# Intensity and Depth Data Integration for Vehicle Detection

Dimitrios Kanoulas<sup>[1]</sup> dkanou@ccs.neu.edu

Alexandros Makris<sup>[2]</sup> alexandros.makris@inria.fr

Mathias Perrollaz<sup>[2]</sup> mathias.perrollaz@inria.fr Christian Laugier<sup>[2]</sup> christian.laugier@inria.fr







## **Vehicle Detection Problem**

Original Scene

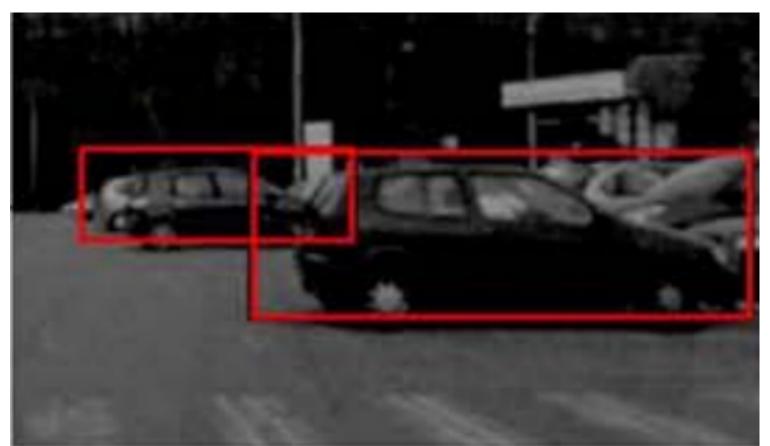


Lexus LS600h TYZX Stereo Camera [500x312 px]





3D Vehicle Detections/Localizations



Purpose Driver Assistance in (Semi) **Autonomous Driving Systems:** 

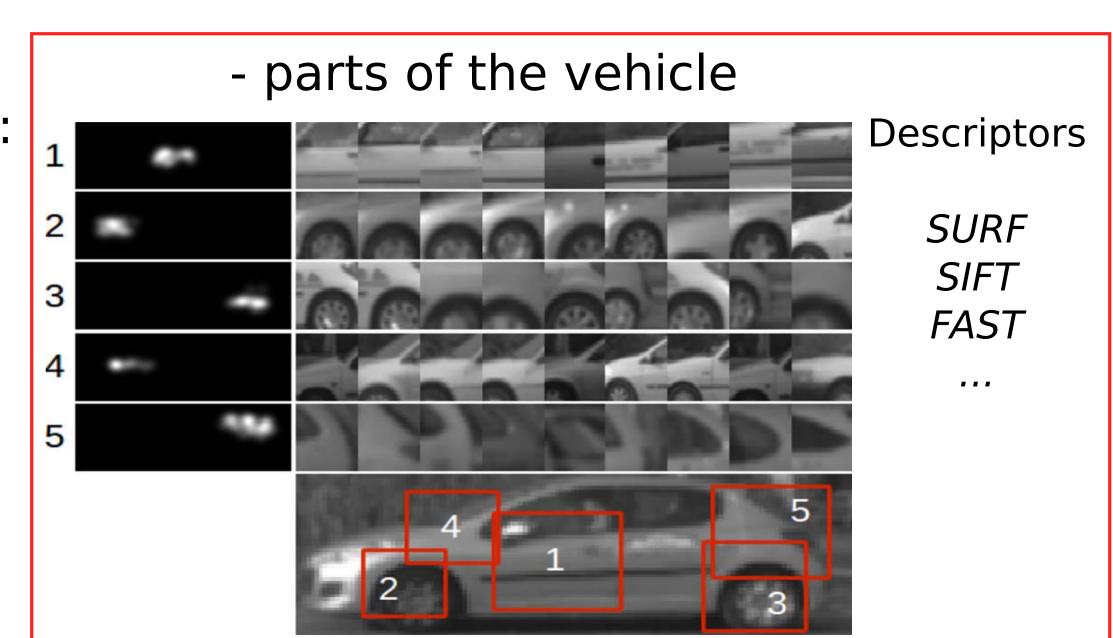
- warn the driver
- automatically initiate appropriate protective measure
- Challenges various viewpoints & scales
  - partial occlusions
  - moving sensor
  - large illumination variances real-time constraints
- different possible vehicle appearences
- cluttered background

