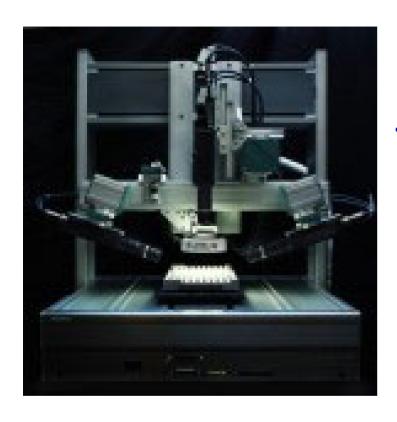
### Robot vision



Martin Jagersand



Addt' slides by D. Pugh N. Krouglic



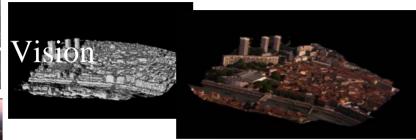
### What is Computer Vision?



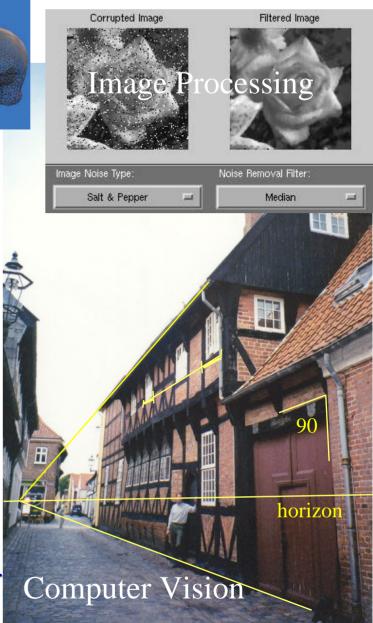


- Three Related fields
  - Image Processing: Changes 2D images into other 2D images
  - Computer Graphics: Takes 3D models, renders 2D images
  - Computer vision: Extracts scene information from 2D images and video
    - e.g. Geometry, "Where" something is in 3D,
    - Objects "What" something is"
- What information is in a 2D image?
- What information do we need for 3D analysis?









### Machine Vision

- •3D Camera vision in general environments hard
- Machine vision:
  - Use engineered environment
  - Use 2D when possible
  - Special markers/LED
  - Can buy working system!
- •Photogrammetry:
  - Outdoors
  - 3D surveying using cameras



### Vision

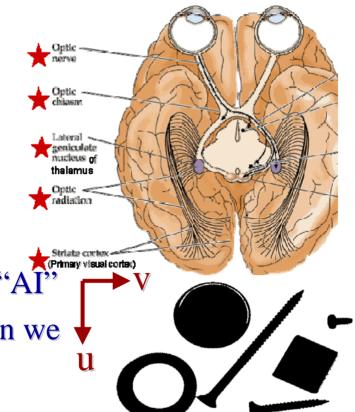
- Full: Human vision
  - We don't know how it works in detail
- Limited vision: Machines, Robots, "AI

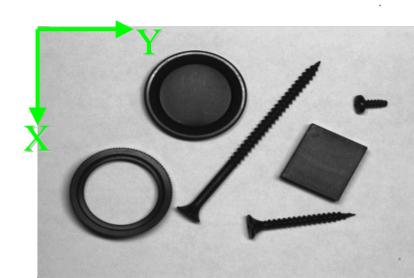
What is the most basic useful information we can get from a camera?

- 1. Location of a dot (LED/Marker) [u,v] = f(I)
- Segmentation of object pixels
   All of these are 2D image plane measurements!

#### What is the best camera location?

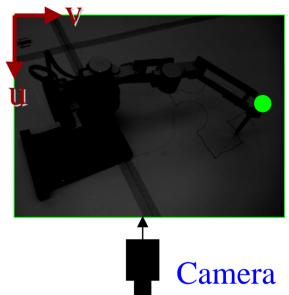
Usually overhead pointing straight down Adjust cam position so pixel [u,v] = s[X,Y]. Pixel coordinates are scaled world coord

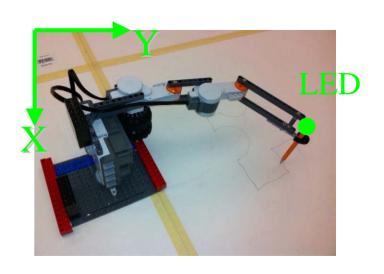




### Tracking LED special markers

- Put camera overhead pointing straight down on worktable.
  - Adjust cam position so pixel [u,v] = s[X,Y].
     Pixel coordinates are scaled world coord
  - Lower brightness so LED brighterest
- Put LED on robot end-effector
- Detection algorithm:
  - Threshold brightest pixels I(u,v)>200
  - Find centroid [u,v] of max pixels
- Variations:
  - Blinking LED can enhance detection in ambient light.
  - Different color LED's can be detected separately from R,G,B color video.

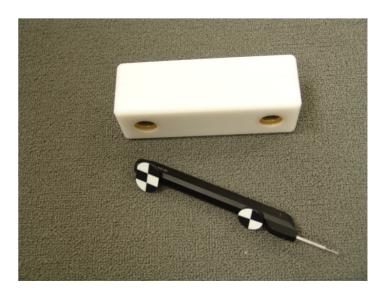




### Commercial tracking systems



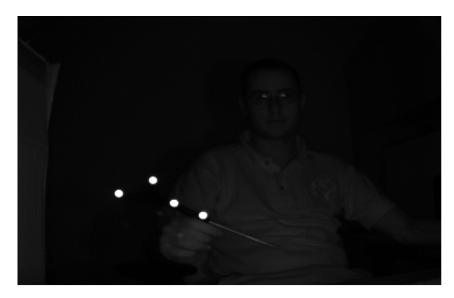
Polaris Vicra infra-red system (Northern Digitial Inc.)

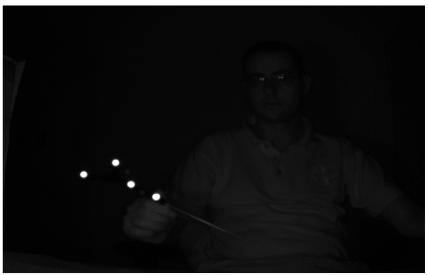


MicronTracker visible light system (Claron Technology Inc.)

