

# CS410 Computer Vision

John Mc Donald

Department of Computer Science  
National University of Ireland, Maynooth

Maynooth University Department of Computer Science

## Reading

- [1] **Machine Vision** - Ramesh Jain, Rangachar Kasturi, and Brian G. Schunck. McGraw-Hill, 1995. 0-07-113407-7
- [2] **Computer Vision: A Modern Approach** David A. Forsyth and Jean Ponce Prentice Hall, 2003. ISBN 0-12-085198-1.
- [3] **Machine Vision** - David Vernon. Prentice Hall.
- [4] **A Guided Tour of Computer Vision** - Vishvjit Nalwa. Addison-Wesley.
- [5] **Introductory Techniques for 3-D Computer Vision** - Emanuele Trucco and Alessandro Verri. Prentice Hall.
- [6] **Robot Vision** - Berthold K.P. Horn. MIT Press.

Maynooth University Department of Computer Science



Maynooth University Department of Computer Science

## Why Study Computer Vision?

### Esoteric Argument:-

- All naturally-occurring intelligent life-forms exhibit an ability to interact with and manipulate their environment in a coherent and stable manner.
- This interaction is facilitated by on-going intelligent interplay between perception and motion control (i.e. action).

Maynooth University Department of Computer Science

No:7

### Pragmatic Argument:-

Most manufacturers are concerned with the cosmetic integrity of their product; customers quite often equate quality of appearance with functional quality.

It is highly desirable therefore that :

- the product is checked visually before packaging and shipping,
- the Inspection Process be automated and effected without human intervention.

Maynooth University Department of Computer Science

No:8

## What is Computer Vision ?

The world we live in, and experience, is filled with an endless variety of objects and **it is by looking and seeing that we come to know what is where** in this world.

Vision is a means to an end: to know the world by looking

Maynooth University Department of Computer Science

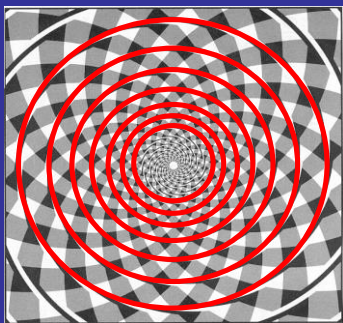
No:9

Computer Vision is exactly the same except that the medium by which the knowledge is gained is now a computational instrument rather than the brain of some living creature.

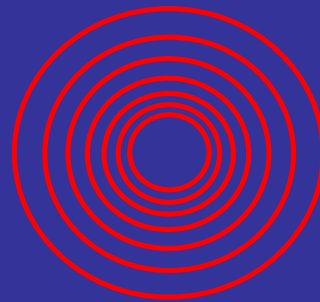
So should we concentrate our efforts on simulating the human visual system?

- Firstly, what we know of the human visual system is extremely limited, the only part of which is well understood being the eye itself (a subject we will revisit)
- Secondly, even though we have great faith in the human visual system, as we will see over the next few slides, it is a system which is far from infallible.

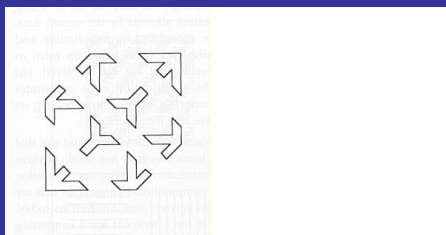
### Visual Illusions: Fraser's Spiral



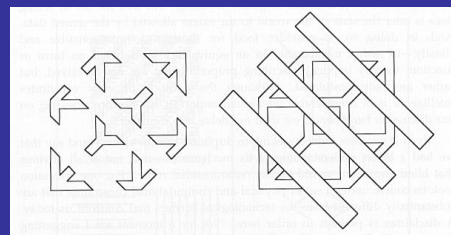
### Fraser's Spiral

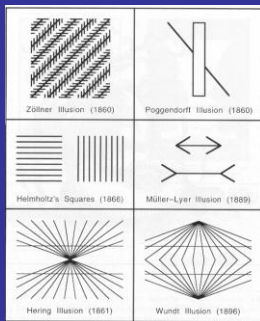


### Kanizsa's Cube



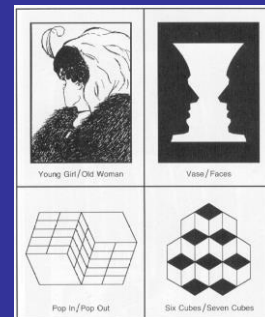
### Kanizsa's Cube





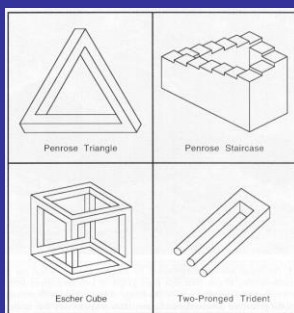
Maynooth University Department of Computer Science

