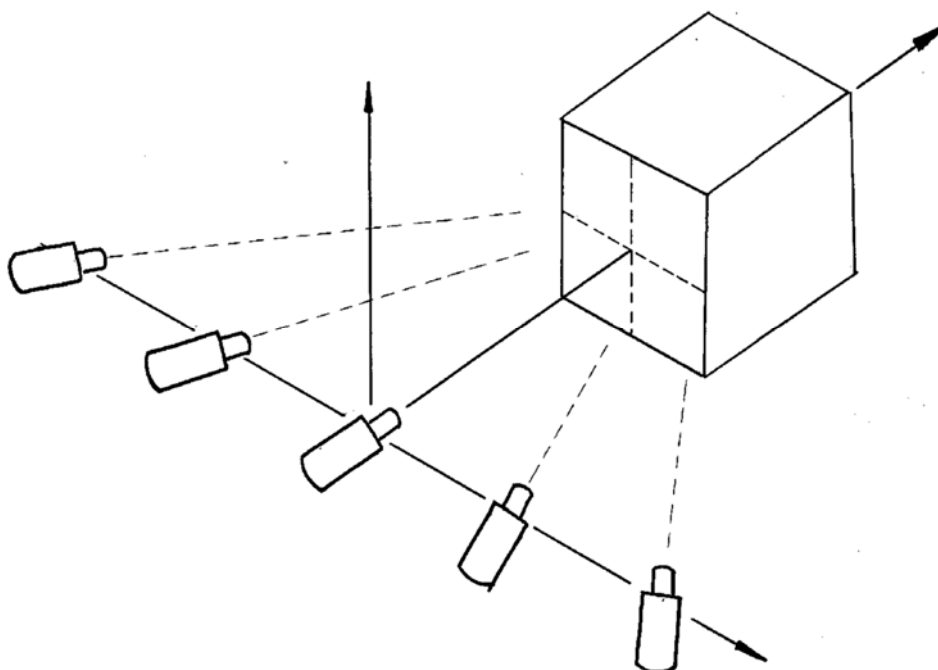
$$E_i^z = a_2 u_i^2 + b_2 v_i^2 + c_2 u_i v_i + d_2 u_i + e_2 v_i + f_2 - z_i$$

$$E^z = \sum_i (E_i^z)^2$$

$$\frac{\partial E^z}{\partial a_2} = 0 \quad \frac{\partial E^z}{\partial b_2} = 0 \quad \frac{\partial E^z}{\partial c_2} = 0 \quad \frac{\partial E^z}{\partial d_2} = 0 \quad \frac{\partial E^z}{\partial e_2} = 0 \quad \frac{\partial E^z}{\partial f_2} = 0$$

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## Multiple CCDs for 3-D detection



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# Mapping model for multiple CCDs

- 3-D mapping from two image coordinates:
  - 3D coordinate: (X, Y, Z)
  - CCD M:  $(u_M, v_M)$
  - CCD N:  $(u_N, v_N)$

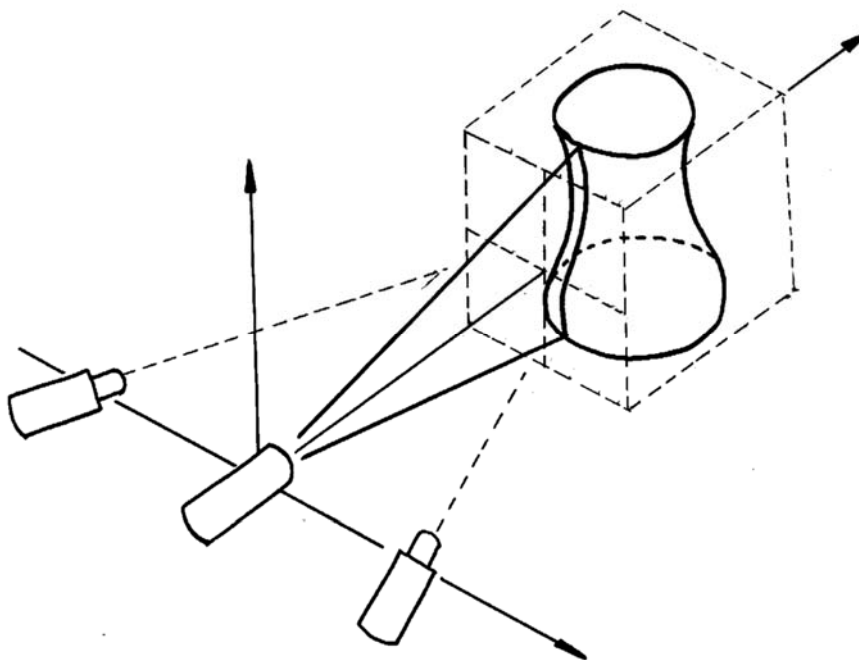
$$X_{MN} = f_M(u_M, v_M, u_N) = \sum_{l=0}^n \sum_{k=0}^{n-k} \sum_{j=0}^{n-k-j} a_{ijk} u_M^i v_M^j u_N^k$$

$$Y_{MN} = g_M(u_M, v_M, u_N) = \sum_{l=0}^n \sum_{k=0}^{n-k} \sum_{j=0}^{n-k-j} b_{ijk} u_M^i v_M^j u_N^k$$

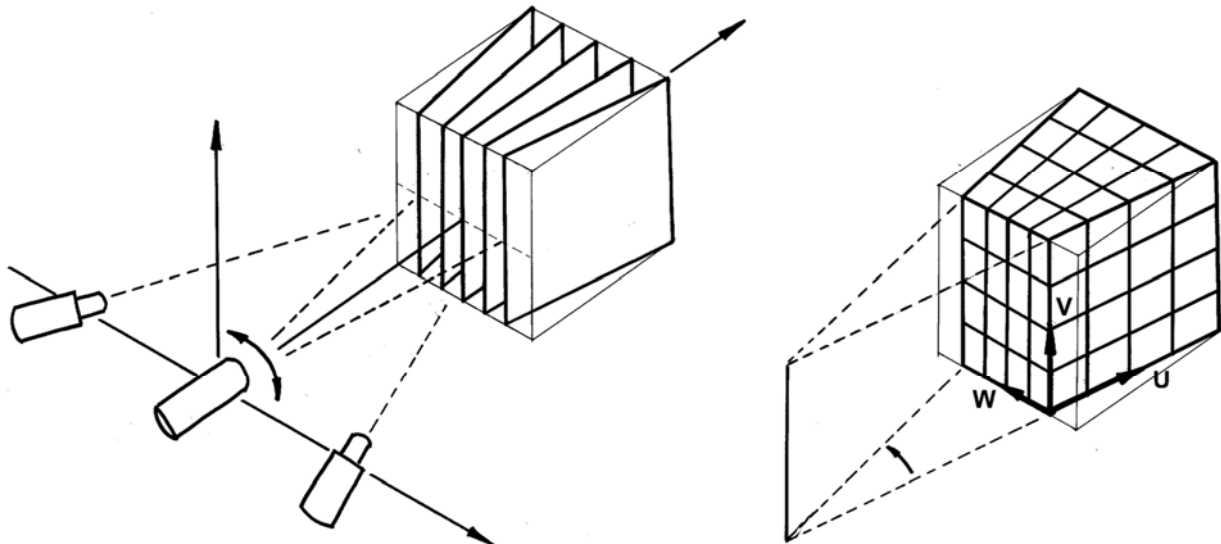
$$Z_{MN} = h_M(u_M, v_M, u_N) = \sum_{l=0}^n \sum_{k=0}^{n-k} \sum_{j=0}^{n-k-j} c_{ijk} u_M^i v_M^j u_N^k$$