### Commercial tracking system

Images acquired by the Polaris Vicra infra-red stereo system:



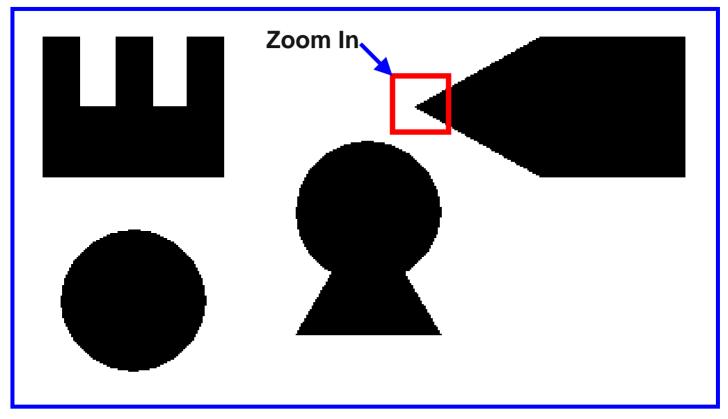


left image

right image

#### **IMAGE SEGMENTATION**

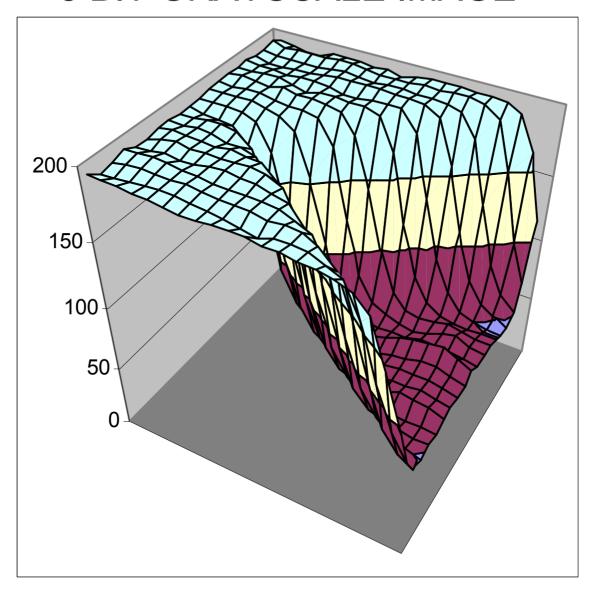
- •How many "objects" are there in the image below?
- •Assuming the answer is "4", what exactly defines an object?



### 8 BIT GRAYSCALE IMAGE

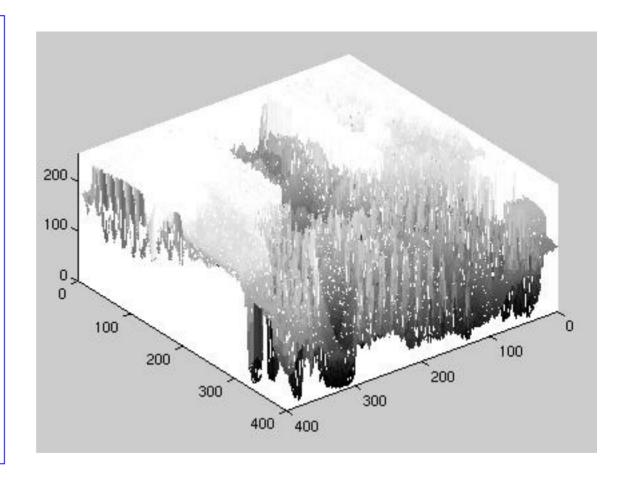
197	197	197	195	195	194	193	193	194	194	194	193	193	191	190	188	185	174	142	101
191	192	193	194	195	195	194	193	191	189	187	190	191	190	186	181	158	119	86	66
193	195	196	196	195	196	195	194	194	193	191	192	191	187	175	145	105	73	58	51
196	197	197	197	196	195	194	193	193	193	192	188	183	161	121	86	67	59	52	48
192	193	194	193	194	195	196	195	195	192	189	176	144	102	72	59	56	53	51	52
192	194	196	195	195	195	195	196	195	189	167	124	87	68	57	53	52	51	51	50
194	195	195	194	194	195	194	193	184	155	107	73	60	55	53	55	60	60	58	54
194	193	194	194	191	191	188	172	134	94	68	56	51	51	53	57	57	58	56	54
193	193	194	195	193	184	156	112	77	60	53	52	51	53	56	58	58	58	56	53
192	190	189	188	178	140	92	68	57	52	50	50	52	53	56	57	60	60	58	54
193	193	194	193	189	170	125	85	63	55	54	54	55	58	63	66	67	68	64	59
194	195	195	195	193	191	183	153	107	76	60	55	54	54	55	57	57	56	55	53
195	194	195	196	193	192	192	190	173	123	83	63	57	53	51	54	59	62	57	54
196	197	196	195	197	195	195	194	192	179	143	99	69	58	56	56	59	58	55	54
195	195	196	196	194	192	194	194	194	194	190	168	117	78	61	54	51	51	52	52
196	195	195	193	194	195	194	191	191	192	193	193	179	134	90	66	53	50	47	46
194	192	192	193	193	194	195	195	195	195	195	195	194	187	156	110	74	57	51	46
194	193	192	192	192	194	194	193	192	193	193	192	192	192	189	173	129	84	62	52
196	194	194	195	195	196	195	194	193	193	193	194	193	195	194	192	185	150	99	69
192	190	189	189	192	192	192	191	192	190	192	194	194	194	193	192	192	187	163	114

### 8 BIT GRAYSCALE IMAGE



### Compare: Natural image

#### What is this?



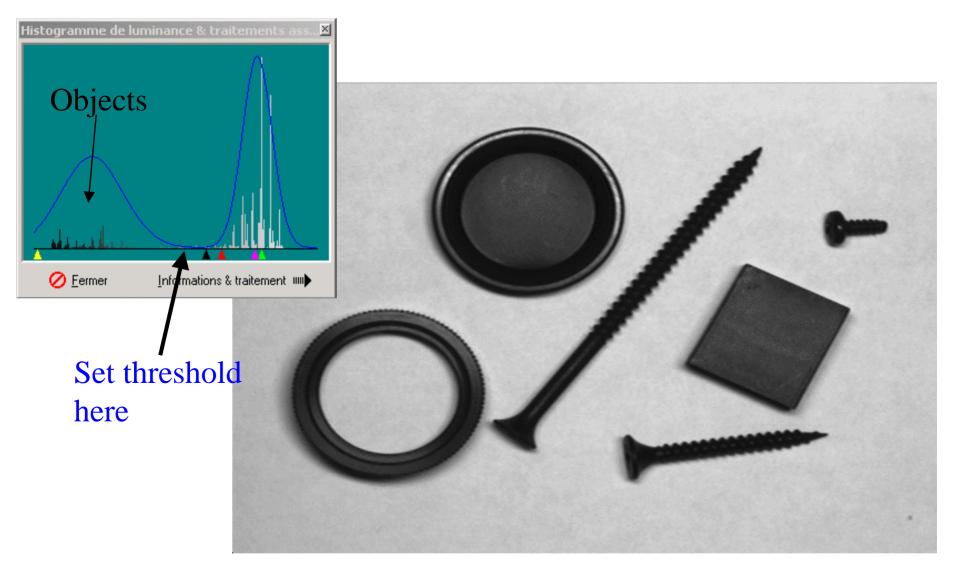
### Compare: Natural image



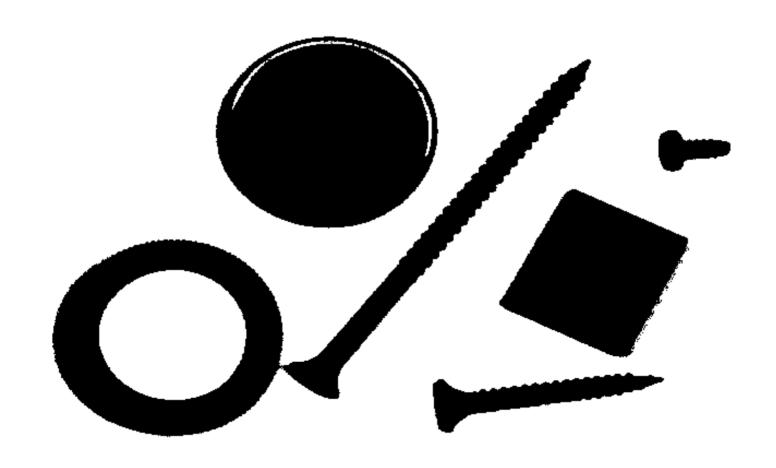
#### **GRAY LEVEL THRESHOLDING**

- •Many images consist of two regions that occupy different gray level ranges.
- •Such images are characterized by a bimodal image histogram.
- •An *image histogram* is a function **h** defined on the set of gray levels in a given image.
- •The value **h(k)** is given by the number of pixels in the image having image intensity **k**.