## Visual Ambiguities

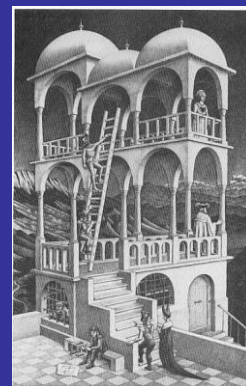


Maynooth University Department of Computer Science

## Visual Inconsistencies



Maynooth University Department of Computer Science



Maynooth University Department of Computer Science

- All the examples so far may seem contrived, and their success is dependent on their lack of realism
- Don't take too much consolation in this point, for illusions, ambiguities, and inconsistencies do arise in two dimensional visual projections of the *real world*

Maynooth University Department of Computer Science



Maynooth University Department of Computer Science

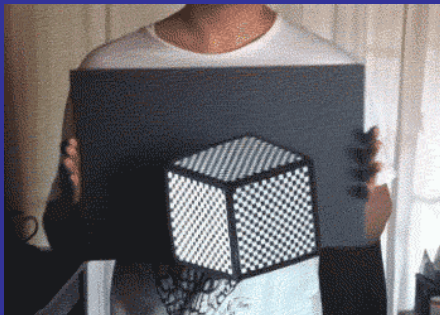


Maynooth University Department of Computer Science



[www.scifun.ed.ac.uk](http://www.scifun.ed.ac.uk)

Maynooth University Department of Computer Science



Source: unknown

Maynooth University Department of Computer Science

## Conclusions??

- "Every image is the image of a thing merely for him/her who knows how to read it, and who is enabled by the aid of the image to form an idea of the thing" Herman von Helmholtz 1910
- Whereas we are quite forgiving when it comes to performance of humans, we are not quite as charitable when it comes to the performance of machines.

Maynooth University Department of Computer Science

## Computer Vision: Why is it so difficult?

Computer Vision is concerned with the physical structure of a three-dimensional world by the automatic analysis of images of that world.

Isn't this just the inverse to computer graphics?

Maynooth University Department of Computer Science

No:26

The image is two-dimensional. We inevitably lose information in the projection process, *i.e.*, in passing from a 3D world to a 2D image.

The images are digital images :

- they are a discrete representation (*i.e.* they have distinct values at regularly sampled points)
- they are a quantised representation

(*i.e.* each value is an integer value)

Mathematicians would refer to vision as an ill-posed problem

Computer Graphics is not!

Maynooth University Department of Computer Science

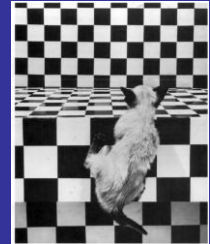
No:27

## Using Knowledge

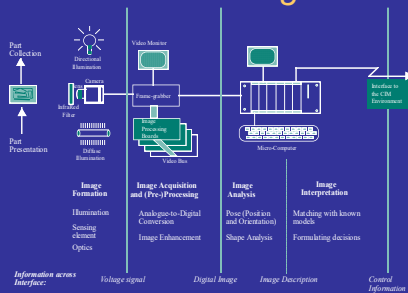
- So how do we get around this problem?
- Well even though the image does not contain enough information to reconstruct the scene..
- If we couple the information in the image with our knowledge (or assumptions) about the world we can then sufficiently constrain the situation to arrive at a single (or small number) of solutions.

## Cues

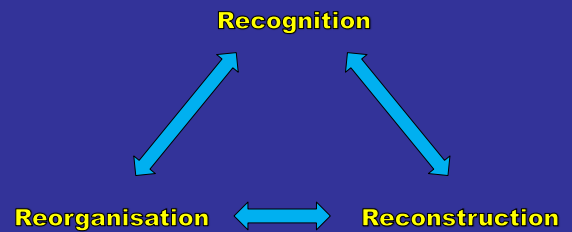
- Image formation
- Image features
- Shading
- Occlusion
- Texture
- Motion
- Multiple view geometry



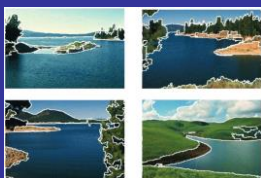
## Using Knowledge



## Another view: The 3 R's



## Reorganisation



Comaniciu, D.; Meer, P., "Mean shift: a robust approach toward feature space analysis," PAMI, 24(5), 2002.