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## Laser line scanning for 3D profiles



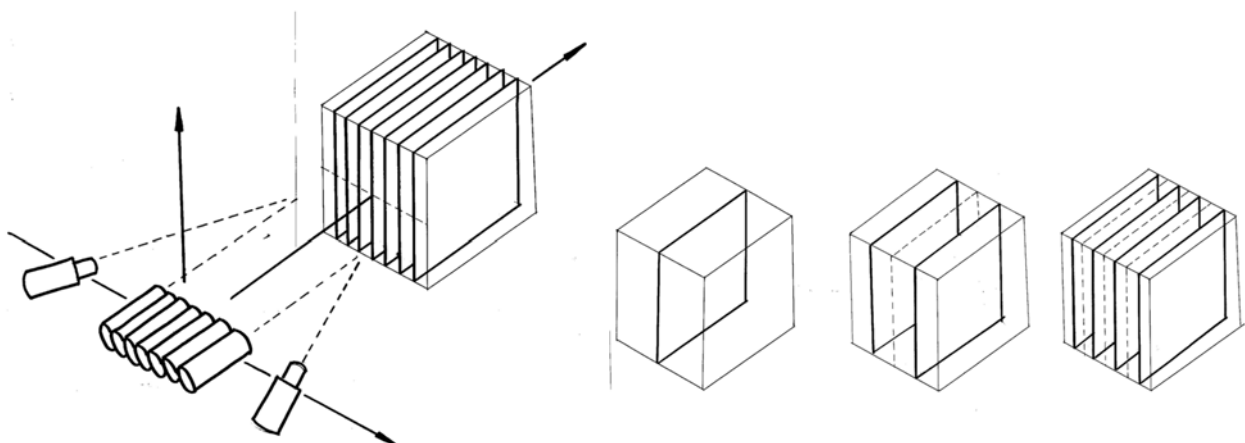
# Line laser scanning method



51

Source from Prof. Ming Chang

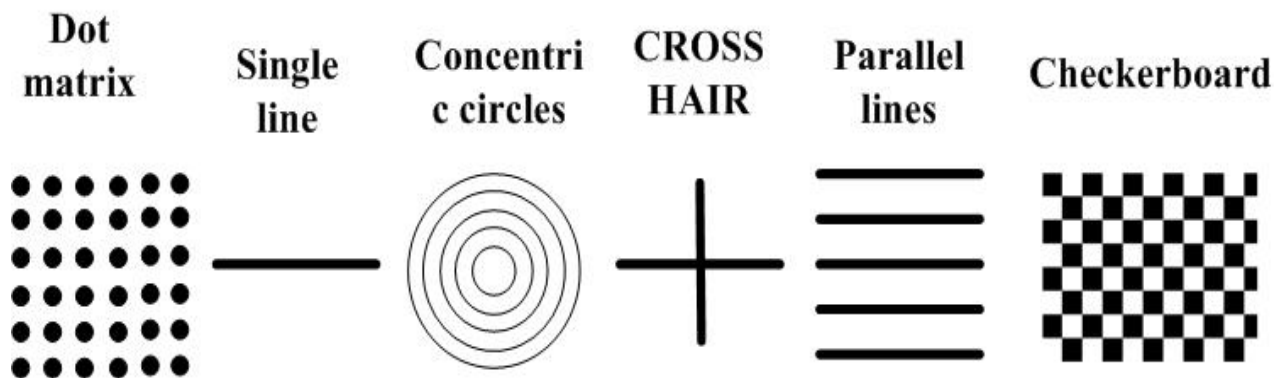
# Multiple laser with 2-CCD configuration



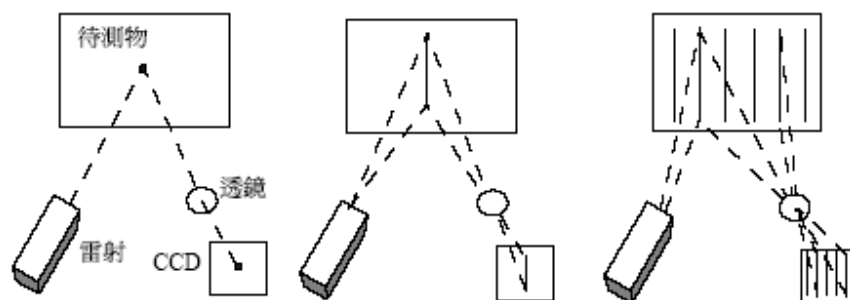
52



## Various design patterns of structured light

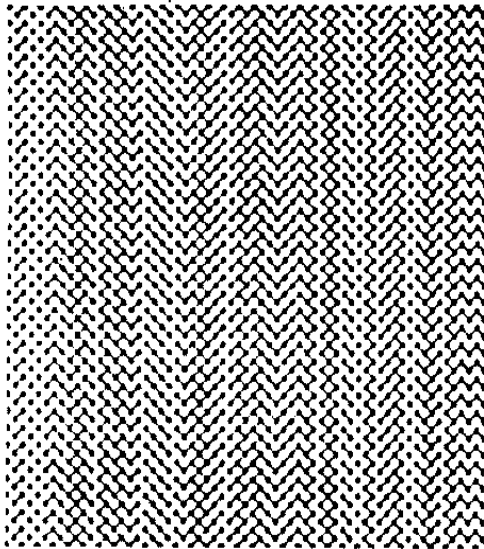


## Optical layout of 3D vision system





## Example of structured light projection on measured objects

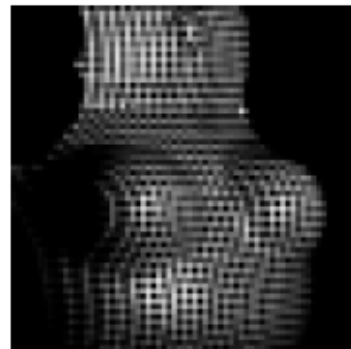
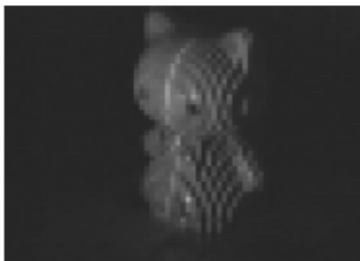
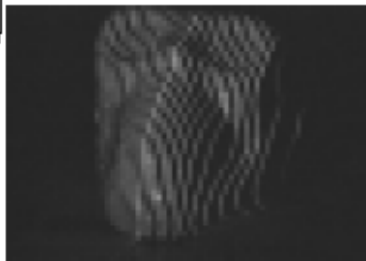