### **GRAY LEVEL THRESHOLDING**



### **BINARY IMAGE**

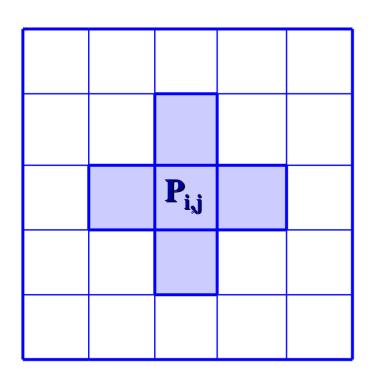


## IMAGE SEGMENTATION – CONNECTED COMPONENT LABELING

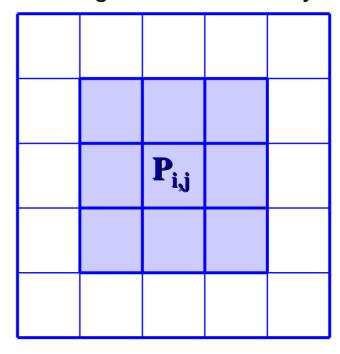
- •Segmentation can be viewed as a process of *pixel* classification; the image is segmented into objects or regions by assigning individual pixels to classes.
- •Connected Component Labeling assigns pixels to specific classes by verifying if an adjoining pixel (i.e., neighboring pixel) already belongs to that class.
- •There are two "standard" definitions of pixel connectivity: 4 neighbor connectivity and 8 neighbor connectivity.

## IMAGE SEGMENTATION – CONNECTED COMPONENT LABELING

4 Neighbor Connectivity



8 Neighbor Connectivity



## CONNECTED COMPONENT LABELING: FIRST PASS

		Α	Α				
		Α	Α	Α			
	В	В			С	С	
	В	В	В		С	С	
	В	В	В	В	В	В	

EQUIVALENCE:

B=C

## CONNECTED COMPONENT LABELING: SECOND PASS

		Α	Α				
		Α	Α	Α			
	В	В			В	В	
	В	В	В		В	В	
	В	В	В	В	В	В	

TWO OBJECTS!

## CONNECTED COMPONENT LABELING: TABLE OF EQUIVALENCES

2	=	5	16	=	27	16	=	50	50	=	81	112	=	127
5	=	9	5	=	28	5	=	39	50	=	86	112	=	134
2	=	5	27	=	34	34	=	51	50	=	86	112	=	137
5	=	10	16	=	37	5	=	39	5	=	87	112	=	138
5	=	10	5	=	39	34	=	46	111	=	112			
5	=	10	5	=	39	5	=	66	112	=	113			
5	=	12	40	=	41	34	=	72	112	=	119			
5	=	16	5	=	39	34	=	72	112	=	120			
5	=	18	34	=	46	50	=	76	112	=	120			
16	=	23	34	=	46	50	=	81	112	=	122			

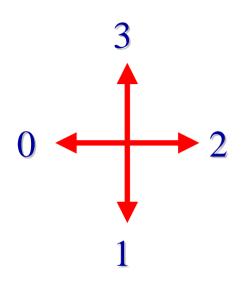
## CONNECTED COMPONENT LABELING: TABLE OF EQUIVALENCES

2	=	5	2	=	37	2	=	86	111	=	138
2	=	9	2	=	39	2	=	87			
2	=	10	40	=	41	111	=	112			
2	=	12	2	=	46	111	=	113			
2	=	16	2	=	50	111	=	119			
2	=	18	2	=	51	111	=	120			
2	=	23	2	=	66	111	=	122			
2	=	27	2	=	72	111	=	127			
2	=	28	2	=	76	111	=	134			
2	=	34	2	=	81	111	=	137			

# IS THERE A MORE COMPUTATIONALLY EFFICIENT TECHNIQUE FOR SEGMENTING THE OBJECTS IN THE IMAGE?

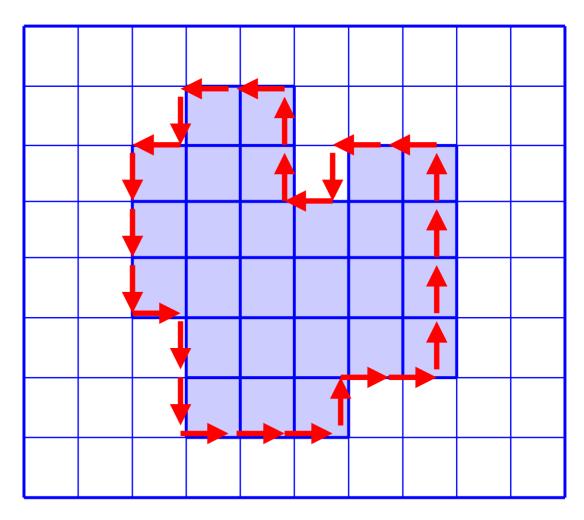
- •Contour tracking/border following identify the pixels that fall on the boundaries of the objects, i.e., pixels that have a neighbor that belongs to the *background class or region*.
- •There are two "standard" code definitions used to represent boundaries: code definitions based on 4-connectivity (*crack* code) and code definitions based on 8-connectivity (*chain code*).

## BOUNDARY REPRESENTATIONS: 4-CONNECTIVITY (*CRACK CODE*)

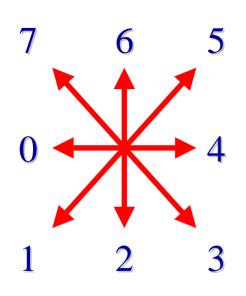


**CRACK CODE:** 

1011121122232233330 0103300

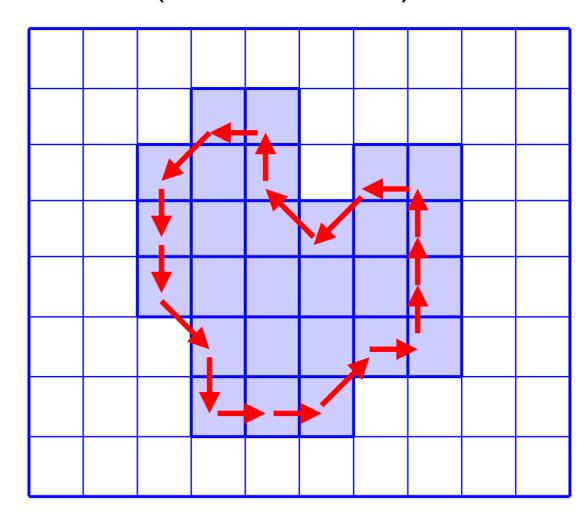


## BOUNDARY REPRESENTATIONS: 8-CONNECTIVITY (CHAIN CODE)



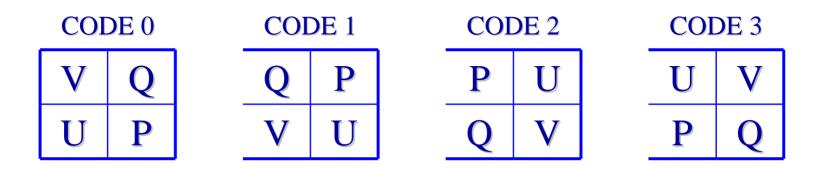
**CHAIN CODE:** 

12232445466601760



## CONTOUR TRACKING ALGORITHM FOR GENERATING CRACK CODE

- •Identify a pixel **P** that belongs to the class "objects" and a neighboring pixel (4 neighbor connectivity) **Q** that belongs to the class "background".
- Depending on the relative position of Q relative to P, identify pixels U and V as follows:



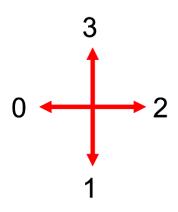
#### CONTOUR TRACKING ALGORITHM

- •Assume that a pixel has a value of "1" if it belongs to the class "object" and "0" if it belongs to the class "background".
- •Pixels **U** and **V** are used to determine the next "move" (i.e., the next element of crack code) as summarized in the following truth table:

U	V	Ρ'	Q'	TURN	CODE*
X	1	V	Q	RIGHT	CODE-1
1	0	U	V	NONE	CODE
0	0	P	U	LEFT	CODE+1

<sup>\*</sup>Implement as a modulo 4 counter

### CONTOUR TRACKING ALGORITHM



COL	DE 0
٧	Q

CODL							
Q	Р						
٧	C						

CODE 1

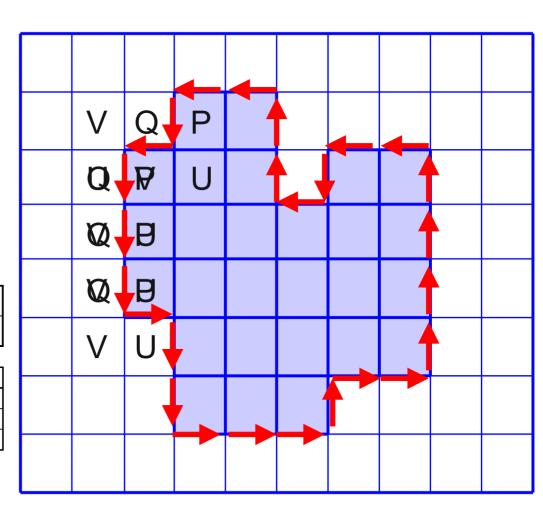
COL	)E 2
Р	IJ

ノL	JE 2	_	COL	JE 3
	С		C	٧
)	٧		Р	Q

CODE 2

U	V	P'	Q'	TURN	CODE
Х	1	٧	Q	RIGHT	CODE-1
1	0	U	V	NONE	CODE
0	0	Р	J	LEFT	CODE+1

<sup>\*</sup>Implement as a modulo 4 counter



### CONTOUR TRACKING ALGORITHM FOR GENERATING CHAIN CODE

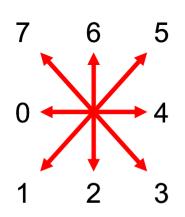
•Identify a pixel  $\bf P$  that belongs to the class "objects" and a neighboring pixel (4 neighbor connectivity)  $\bf R_0$  that belongs to the class "background". Assume that a pixel has a value of "1" if it belongs to the class "object" and "0" if it belongs to the class "background".

•Assign the 8-connectivity neighbors of P to R<sub>0</sub>, R<sub>1</sub>, ..., R7

as follows:

$$R_7$$
  $R_6$   $R_5$   $R_0$   $P$   $R_4$   $R_1$   $R_2$   $R_3$ 

## CONTOUR TRACKING ALGORITHM FOR GENERATING CHAIN CODE



#### **ALGORITHM**:

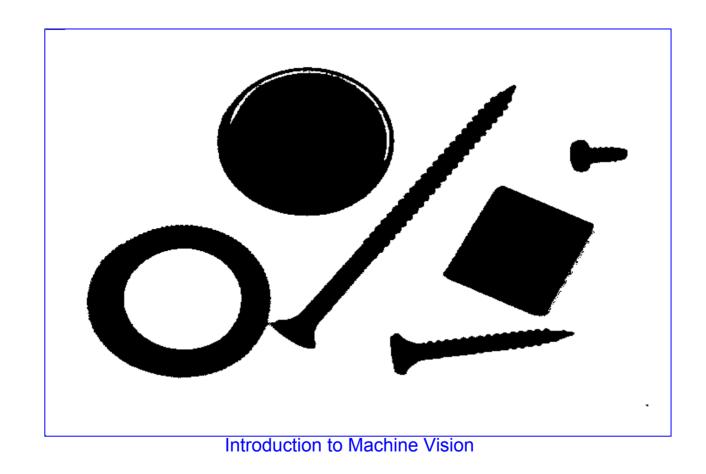
i=0
WHILE (R<sub>i</sub>==0) { i++ }
•Move P to R<sub>i</sub>
•Set i=6 for next search

	$R_7$	$R_6$	$R_5$			
R <sub>7</sub>	R	R <sub>5</sub>	$R_4$			
Rø				¥		
Rø	Re	R <sub>å</sub>				
R <sub>0</sub>	RZ	R	$R_5$			
$R_1$	Rg	<b>R</b> 3	R <sub>4</sub>	7		
	R <sub>ð</sub>	<b>™</b> 2	<b>R</b> <sub>3</sub>			
	R <sub>1</sub>	$R_2$	$R_3$			

#### **OBJECT RECOGNITION – BLOB ANALYSIS**

- •Once the image has been segmented into classes representing the objects in the image, the next step is to generate a high level *description* of the various objects.
- •A comprehensive set of form parameters describing each object or region in an image is useful for object recognition.
- •Ideally the form parameters should be independent of the object's position and orientation as well as the distance between the camera and the object (i.e., scale factor).

What are some examples of form parameters that would be useful in identifying the objects in the image below?



#### **OBJECT RECOGNITION – BLOB ANALYSIS**

- •Examples of form parameters that are invariant with respect to position, orientation, and scale:
  - Number of holes in the object
  - Compactness or Complexity: (Perimeter)<sup>2</sup>/Area
  - Moment invariants
- •All of these parameters can be evaluated during contour following.

#### **GENERALIZED MOMENTS**

- •Shape features or form parameters provide a high level description of objects or regions in an image
- •Many shape features can be conveniently represented in terms of moments. The (p,q)<sup>th</sup> moment of a region R defined by the function f(x,y) is given by:

$$m_{pq} = \iint_{R} x^{p} y^{q} f(x, y) dx dy$$

#### **GENERALIZED MOMENTS**

•In the case of a digital image of size **n** by **m** pixels, this equation simplifies to:

$$M_{ij} = \sum_{x=1}^{n} \sum_{y=1}^{m} x^{i} y^{j} f(x, y)$$

•For binary images the function f(x,y) takes a value of 1 for pixels belonging to class "object" and "0" for class "background".

