

# Vision Intelligence III: Visual Object Computations

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# Table of Contents

- ① Visual Features
- ② Object Segmentation
- ③ Object Detection
- ④ Object Recognition
- ⑤ Object Tracking

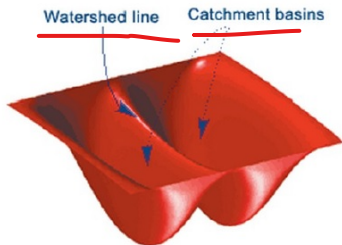
## Visual Features

- Pixel colour: Binary, pseudo, real colour, etc.
- Histogram: Color histogram, vector histogram, etc.
- Texture: Gabor texture, Tamura texture, GLCM, etc.
- Edge: Canny( $5 \times 5$ ), Sobel ( $3 \times 3$ ), Robert ( $2 \times 2$ ), etc.
- Gradient: Horizontal, vertical, both, etc.
- Local features: SIFT, HOG, etc.
- . . . . .

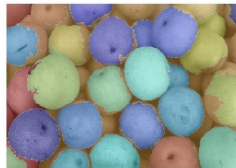
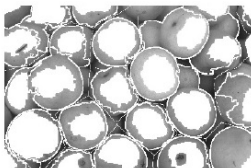
## Object Segmentation

- Thresholding ✓
- Clustering methods ✓
- Histogram-based methods ✓
- Edge detection ✓
- Region growing methods ✓
- Watershed segmentation ✓
- . . . . .

## MALAB: Watershed Segmentation

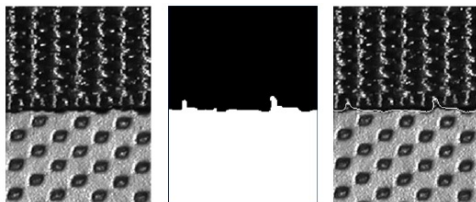


## MATLAB: Watershed Segmentation



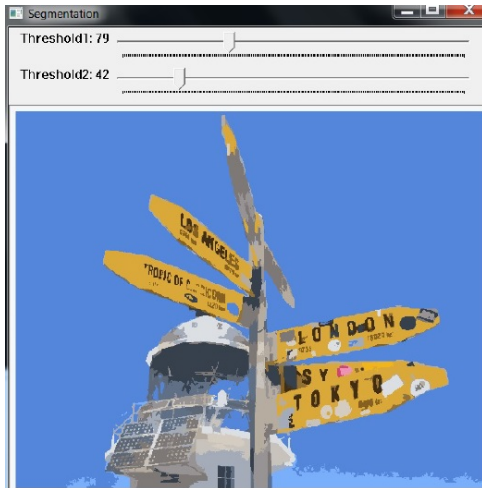
- Use gradient magnitude as segmentation function;
- Mark foreground objects;
- Compute background markers.

## MATLAB: Texture Image Segmentation



- Create a rough mask for the texture;
- Use the rough mask to segment the top texture;
- Display segmentation result.

## OpenCV: Image Segmentation





# Vision Intelligence III: Visual Object Computations

Questions?



## Object Detection

- Given positive and negative samples (well selected)
- Supervised learning provides a natural framework for studying object recognition.
- Train a function that can map novel images to one of labels (e.g., face or non-face).