(a)

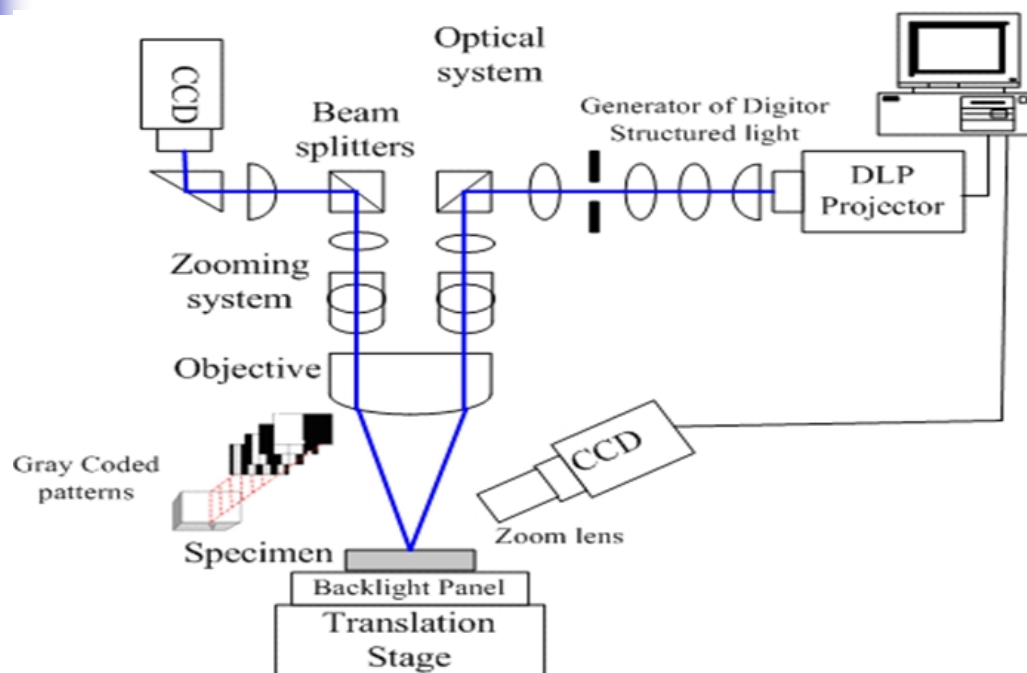


(b)

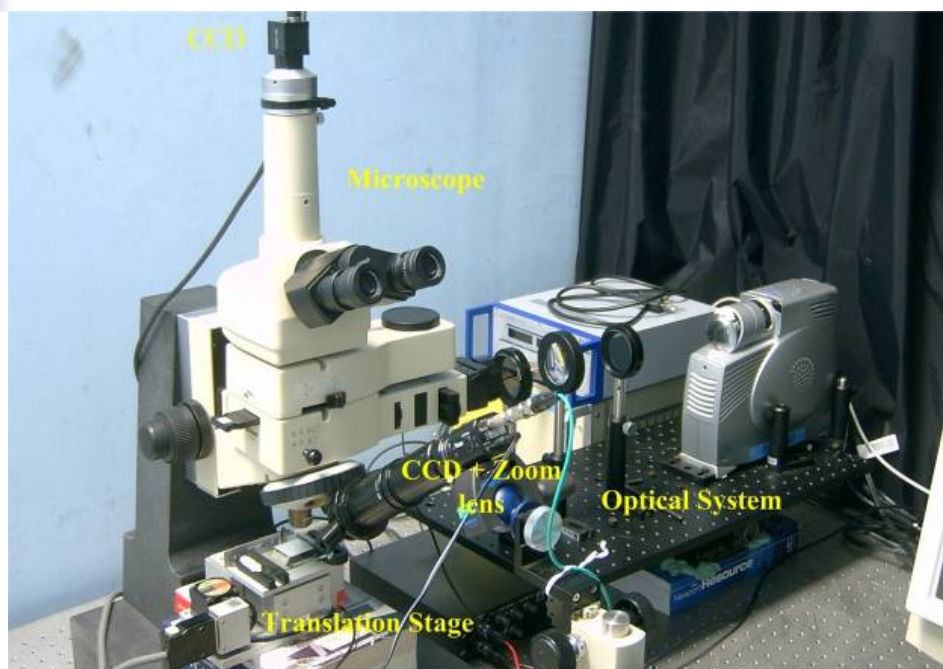
## Example of structured light projection on measured objects



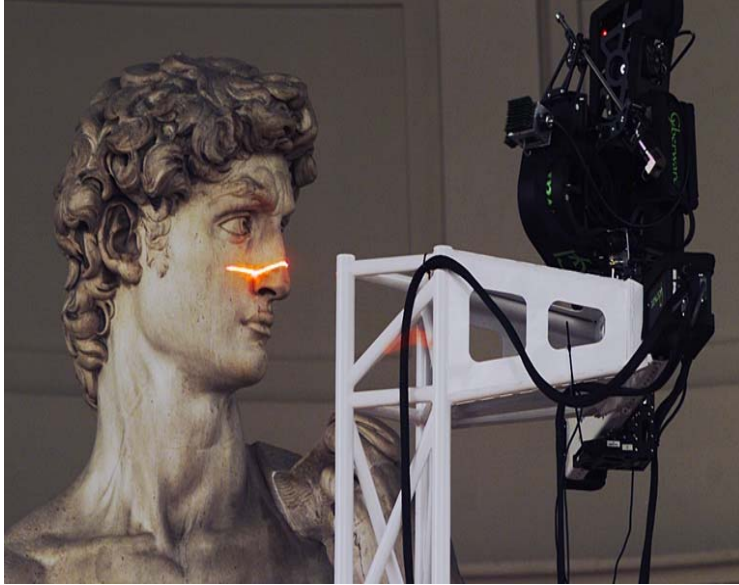
# Micro 3-D vision system based on structured light



