

## Crowd Detection and Analysis summary

A.Tsamoglou, Prof. Ioannis Pitas Aristotle University of Thessaloniki pitas@csd.auth.gr www.aiia.csd.auth.gr Version 2.1





#### **Crowd Analysis**

- Object Detection
- Pedestrian Detection
- Crowd Detection
- Crowd Counting/Density
- Crowd Tracking
- Crowd Behavior Analysis





#### **Crowd Analysis**

What is Crowd Analysis?

- Crowd analysis is the practice of interpreting data on the natural movement of groups or objects.
- Masses of bodies, particularly humans, are the subjects of these crowd tracking analyses that include how a particular crowd moves and when a movement pattern changes.





#### **Crowd Analysis**

 Researchers use the data to predict future crowd movement, crowd density, and plan responses to potential events such as those that require evacuation routes.





#### **Pedestrian Detection**

- Pedestrian detection is a class of Object detection which we need to detect only person class.
- Pedestrian Detection is in a good level in practice but the problem starts when we have crowd situations









#### **Pedestrian Detection**

Pedestrian Detection Challenges:

- Various style of clothing in appearanceDifferent possible articulations
- The presence of occluding accessories
- Frequent occlusion between pedestrians



#### **Crowd Detection**



#### What is crowd?

- The crowd is a large group of people that are gathered or considered together . A crowd may be definable through a common purpose or set of emotions:
  - a political rally ,
  - a sports event,
  - during looting
  - many people going about their business in a busy area.





#### **Crowd Detection**



- Why Person Detection is Challenging:
  - Limited resolution of images
  - Variation in clothing
  - Pose
  - Illumination



#### **Crowd Detection**

- Why Person Detection is Challenging:
  - Crowd situation
  - Noise in images
  - Not good captures
  - Heavy proccess, need quick decision (Drones)



ML

# Crowd detection using commentation commentation

- The crowd detection problem is effectively approached using semantic image segmentation.
- If only two object classes are considered (i.e., crowd, no-crowd), semantic image segmentation corresponds to crowd detection.



#### **Crowd detection using** semantic image segmentation



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#### **Crowd detection using** semantic image segmentation





# Crowd detection using **CML** semantic image segmentation



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#### **Crowd Counting/Density**



Crowd counting/density is the problem of estimating the number of people in a still image or a video. It has drawn a lot of attention due to the need for solving this problem in many real-world applications such as video surveillance, traffic control, and emergency management.







#### **Crowd Counting**

#### Crowd counting can be a byproduct of face detection.







#### **Crowd Counting**

- Crowd counting can also be formulated as a density map estimation problem.
- A crowd density map also provides location information about the crowd distribution.





Detecting and tracking people in crowded scenes is a crucial component for a wide range of applications including:

- surveillance,
- group behavior modeling,
- crowd disaster prevention.



## VML

#### **Crowd Tracking**

Tracking individuals in a high density crowd scene is challenging for a number of reasons:

- the number of pixels on an object decreases with the increasing density of the object
- constant interaction among the individuals in a crowd makes it hard to discern individuals from one another.





- occlusions caused by interactive object interactions result in the loss of observation of the target object.
- the mechanics of a human crowd is complex as it exhibits goal-directed dynamics and psychological characteristics which in turn influence how an individual person will behave in a crowd.





Crowd Model:

**Energy Formulation:** 

- First we assume to have a confidence score s(p) of a person detector for each location  $p_i$ ,  $i = 1 \dots N$  in an image.
- we are given a person density, D(p<sub>i</sub>) estimated in a window of size σ at each location p<sub>i</sub>.















#### **Crowd Behavior Analysis**

• The behavioral analysis of a crowd is an important topic of research in computer vision. In general, the temporal information is used to estimate the behavior of a crowd in a given enviroment.



#### **Crowd Behavior Analysis**



- Why simulate crowd movement and evacuations?
  - The experimental investigation of crowd movement and especially emergency egress are limited by:
    - Practical,
    - Ethical,
    - Financial,
    - Logical constraints.



#### **Crowd Behavior Analysis**







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#### Thank you very much for your attention!

### More material in http://icarus.csd.auth.gr/cvml-web-lecture-series/

### Contact: Prof. I. Pitas pitas@csd.auth.gr