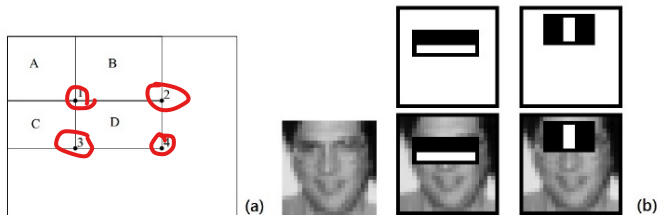


## OpenCV: Face Detection - Training Set



## OpenCV: Viola & Jones Face Detection

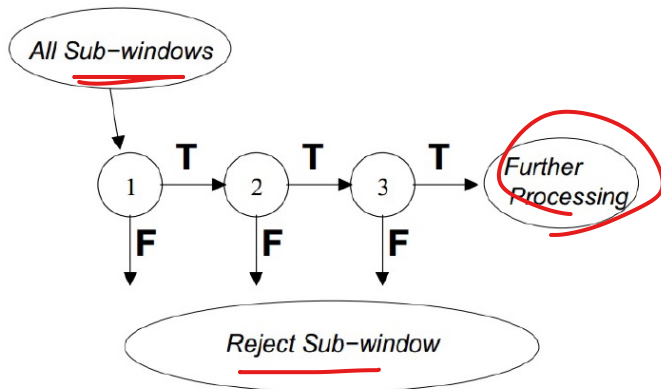
- Haar Feature Selection
- Creating Integral Image
- AdaBoost Training algorithm
- Cascaded Classifiers



Paul Viola and Michael Jones (2001) Rapid Object Detection using a Boosted Cascade of Simple Features. CVPR 2001.

# Vision Intelligence III: Visual Object Detection

## OpenCV: Viola & Jones Face Detection (Cascade Classifier)



Paul Viola and Michael Jones (2001) Rapid Object Detection using a Boosted Cascade of Simple Features. CVPR 2001.

## OpenCV: Viola & Jones Face Detection (Advantage)

- Extremely fast feature computation
- Efficient feature selection
- Scale and location invariant detector
- Detect other types of objects (e.g., cars, hands, etc.).

## OpenCV: Viola & Jones Face Detection (Disadvantage)

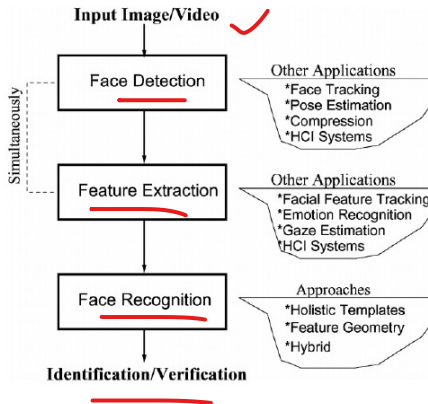
- Detector is most effective only on frontal images of a face.
- It can hardly cope with 45° face rotation both around vertical and horizontal axes.
- Sensitive to lighting conditions

# Vision Intelligence III: Visual Object Computations

Questions?



## OpenCV: Face Detection and Recognition System

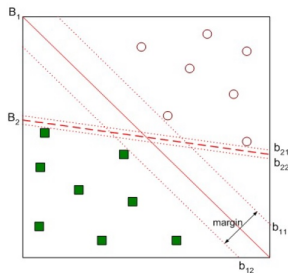
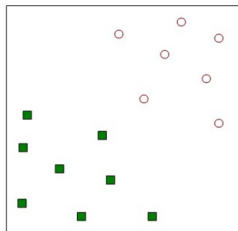


W. Zhao, et al. Face recognition: a literature survey, ACM Computing Surveys, Vol. 35, No. 4, 2003, pp. 399–458.



## Support Vector Machine

- Problem: Given a vector dataset, find a linear hyperplane (decision boundary) that will separate the data.
- Solution: Find a hyperplane maximizes the margin ( $B_1$  is better than  $B_2$ ),
- SVM Readings:  
<http://www.csie.ntu.edu.tw/~cjlin/libsvm/>



## WEKA: Computational Tool



Machine Learning Group at the University of Waikato

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[Software](#)

[Book](#)

[Courses](#)

[Publications](#)

[People](#)

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### Weka 3: Data Mining Software in Java

Weka is a collection of machine learning algorithms for data mining tasks. The algorithms can either be applied directly to a dataset or called from your own Java code. Weka contains tools for data pre-processing, classification, regression, clustering, association rules, and visualization. It is also well-suited for developing new machine learning schemes.

Found only on the islands of New Zealand, the Weka is a flightless bird with an inquisitive nature. The name is pronounced like **this**, and the bird sounds like **this**.