## Hardware setup of a micro-scale 3-D vision system



## Laser line scanning for 3-D profiles



Source from Prof. Chang<sup>59</sup>

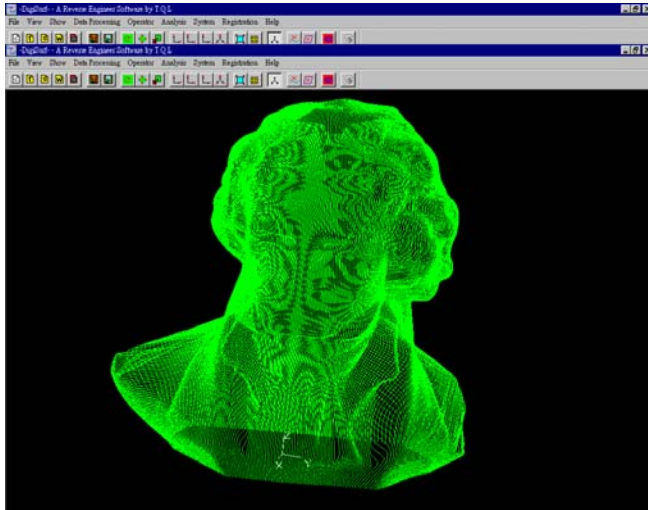
## Laser line scanning for 3D profiles



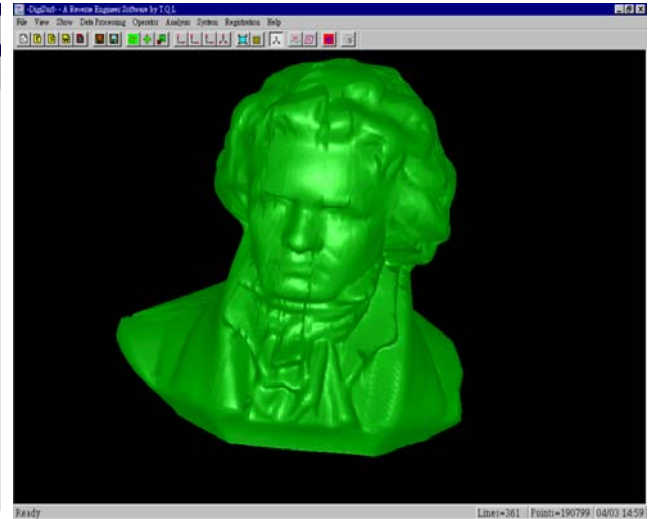
Source from Prof. Chang

60

# Laser line scanning for 3D profiles



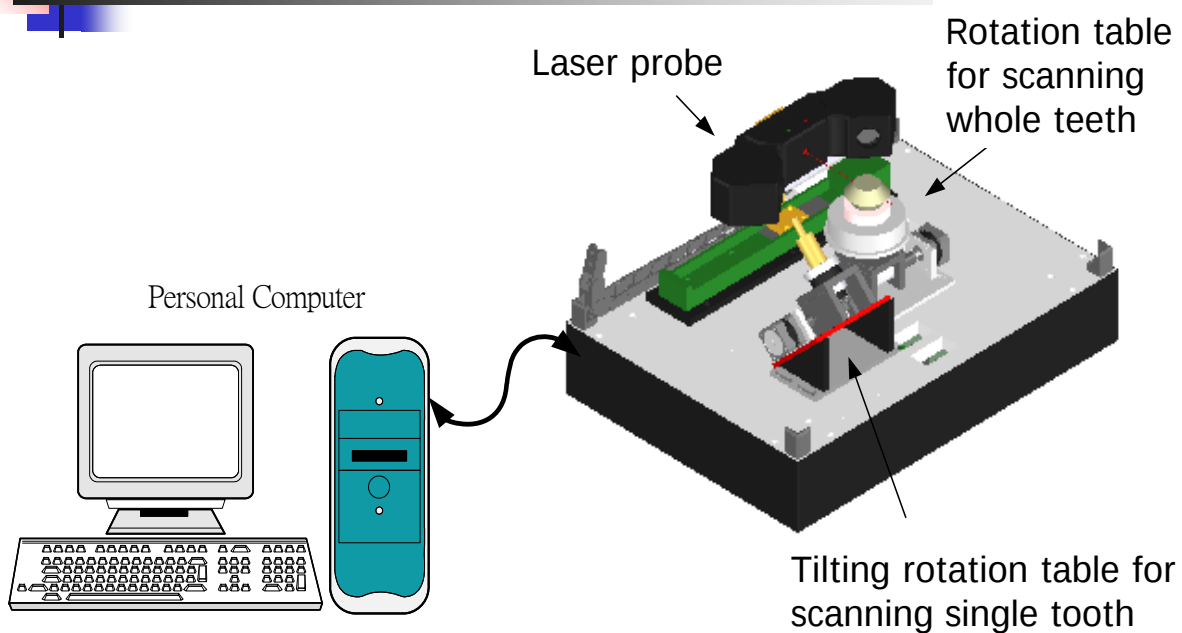
3D point clouds



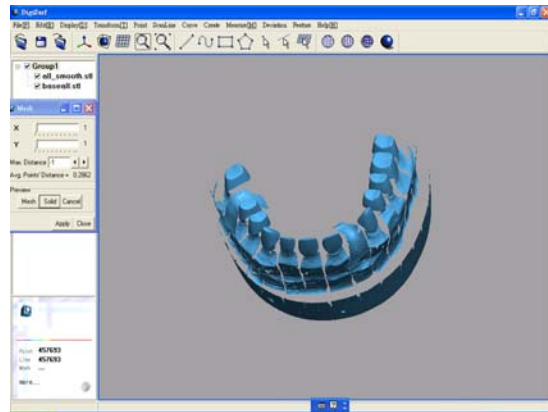
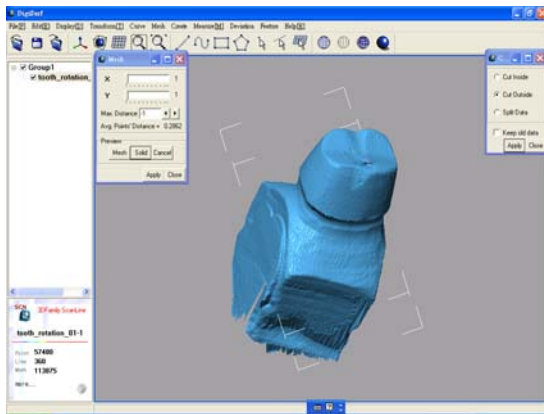
3D model using  
color shadowing

