

Automatic Classification, Counting and Modelling of Non-Motorized Traffic

... with Video Analytics

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Why bother?

- Pedestrian and Bicycle **volumes** are **key performance figures** for evaluating measures
- Problem: Currently **few available data** of non-motorized traffic
- Non-motorized traffic is **hard to measure** automatically

- **Video analytics has potential ...**
 - can cover large areas
 - rich data to classify objects
 - relatively easy installation and setup



... but there remain Big Challenges

- Environmental Conditions



- Dense / Complex Scenarios



Contents: 3 Video Analytics Approaches:

- 1 Embedded Visual 3D Sensor** for Real-Time Classification and Counting



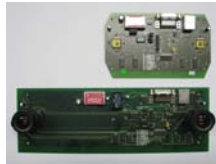
- 2 Automatic Pedestrian Path Modeling** based on **Individual People Tracks**



- 3 Automatic Pedestrian Path Modeling** based on **Optical Flow**

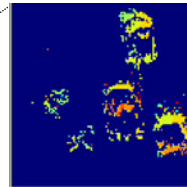


Embedded Visual 3D Sensor



Stereo Sensor

■ far
■ near



3D-raw Data



Control Video for annotation



Class	Sample	Correctly classified	Classification rate [%]
Riding cyclist	$N = 82$	82	100
Pedestrian	$N = 26$	24	92

- **Pending: Long-term test data collection**
- **Weather-Proof prototype for real-time processing ready by end of 2009**

Vision-Based People Tracking

- Individual People Tracks are based on **Pedestrian Detectors**
- Pedestrian Detectors classify **rectangular windows** into pedestrian/non-pedestrian class
- Requires 10000s of training examples!
- **Breaks down for dense scenarios** due to occlusions



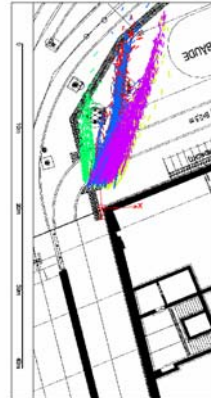
Clustering Trajectories into Groups

- Our approach can cope with **broken trajectories**
- Our approach can **automatically select the number of clusters**



Trajectories of 1 day **automatically** clustered into **5 major groups**

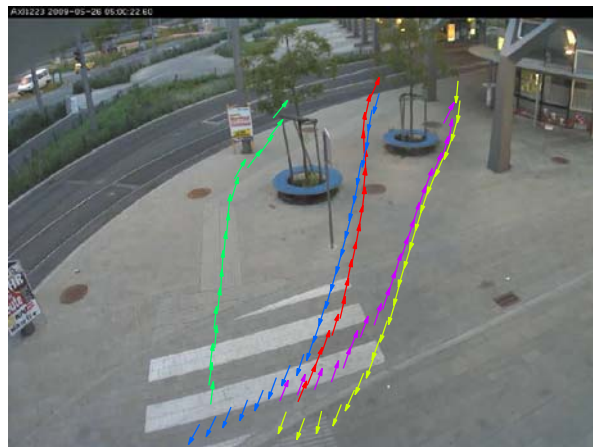
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Visualization of ground plane
(after camera calibration)

7

Modeling Paths as Mean Trajectories



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8

Our group works on 3 Video Analytics Approaches:

1 **Embedded Visual 3D Sensor** for Real-Time Classification and Counting



2 Automatic Pedestrian Path Modeling based on **Individual People Tracks**



3 Automatic Pedestrian Path Modeling based on **Optical Flow**

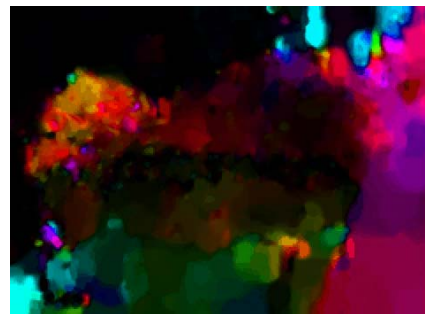


Optical Flow

- Optical Flow models motion of pixels between consecutive frames



Crowded Video



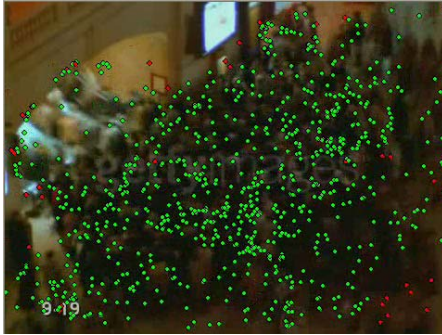
Optical Flow



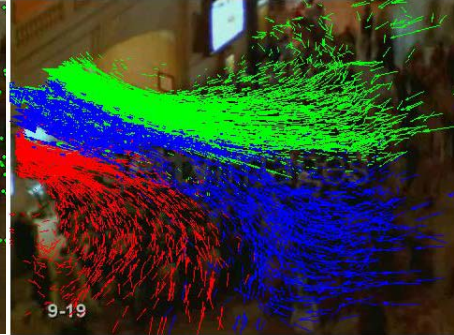
color code for detected motion direction

Clustering of Particle Trajectories

- Crowd is modeled as a set of interacting particles



Particles moving in optical flow



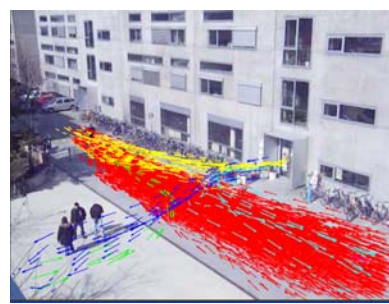
Particle trajectories **automatically clustered into 3 groups**

Clustering of Particle Trajectories (2)

- Crowd is modeled a set of interacting particles

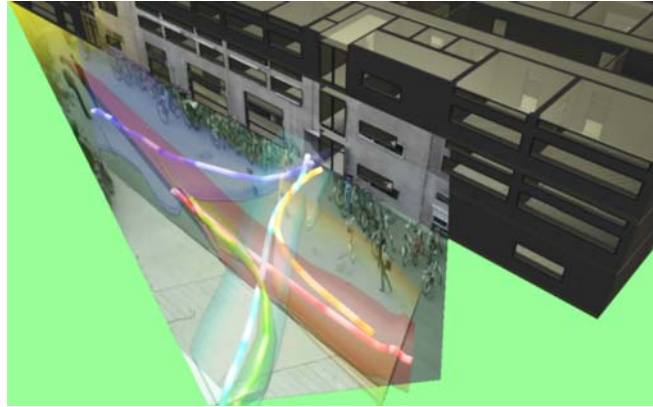


Crowded Video (Acting at University)



Particle Trajectories **automatically clustered into 5 groups**

Path models combined with 3D Model

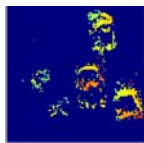

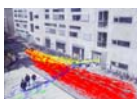


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13

Conclusion

Approach	Main Advantages	Open Issues
Embedded 3D Sensor 	<ul style="list-style-type: none"> ▪ Real-Time counting of pedestrians and cyclists ▪ Embedded Device ▪ Robust to weather conditions 	<ul style="list-style-type: none"> ▪ Works only good in constrained field of view (best with top view) ▪ Umbrellas still pose problems ▪ Modeling of long-term data
Individual Path Modeling 	<ul style="list-style-type: none"> ▪ Pedestrian path modeling in mixed scenarios ▪ Robust against weather conditions 	<ul style="list-style-type: none"> ▪ Classifying cyclists (sometimes based on velocity) ▪ Porting tracking to a smart camera
Particle Path Modeling 	<ul style="list-style-type: none"> ▪ Pedestrian path modeling in dense crowds 	<ul style="list-style-type: none"> ▪ Optical flow computing is still bottleneck ▪ Tackling Motion not from Pedestrians?

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14