Weka is open source software issued under the **GNU General Public License**.

We have put together several free online courses that teach machine learning and data mining using Weka. Check out the **website for the courses** for details on when and how to enrol. The videos for the courses are available **on Youtube**.

Yes, It is possible to apply Weka to **big data**!

#### Getting started

- [Requirements](#)
- [Download](#)
- [Documentation](#)
- [FAQ](#)
- [Getting Help](#)

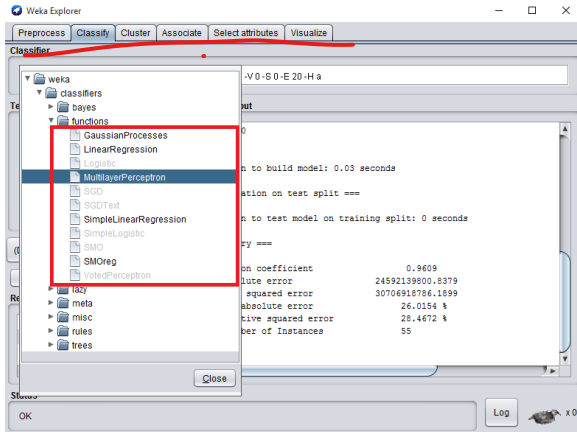
#### Further Information

- [Citing Weka](#)
- [Datasets](#)
- [Related Projects](#)
- [Miscellaneous Code](#)
- [Other Literature](#)

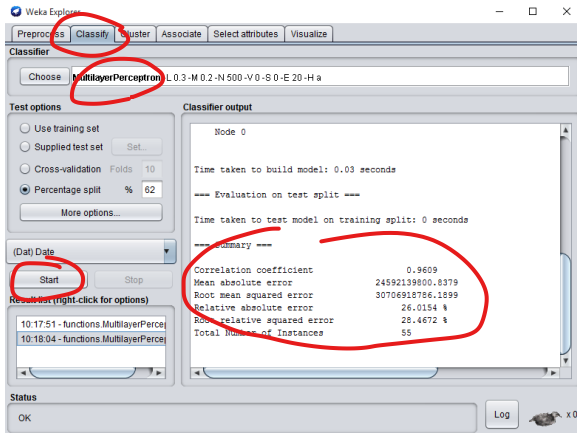
#### Developers

- [Development](#)
- [History](#)
- [Subversion](#)
- [Contributors](#)
- [Commercial licenses](#)

## WEKA: Computational Tool



## WEKA: Computational Tool



## WEKA: Computational Tool

```
% 5. Number of Instances: 150 (50 in each of three classes)
% 6. Number of Attributes: 4 numeric, predictive attributes and the class
% 7. Attribute Information:
%   1. sepal length in cm
%   2. sepal width in cm
%   3. petal length in cm
%   4. petal width in cm
%   5. class:
%       -- Iris Setosa
%       -- Iris Versicolour
%       -- Iris Virginica
% 8. Missing Attribute Values: None
% Summary Statistics:
%      Min  Max   Mean    SD   Class Correlation
%  sepal length: 4.3  7.9   5.84  0.83    0.7826
%  sepal width: 2.0  4.4   3.05  0.43   -0.4194
%  petal length: 1.0  6.9   3.76  1.76    0.9490 (high!)
%  petal width: 0.1  2.5   1.20  0.76    0.9565 (high!)
% 9. Class Distribution: 33.3% for each of 3 classes.
```

```
@RELATION iris
@ATTRIBUTE sepallength REAL
@ATTRIBUTE sepalwidth REAL
@ATTRIBUTE petallength REAL
@ATTRIBUTE petalwidth REAL
@ATTRIBUTE class {Iris-setosa,Iris-versicolor,Iris-virginica}
@DATA
5.1,3.5,1.4,0.2,Iris-setosa
4.9,3.0,1.4,0.2,Iris-setosa
```

## Evaluations of Empirical Algorithms

- Training set ✓
- Test set ✓
- Ground truth ✓
- Precision:  $p = \frac{TP}{TP+FP}$  ✓
- Recall:  $r = \frac{TP}{TP+FN}$  ✓
- F-measure:  $F = \frac{2 \cdot p \cdot r}{p+r}$  ✓
- G-measure:  $G = \sqrt{p \cdot r}$  ✓

**Note:** F-measure is the harmonic mean (average) of recall and precision, G-measure is the geometric mean (average).

Precision?