61  
Source from Prof. Chang

# 3-D dental scanning system

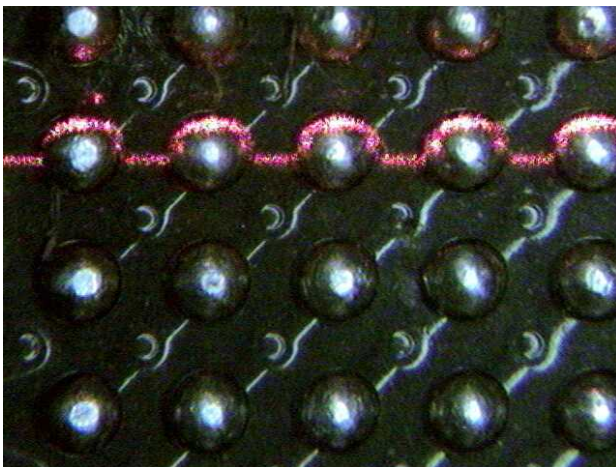


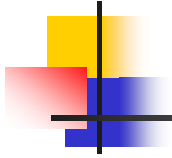
# 3-D teeth models



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# BGA (Ball gray array) Coplanarity inspection



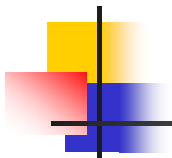


## Question 1

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- Perform the calibration operation required for single laser line projection with single CCD.
- Perform the calibration operation required for single laser line projection with double CCDs.

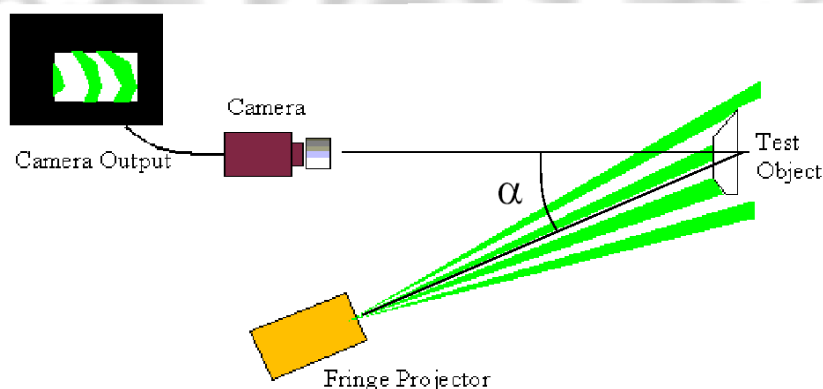
65



**White light  
Binary encoding method**

66

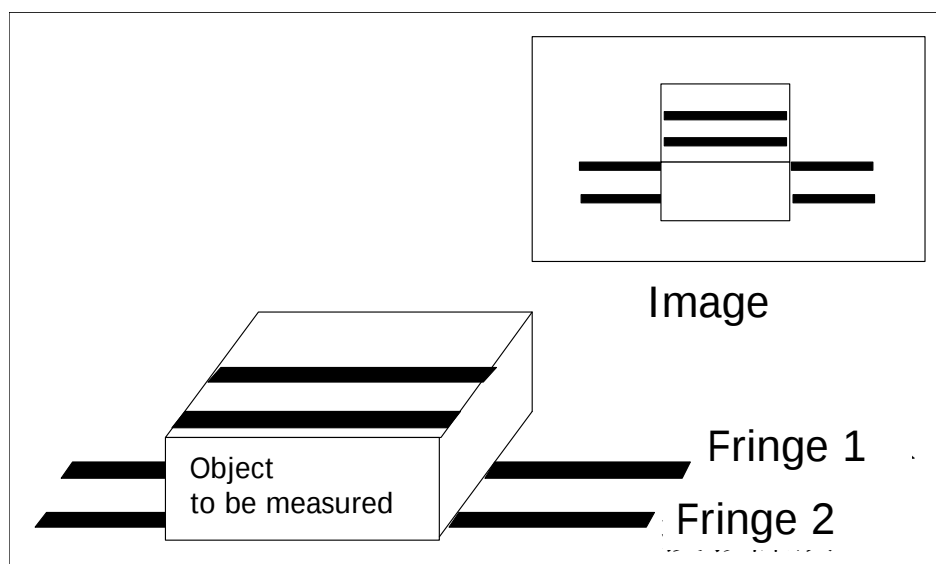
# Fringe Projection.



- Consider as a set of (near) parallel lines.
- With appropriate analysis obtain a co-ordinate for every camera pixel.
- Potential data rates of 1,000,000 in 10 seconds.

Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>67</sup>

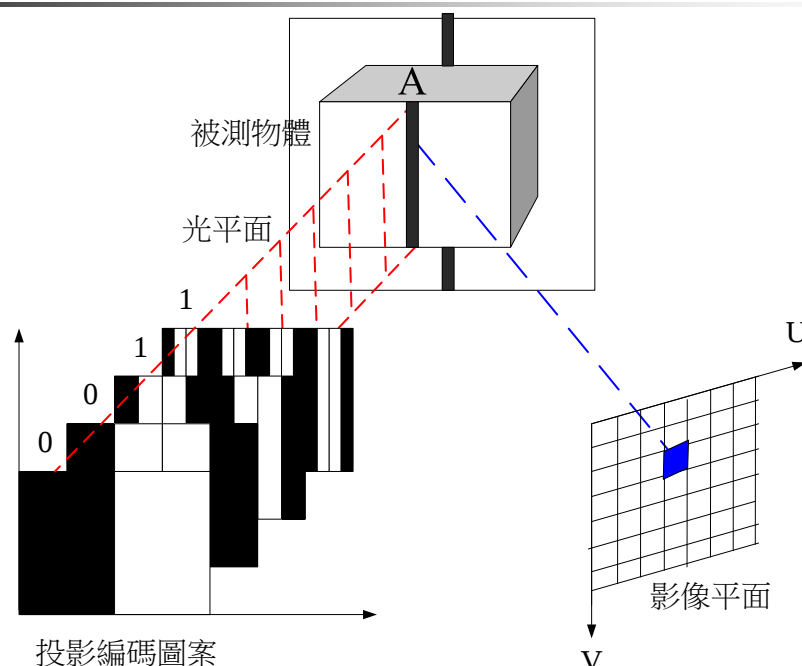
## Fringe recognition problem



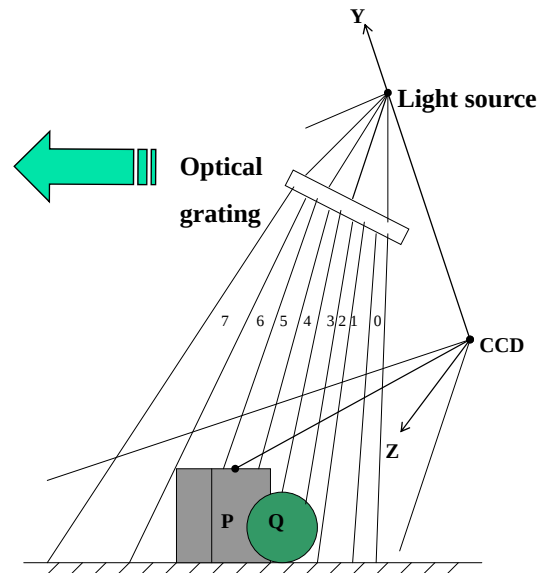
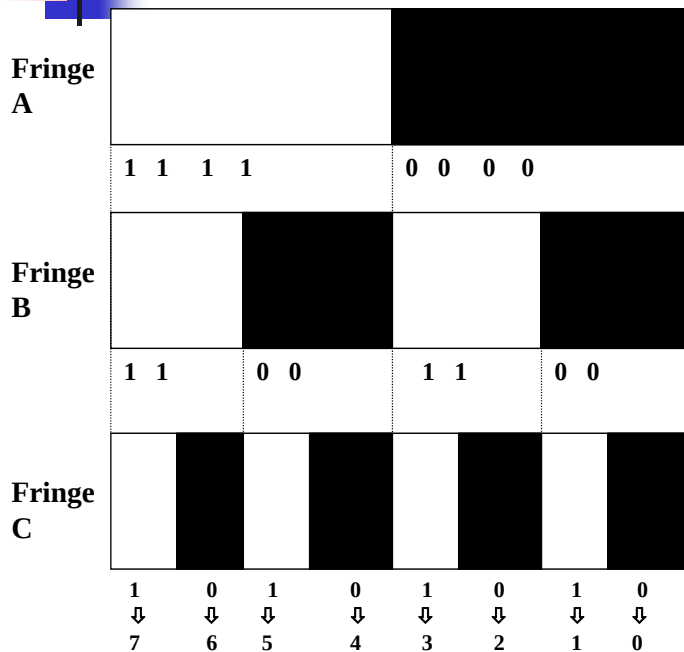
## Dealing With Range (or Phase Shift) Ambiguities

- The sequential projection of encoded patterns is another elegant way.
- The most popular methods for pattern projection use binary coded or phases shift fringes patterns. Gray codes binary images use multiple frames with increased resolution (bits) to encode a pixel on the CCD with its corresponding range.
- Sub-pixel resolution is obtained by detecting the edge transitions in the highest resolution image.

## Spatial recoding method



# Binary encoding method



Source from Prof. Chang

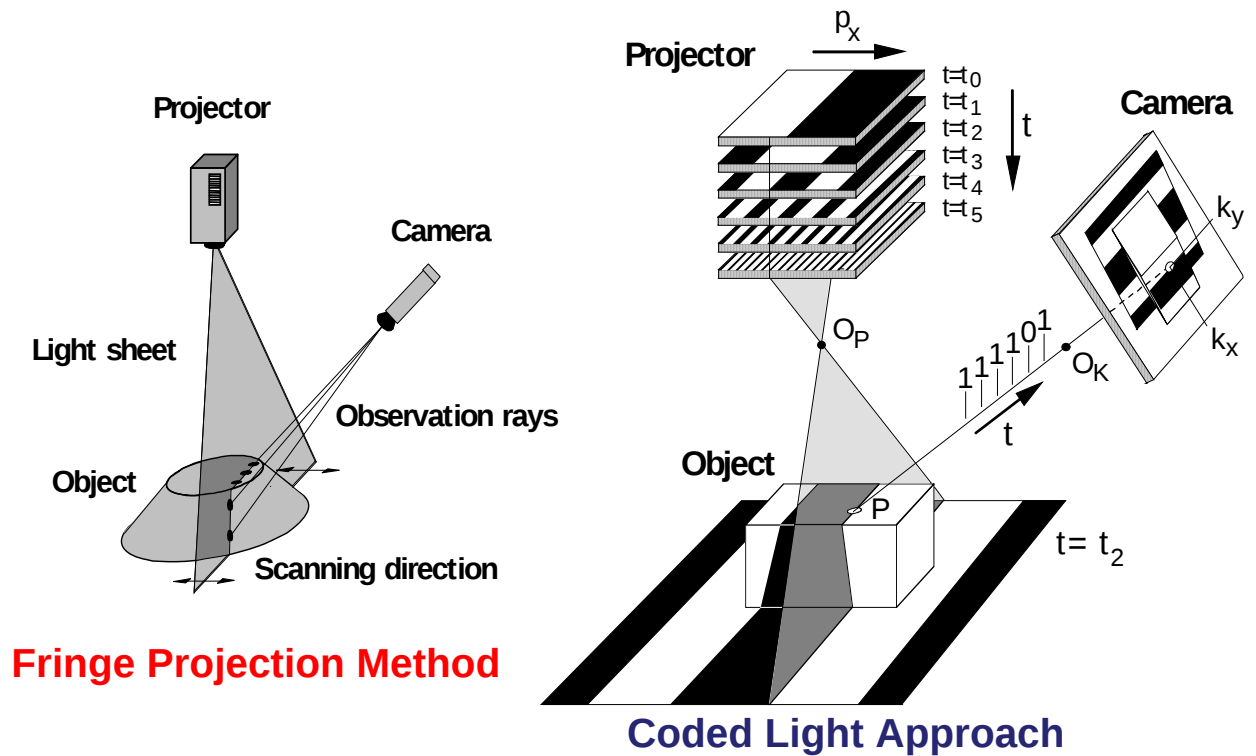
71

## White-light Binary encoding methods

- Binary encoding methods are today popular because of the availability of low cost projectors and a full 3D volume can be acquired quickly in just a few video frames.
- The use of incoherent light reduces speckle noise associated with laser and consequently provides better surface smoothness.
- The depth of view is smaller when compared to laser strip scanners and absolute accuracy for an equivalent 3-D volume (not only on the surface) will be relatively smaller than their laser counterparts.

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# Binary encoding method



73  
Optical 3D – Measurement in Volkswagen, ATOS (GOM).

Optical 3D – Measurement in Volkswagen, ATOS (GOM).

