

# interactive



Accident avoidance by active intervention for Intelligent Vehicles

[www.interactIVe-ip.eu](http://www.interactIVe-ip.eu)

Real time monocular camera based pedestrian  
recognition for object based fusion & confirmation

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**interactIVe Final Event**

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# Pedestrian detection module | Task description

- Task

- Identify pedestrians in video images  
(experimental module, part of Perception advanced research)

- Challenges

- Real-time capable for limited hardware resources
- Monocular sensor
- Moving vehicle
- Low false alarm rates required
- Must work under challenging environmental, weather and lighting conditions
- Large variation in each class
- Many of these aspects are not considered in the scientific literature regarding pedestrian recognition
  - Find suitable perception methods as input for advanced fusion systems



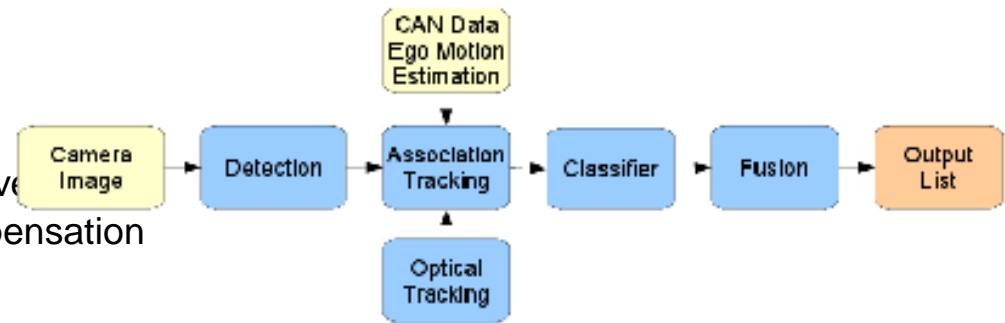
# Pedestrian detection module | System overview

- **Detector**

- Provides pedestrian candidates: position, size
- Mean-Shift clusters candidates with similar size and position

- **Tracker**

- Estimates target position and velocity
- Can data for ego motion compensation
- Fusion with optical tracking



- **Classifier**

- Strong classifier rejects false track hypothesis

- **Time-fusion**

- Filters fluctuations in Classification results over time

# Pedestrian detection module | Approach

- Processing the image at every reasonable position and scale (Sliding window approach)
  - Efficient cascaded structure (early rejection of areas without structure)
  - Detector creation from sample images
  - Appearance learning on automatically selected features
  - Provides position, scale and confidence estimates
- Processing time
  - 6ms – 9ms on PC
  - Real time capability on specialized embedded systems
  - Much faster compared to similar systems in literature



Detector raw results: **yellow BB** high conf.  
**grey BB** low conf.

# Pedestrian detection module | Results

vel: 3.6 m/s (13 km/h) yaw: -15.5(looptime: 32 mframe: 48787/5 time: 54200.58) **LIDAR: ERROR**



# Module chain

- Tracker

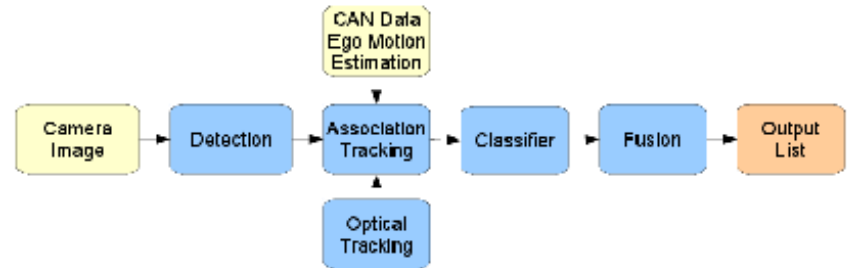
- Bank of Extended Kalman filters
- Estimates position & velocity

- Track based classifier

- BOW to achieve shift and position tolerance

- Temporal fusion

- Temporal delay neural network used to fuse detections and classifications
- Low pass filter



# Pedestrian system performance (2/2)

vel: 3.6 m/s (13 km/h) yaw: -11.6(looptime: 33 mframe: 48798/7 time: 54200.94 RADAR: NONE

ID: 167 ID: 168 conf: 0.57

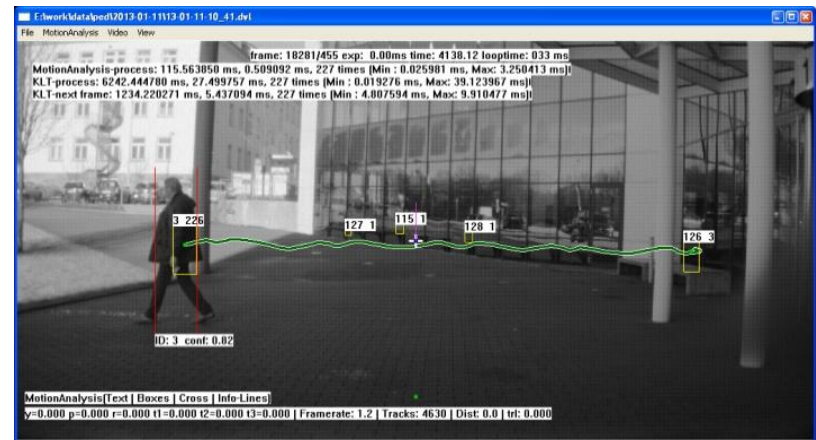
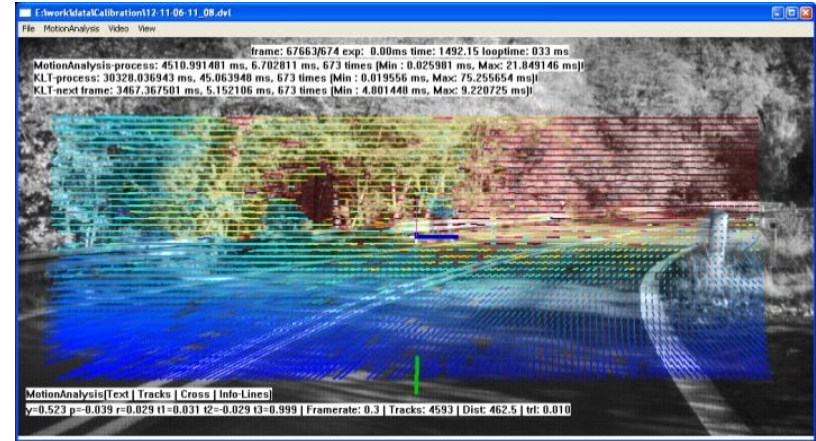


# Future work

- Use optical flow to improve pedestrian recognition
  - Ego motion and distance estimation
  - Ground plane estimation
  - Foreground background separation
- Use optical tracking of pedestrians
- Refine detection bounding boxes
- Collect more training data

## Lessons learned

- Reliable pedestrian detection requires a combination of multiple techniques and sensor fusion



# Acknowledgments

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Thank you.

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SEVENTH FRAMEWORK  
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