### **GENERALIZED MOMENTS**

$$M_{ij} = \sum_{x=1}^{n} \sum_{y=1}^{m} x^{i} y^{j} f(x, y)$$

0	1	2	3	4	5	6	7	8	9
1									
2									
3									
4									
5									
6									
, V	,								

i	j	$\mathbf{M}_{\mathbf{ij}}$	
0	0	7 <	- Area
1	0	33	
0	1	20	
2	0	159	Moment
0	2	64	of Inertia
1	1	93	

#### SOME USEFUL MOMENTS

•The center of mass of a region can be defined in terms of generalized moments as follows:

$$\overline{X} = \frac{M_{10}}{M_{00}}$$

$$\overline{Y} = \frac{M_{01}}{M_{00}}$$

### SOME USEFUL MOMENTS

•The moments of inertia relative to the center of mass can be determined by applying the general form of the parallel axis theorem:

$$\overline{M}_{02} = M_{02} - \frac{M_{01}^2}{M_{00}}$$

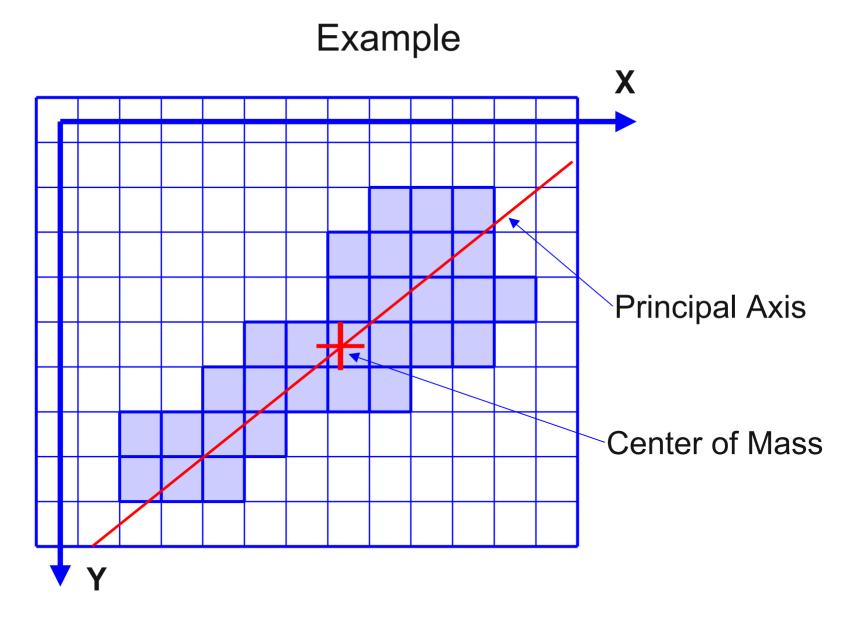
$$\overline{M}_{20} = M_{20} - \frac{M_{10}^2}{M_{00}}$$

$$\overline{M}_{11} = M_{11} - \frac{M_{10}M_{01}}{M_{00}}$$

### SOME USEFUL MOMENTS

- •The principal axis of an object is the axis passing through the center of mass which yields the minimum moment of inertia.
- •This axis forms an angle  $\theta$  with respect to the X axis.
- •The principal axis is useful in robotics for determining the orientation of randomly placed objects.

$$TAN2\theta = \frac{2M_{11}}{M_{20} - M_{02}}$$



### SOME (MORE) USEFUL MOMENTS

•The minimum/maximum moment of inertia about an axis passing through the center of mass are given by:

$$\overline{I}_{MIN} = \frac{\overline{M}_{02} + \overline{M}_{20}}{2} - \frac{\sqrt{(\overline{M}_{02} - \overline{M}_{20})^2 + 4\overline{M}_{11}^2}}{2}$$

$$\overline{I}_{MAX} = \frac{\overline{M}_{02} + \overline{M}_{20}}{2} + \frac{\sqrt{(\overline{M}_{02} - \overline{M}_{20})^2 + 4\overline{M}_{11}^2}}{2}$$

### SOME (MORE) USEFUL MOMENTS

•The following moments are independent of position, orientation, and reflection. They can be used to identify the object in the image.

$$\phi_1 = \overline{M}_{20} + \overline{M}_{02}$$

$$\phi_2 = (\overline{M}_{20} + \overline{M}_{02})^2 + 4\overline{M}_{11}^2$$

### SOME (MORE) USEFUL MOMENTS

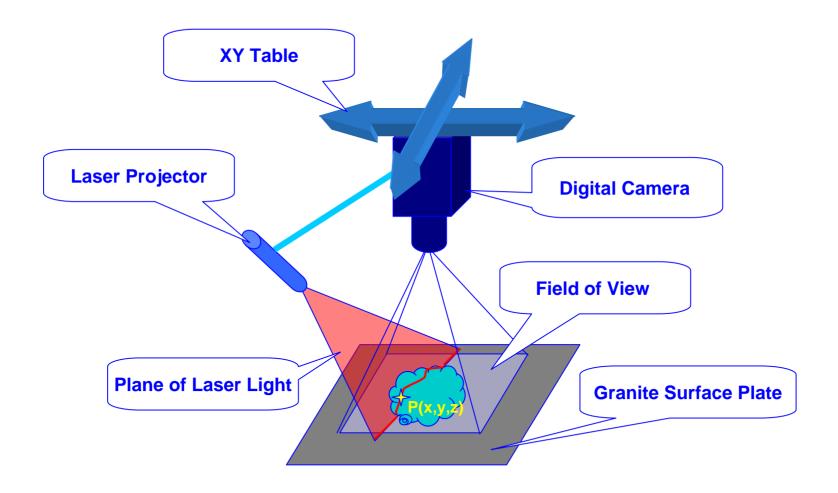
•The following moments are normalized with respect to area. They are independent of position, orientation, reflection, and scale.