AOI  
Lab

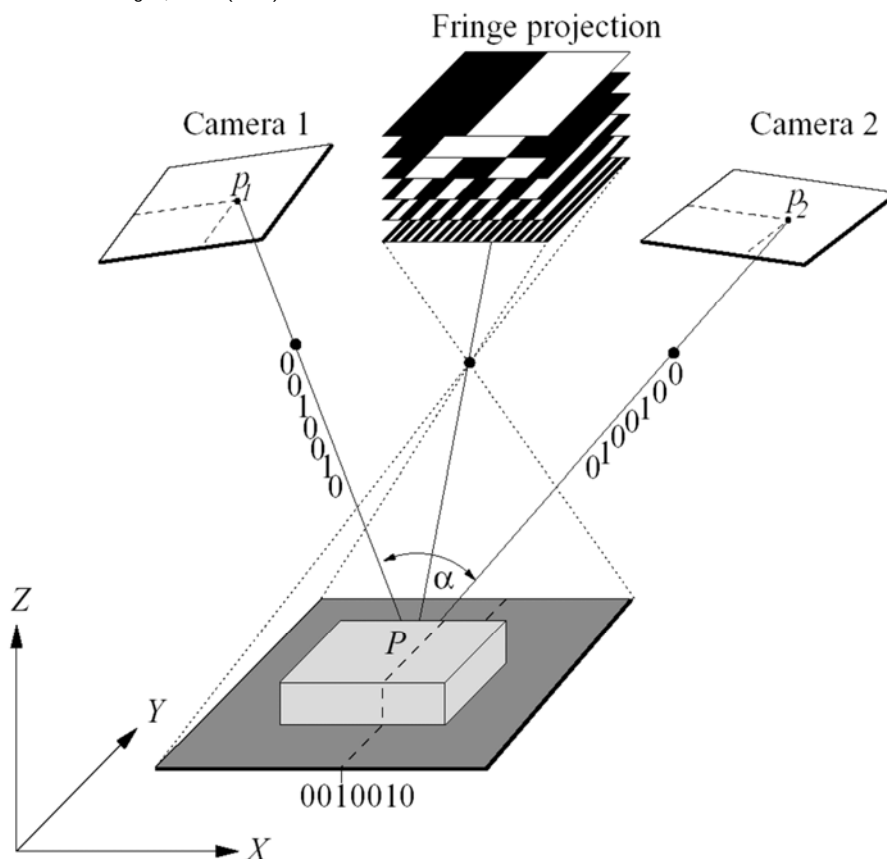


Figure 3: Principle setup of the fringe projection sensor

# Combination Photogrammetry - Fringe Projection Method

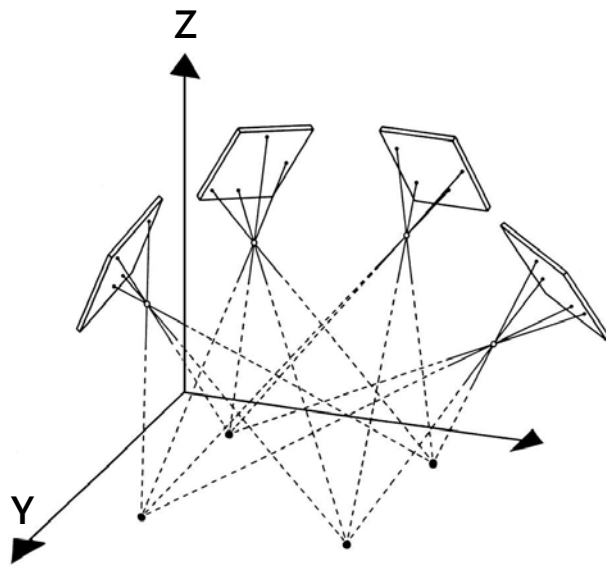
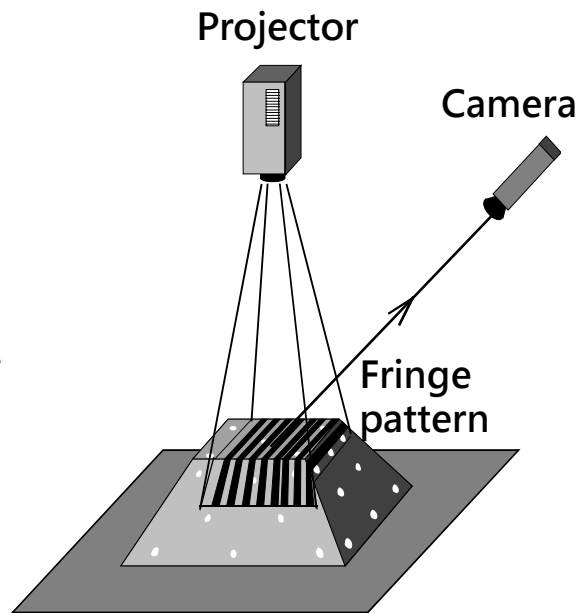


Image bundle



Object with reference points

Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>75</sup>

## Fringe Projection System



Atos-Sensor (GOM)

Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>76</sup>

# System Calibration

**Ballplate for  
coordinate**

**Measuring  
machines  
(PTB)**

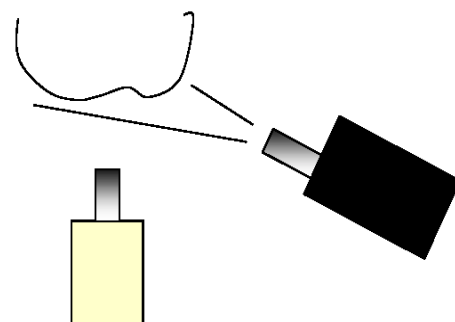


Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>77</sup>

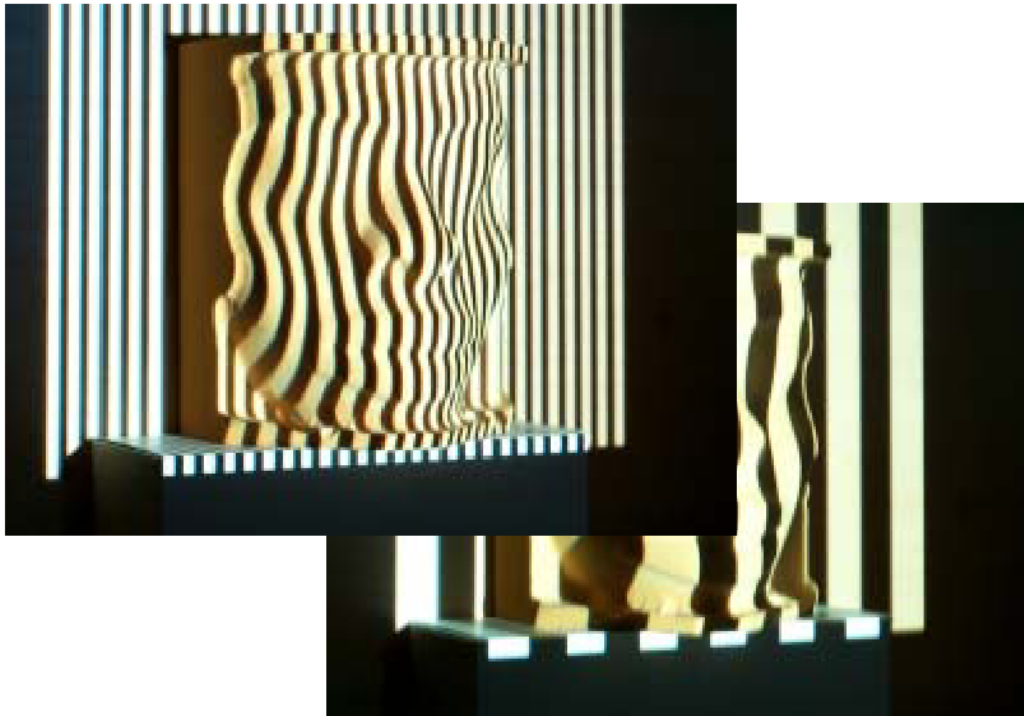
**AOI  
Lab**

## White Light Fringe Projection.

- ATOS system by GOM achieves dynamic range of 3000.
- White light systems in general have.
  - Calibrate using known objects scanned through measurement volume.
  - Fixed optical setup.
  - Depth of field limit through:
    - project grating onto object,
    - image the fringes onto the CCD.