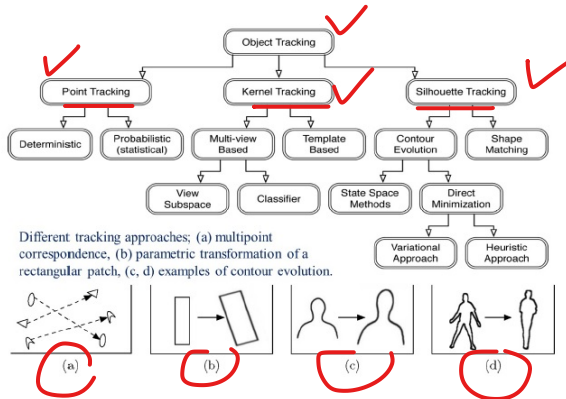
# Vision Intelligence III: Visual Object Computations

Questions?



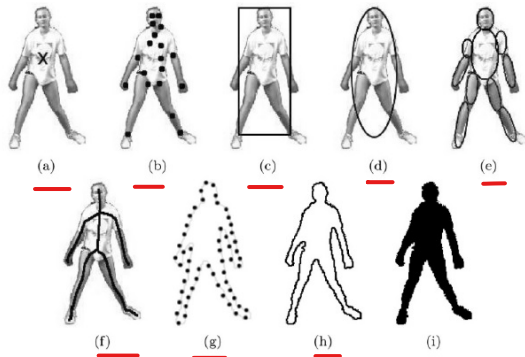


## Object Tracking (Demo)



A. Yilmaz, Object Tracking: A Survey. ACM Computing Surveys, Vol. 38, No. 4, Article 13, 2006.

## Object Tracking



**Fig. 1.** Object representations. (a) Centroid, (b) multiple points, (c) rectangular patch, (d) elliptical patch, (e) part-based multiple patches, (f) object skeleton, (g) complete object contour, (h) control points on object contour, (i) object silhouette.

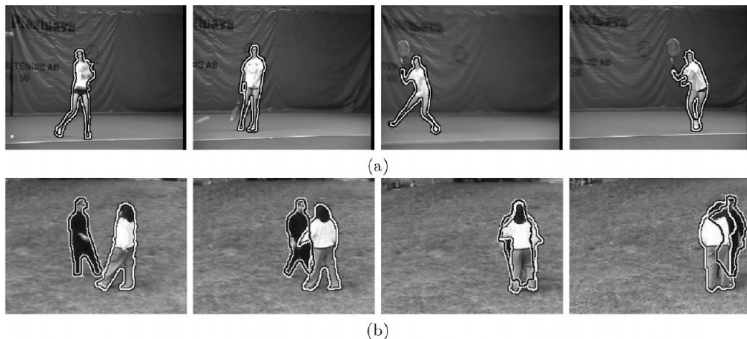
## Car Tracking Using Level Set



Car tracking using the level sets method

A. Yilmaz, et al. (2006) Object Tracking: A Survey. ACM Computing Surveys, Vol. 38, No. 4, Article 13.

## Contour Track



Contour tracking results. (a) tracking of a tennis player, (b) tracking in presence of occlusion

A. Yilmaz, et al. (2006) Object Tracking: A Survey. ACM Computing Surveys, Vol. 38, No. 4, Article 13.

# Vision Intelligence III: Visual Object Computations

Questions?



## Learning Objectives

- Explain how AI theories could be used in visual analytics.
- Evaluate the complexities involved in the automatic extraction of knowledge encoded in free texts and images.