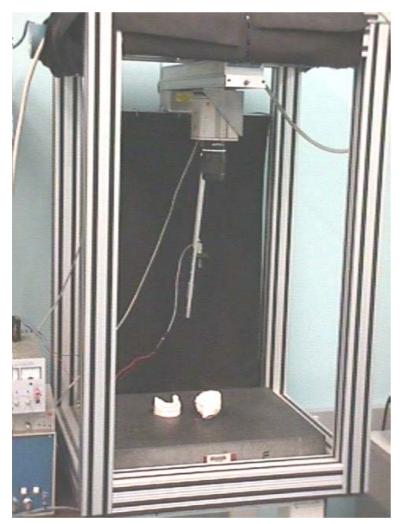
$$\psi_1 = \frac{\phi_1}{M_{00}^2}$$

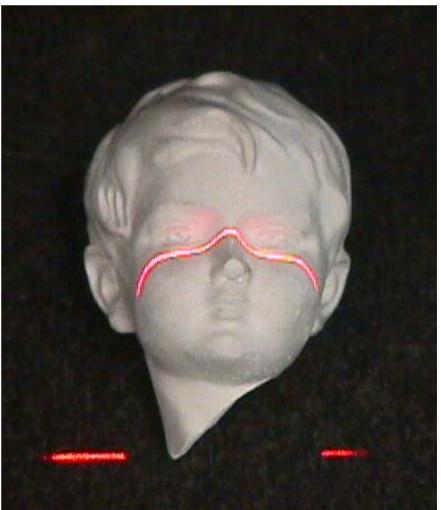
$$\psi_2 = \frac{\phi_2}{M_{00}^4}$$

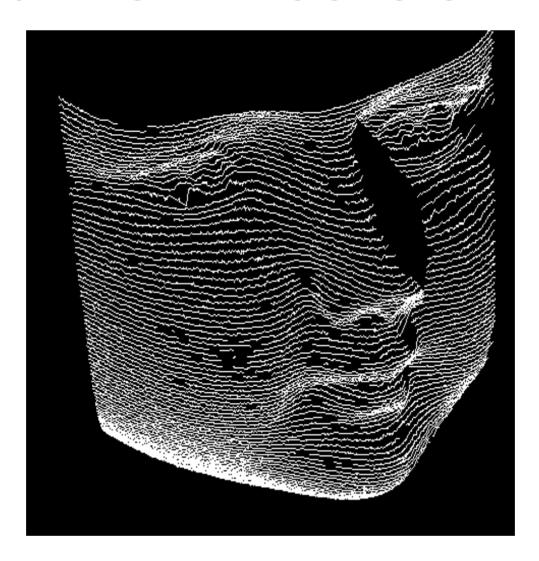
## EVALUATING MOMENTS DURING CONTOUR TRACKING

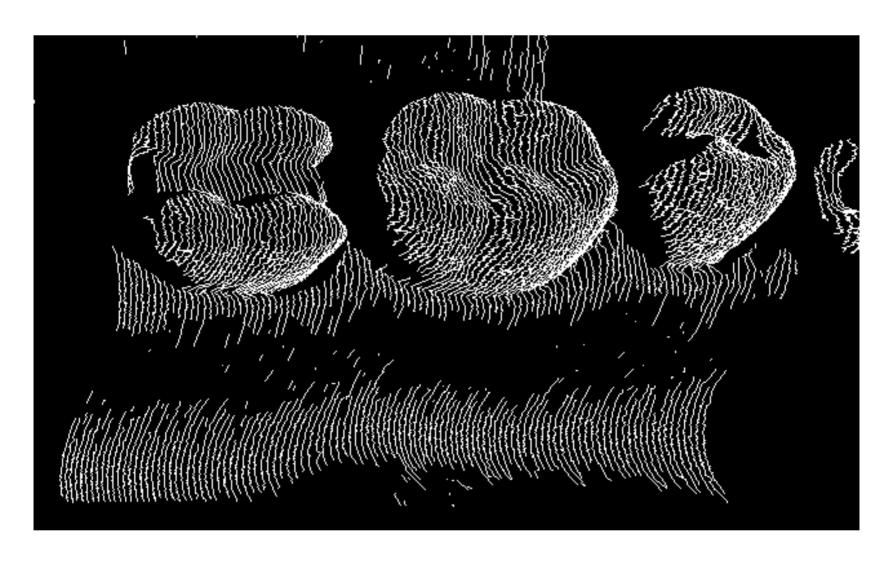
- •Generalized moments are computed by evaluating a double (i.e., surface) integral over a region of the image.
- •The surface integral can be transformed into a line integral around the boundary of the region by applying Green's Theorem.
- •The line integral can be easily evaluated during contour tracking.
- •The process is analogous to using a planimeter to graphically evaluate the area of a geometric figure.

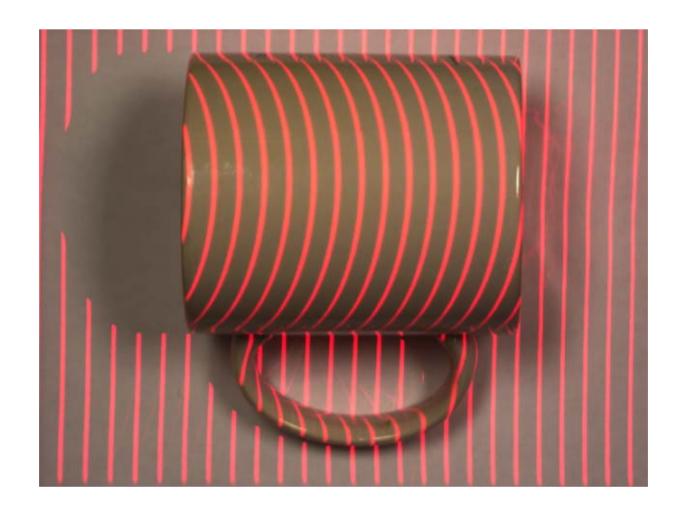












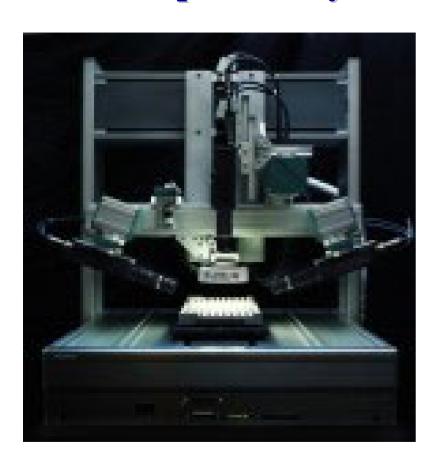
# Commercial Machine Vision Definition

"Machine vision is the capturing of an image (a snapshot in time), the conversion of the image to digital information, and the application of processing algorithms to extract useful information about the image for the purposes of pattern recognition, part inspection, or part positioning and orientation"....Ed Red



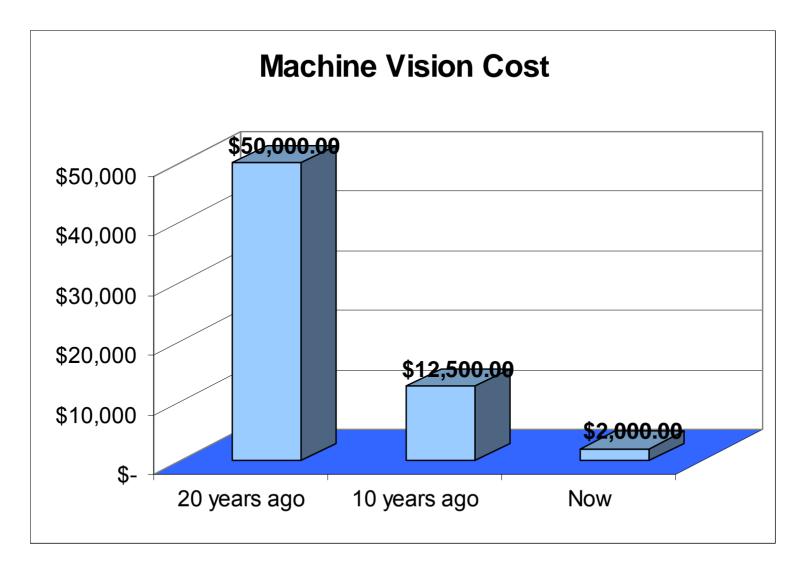
## **Current State**

### Cheap and Easy to Use



- The Sony approved Scorpion Robot Inspection Starter Kit contains everything you need for bringing your Scorpion Robot Inspection project to life.
- The kit includes a Scorpion Enterprise software license
- new high quality Sony XCD-710 (CR) camera (XGA resolution)
- Sony Desktop Robot
- 2 days training course
- A standard and configurable user interface paired with innovative, easy-to-use and robust imaging tools
- **\$1995.00**

## Costs



Data Source: <a href="http://www.qualitydigest.com/oct97/html/machvis.html">http://www.qualitydigest.com/oct97/html/machvis.html</a>

## Costs

## Savings from using machine vision

- Cost of recruiting and training
- Scrap/rework created while learning a new job
- Average workers' compensation paid for injuries
- Average educational grant per employee
- Personnel/payroll department costs per employee

### Machine vision now has a wide range of installations in highproduction industries including:

- Semiconductor
- Electronic
- Automotive
- Container
- Pharmaceutical
- medical device
- Plastic

- Chemicals
- o Food
- Footwear
- Textiles
- Printing
- Wood/forest products
- Fabricated metal

Machine vision can be found wherever parts are formed and packaged.