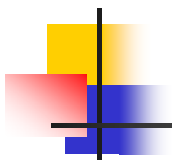


Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>78</sup>



**Figure 6:** Binary coded pattern projection; a 3D image can be acquired in a few frames.

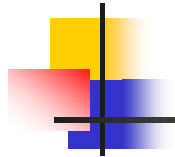
Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>79</sup>



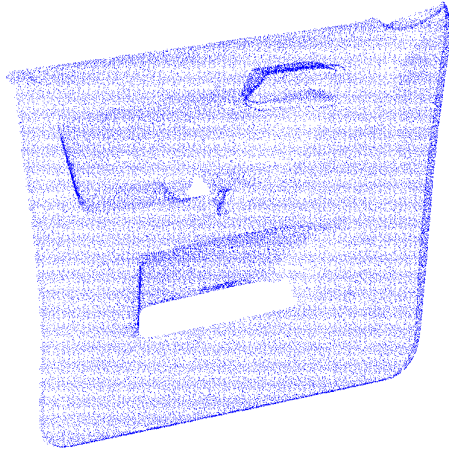
## Measuring Interior Door



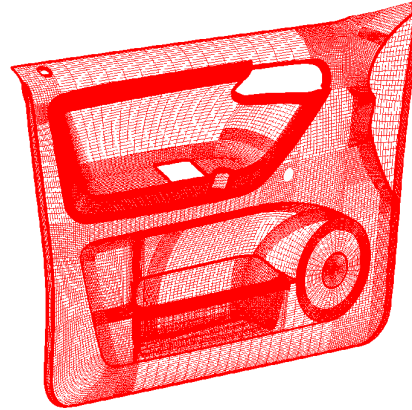
Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>80</sup>



## Measuring Interior Door

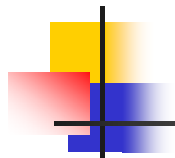


**Point cloud**

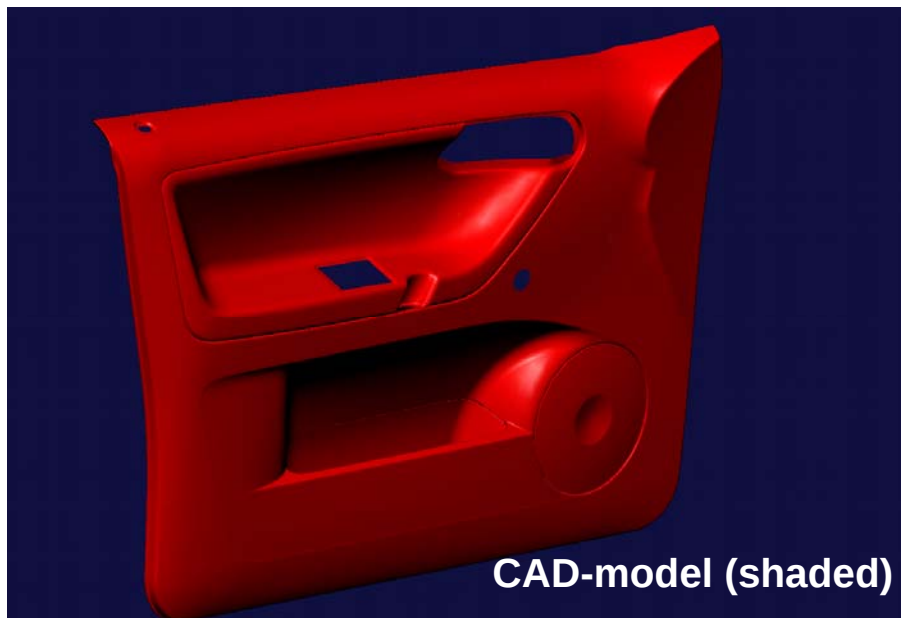


**CAD-model**

Optical 3D – Measurement in Volkswagen, ATOS (GOM).<sup>81</sup>



## Measuring Interior Door

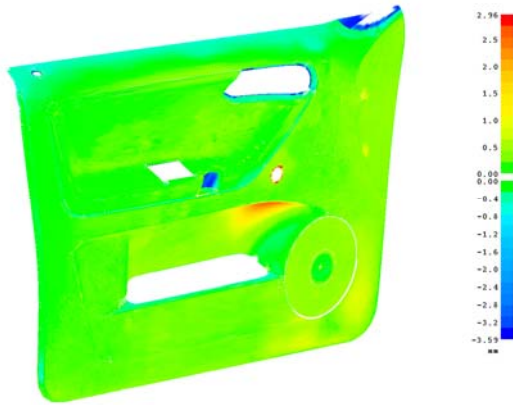


**CAD-model (shaded)**

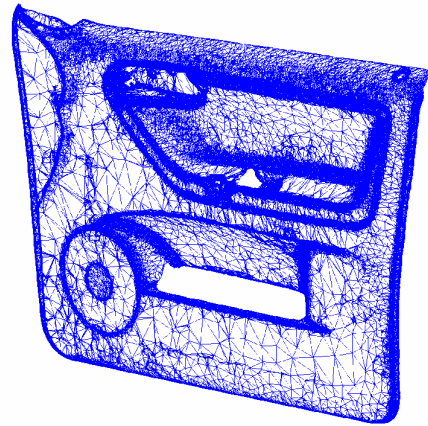
82

Optical 3D – Measurement in Volkswagen, ATOS (GOM).

## Measuring Interior Door



Nominal/actual comparison



Polygonized point cloud

83

Optical 3D – Measurement in Volkswagen, ATOS (GOM).

## Question 2

- How to perform the calibration procedure for the binary encoding method? You should identify the system transformation matrix and its projection plane equation.



## Reference Sources

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1. Prof. 章明, AOI三維量測技術與實務, 北科大專題演講資料.
2. 北科大, AOI Lab. 研究專題資料
3. Dr. 戴文智, AOI三維量測技術, 北科大專題演講資料.
4. Optical 3D - Measurement in Volkswagen, ATOS (GOM).