Achanta et al., SLIC Superpixels Compared to State-of-the-art Superpixel Methods, PAMI, 34(11), 2012.

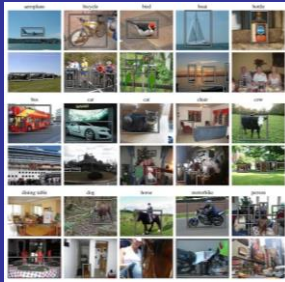
## Recognition



Everingham et al., The PASCAL Visual Object Classes (VOC) Challenge International Journal of Computer Vision, 88(2), 303-338, 2010



## Recognition



Everingham et al., The PASCAL Visual Object Classes (VOC) Challenge International Journal of Computer Vision, 88(2), 303-338, 2010

Maynooth University Department of Computer Science

## Recognition

VOC Challenge:  
~20K Images  
20 Categories

ILSVR Challenge:  
~1.4M Images  
1000 Categories



Everingham et al., The PASCAL Visual Object Classes (VOC) Challenge International Journal of Computer Vision, 88(2), 303-338, 2010



Russakovsky et al., ImageNet Large Scale Visual Recognition Challenge, 115(3), 211-252, 2015

Maynooth University Department of Computer Science

The New York Times

Modern Technology  
Unlocks Secrets of a  
Damaged Biblical Scroll

Police Climate Deal Means  
Minimum as 20 More  
Nations Sign On

Rescuees  
In the Wild, Goldfish Turn  
From Pet to Pest

Music for All: A  
Campaigner Aims to  
Release Carl Segner's  
Golden Record

PHILIPS  
The Tech Can Improve  
Doctor-Patient  
Communication

SCIENCE

### A Learning Advance in Artificial Intelligence Rivals Human Abilities

By JOHN MARKOFF DEC. 10, 2015

Computer researchers reported artificial-intelligence advances on Thursday that surpassed human capabilities for a narrow set of vision-related tasks.

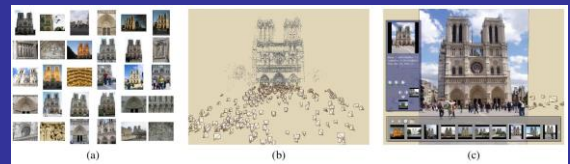
The improvements are noteworthy because so-called machine-vision systems are becoming commonplace in many aspects of life, including car-safety systems that detect pedestrians and bicyclists, as well as in video game controls, Internet search and factory robots.

Humans and machines were given an image of a novel character (represented along each grid) and then asked to copy its features later.

Researchers at the Massachusetts Institute of Technology, New York University and the University of Toronto

INTERCOM  
Live chat is broken.  
See how we fixed it.  
LEARN MORE

## Reconstruction



Noah Snavely, Steven M. Seitz, Richard Szeliski, "Photo tourism: Exploring photo collections in 3D," ACM Transactions on Graphics (SIGGRAPH Proceedings), 25(3), 2006, 835-846.

Maynooth University Department of Computer Science

## Photo Tourism Exploring photo collections in 3D

Noah Snavely Steven M. Seitz Richard Szeliski  
University of Washington Microsoft Research

SIGGRAPH 2006

## Real-time Dense Visual Mapping



[Whelan, Kaess, Fallon, Johansson, Leonard, McDonald, RGBD '12.]

Maynooth University Department of Computer Science

## Application Areas



Microsoft HoloLens



DAQRI Smart Helmet



DARPA Robotics Challenge



Dyson 360 Eye Vacuum



Google Project Tango



Google Self-Driving Car Project

Maynooth University Department of Computer Science

## Continuous Humanoid Locomotion Enabled by Online Footstep Planning and Stereo Fusion



**DARPA Robotics Challenge Team**

[drc.mit.edu](http://drc.mit.edu)

Maynooth University Department of Computer Science [Fallon et al.]

Terrain segmentation

Maynooth University Department of Computer Science

[Fallon et al.]

## What's ahead?

- Camera modelling and calibration
- Binary Image Processing
- Image Filtering
- Feature Detection
- Image Analysis



Maynooth University Department of Computer Science