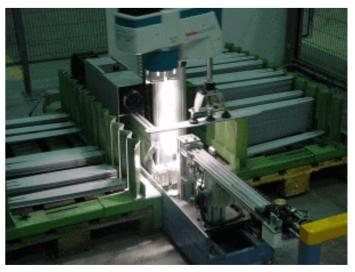
#### Automotive

- fuse box inspection,
- tire tread recognition,
- power train inspection and
- sheet metal inspection.

#### Electronics

- bare-board manufacturer
  - (inspect artwork, inner/outer layer circuit patterns, drill-hole patterns),
- board assembler
  - (inspect solder paste/epoxy for presence and volume, check co-planarity of component leads, verify presence and position of components presolder, verify presence and position of components post-solder, and solder presence/absence and properties),
- assembly
  - (alignment to assure position of screen-printed patterns, epoxy, component placement, and board pattern position.)





### Food

- fruit and vegetable sorting and grading,
- automatic portioning,
- inspection for foreign objects, and
- general package-line applications

## Beverage

- quality inspection of containers,
- fill level inspection, and
- closure inspection are among the leading applications



### Aerospace

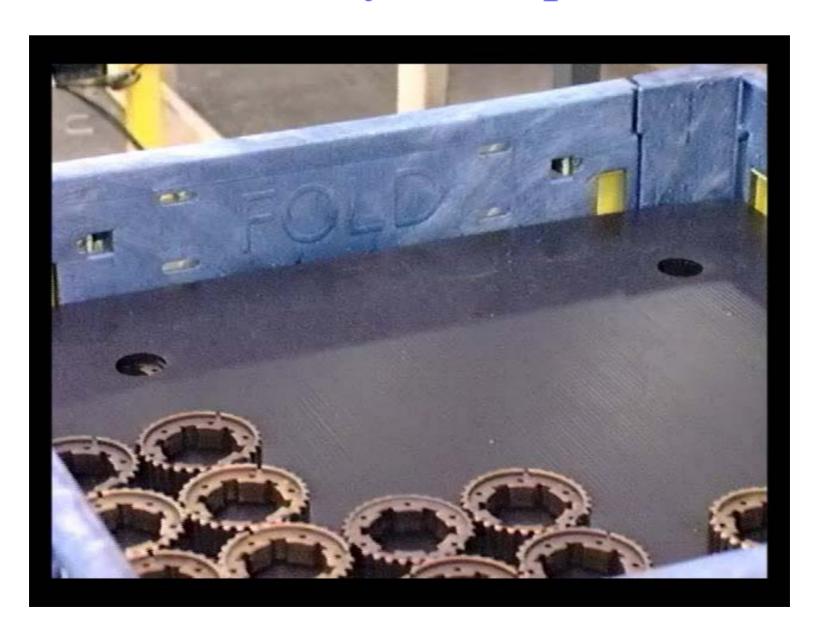
- Design of a new sensor system with improved performance for accurately locating and measuring the parameters of holes in aerospace components
- The specification for the sensor system included the ability to locate and measure both conventional and countersunk holes, in a range of surfaces including aluminum and the latest graphite-based materials

## Work Zone Monitoring uses:

- 1300 x 1030 All Digital Camera
- Image Capture and License Plate Reader
- Fiber Optic Transmission
- Software Plate Reader
- PCIbus Wintel Architecture



## Industry Example



## Supporting Technology

## **SOFTWARE:** 7 Things to Consider When Choosing Vision Software Camera Choice

• The first consideration when picking vision software is to determine if it works with the camera that is best suited for your application.



#### **Hardware Scalability**

• Because camera technologies are advancing rapidly, someday you may want to upgrade your cameras to improve image quality or measure additional features.

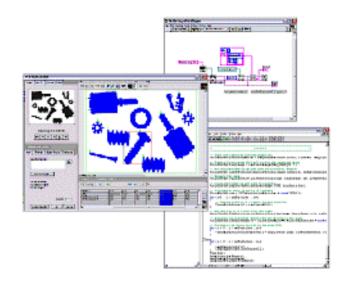


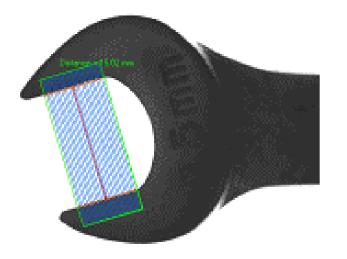
## Supporting Technology

#### **SOFTWARE:** 7 Things to Consider When Choosing Vision Software

#### **Software Ease of Use**

• Once you acquire an image, the next step is to process it.





#### **Algorithm Breadth and Accuracy**

• whether the software tools can correctly and accurately measure important part or object features down to the subpixel. If the software is not accurate and reliable, then it does not matter how fast your computer is or how many pixels your camera has.

## Supporting Technology

#### **SOFTWARE:** 7 Things to Consider When Choosing Vision Software

#### **Algorithm Performance**

 No matter how many hundreds of algorithms you have to choose from or how quickly you can build an application with them, if the inspection tools are inefficient and take too long to run, then much of your work goes to waste.

#### **Integration with Other Devices**

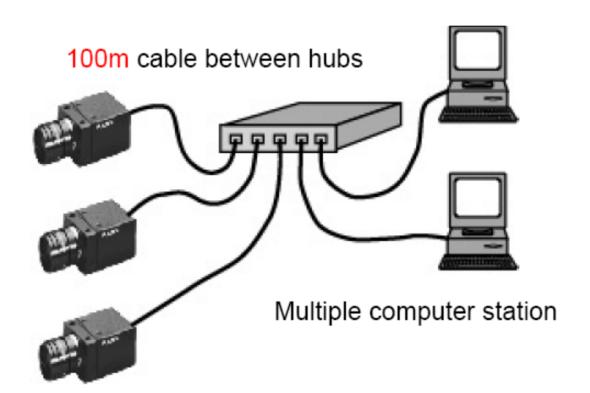
In industrial automation, your vision application may need to control actuators to sort products; communicate inspection results to a robot controller, PLC, or <u>programmable automation</u> <u>controller</u>; save images and data to network servers; or communicate inspection parameters and results to a local or remote user interface.

#### **Price**

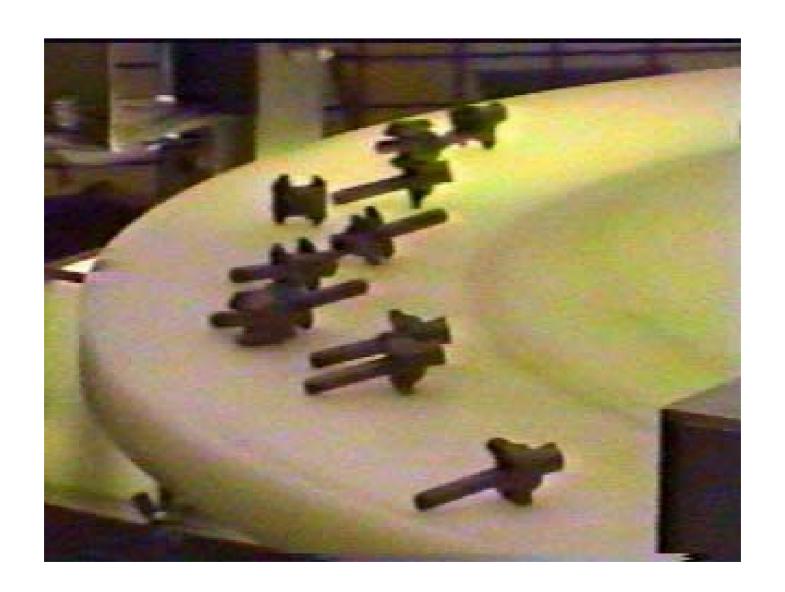
Vision software packages come in many variations. Many cater to OEM customers by splitting
up their development libraries and selling algorithms a la carte. While each individual algorithm
bundle seems lower in cost, the total vision development package cost is often quite high. Add to
that the cost of a license for each component, and application deployment becomes complicated
as well as costly.

## Standardization

• GigE Vision is the newest effort at communications interoperability. Work is on-going to develop and release a standard for the connection of vision components using a standard Gigabit **Ethernet cable and connector**.



## Industry Example



## Single Camera 3DTM (SC3DTM) A novel technology for guidance of industrial robots in three

A novel technology for guidance of industrial robots in threedimensional space

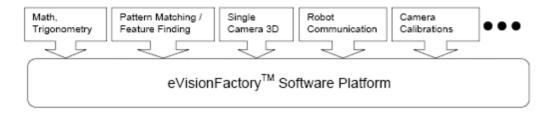
- Provides accurate 3D pose (6 d.o.f) information to industrial robots
- Machines able to 'see' the part while at the same time addressing the issues of reliability, usability and global supply.



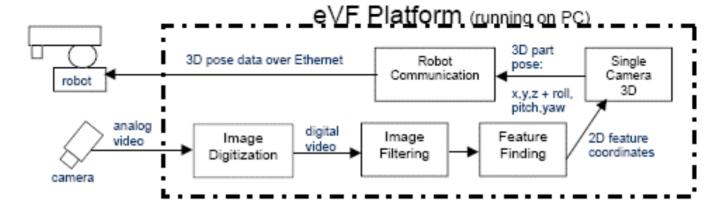
## Single Camera 3DTM (SC3DTM)

A novel technology for guidance of industrial robots in threedimensional space

### Software



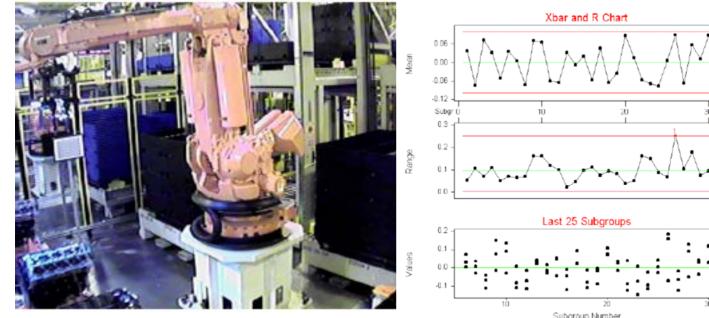
### Data Flow

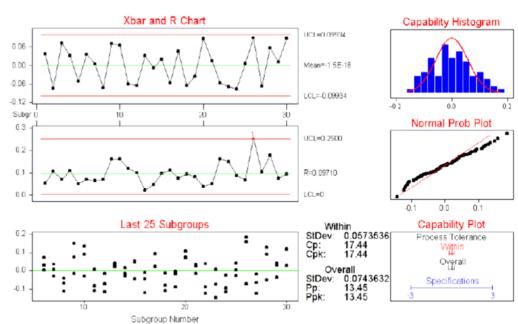


### Single Camera 3DTM (SC3DTM) A novel technology for guidance of industrial robots in threedimensional space

### **Machine**

### Repeatability Cell CA010 Test at Essex Z Repeatability



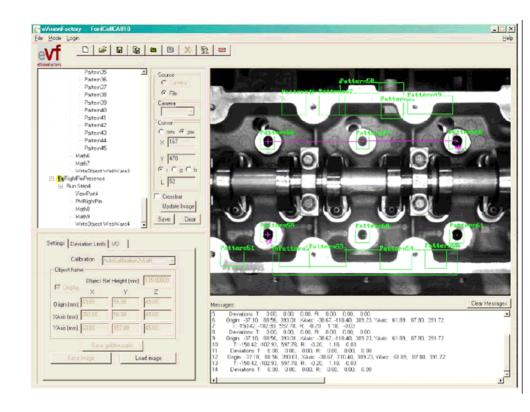


## Single Camera 3DTM (SC3DTM)

A novel technology for guidance of industrial robots in threedimensional space

#### Requirements

- Parts must be stationary
- No part overlap
- 10 unique features visible to the camera
- Part to part variation in the position of features must be minimal
- Field of view must contain all features
- Camera resolution must be less than 10% of the accuracy/repeatability required by the application



## Summary

### Machine Vision is:

- ✓ Affordable
- ✓ Used in many applications
- **✓** Convenient
- ✓Easy-to-use
- ✓ Saves time
- **√**Safe

## Primary Vendors of Technology

#### 3D Systems

- Cohu, Inc., Electronics Division
- LMI Technologies Inc
- SICK IVP AB
- StockerYale Canada
- VITRONIC Machine Vision Ltd.

#### Cameras

- Adimec
- Basler Vision Technologies
- Daitron
- JAI A/S
- Sony Electronics Inc.

#### Complete Vision Systems

- Cognex Corporation
- ISRA Vision Systems
- Tordivel AS
- Vitronic Machine Vision

## References

- Beattie, RJ, Cheng, SK and Logue, PS, "The Use of Vision Sensors in Multipass Welding Applications", pp 28-33, The Welding Journal 67(11), November 1988.
- www.machinevisiononline.org
- http://www.qualitydigest.com/oct97/html/machvis.html
- <a href="http://zone.ni.com/devzone/conceptd.nsf/webmain/9F5D44">http://zone.ni.com/devzone/conceptd.nsf/webmain/9F5D44</a>
  <a href="mailto:BDD177005886256FDC007B2C78?opendocument&node">BDD177005886256FDC007B2C78?opendocument&node</a>
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- http://www.machinevisiononline.org/public/articles/Babak
   Habibi\_July03.pdf