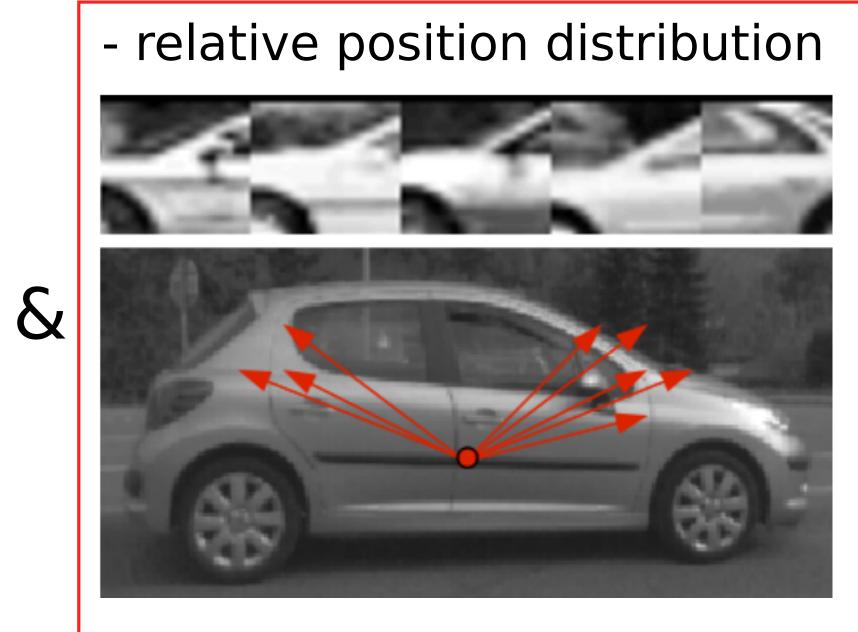
## **Vehicle Detection Process** [4,5]

## Off-Line Learning

Codebooks include the set of clusters representing:



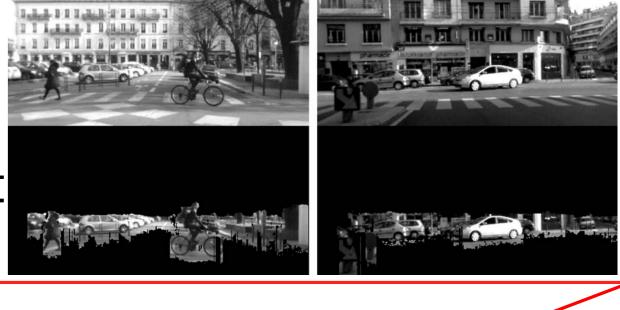


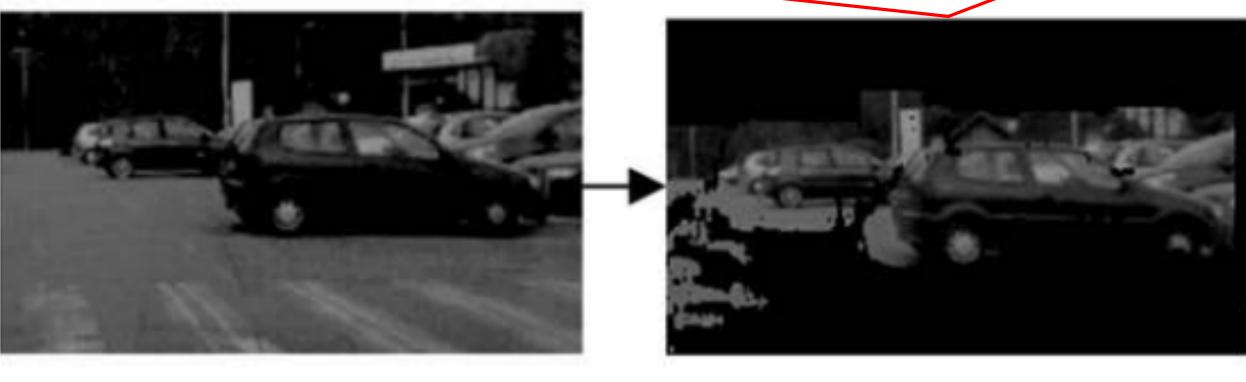


#### On-Line Detection

### Filters out:

- road surface
- objects over a predefined height





Original Image

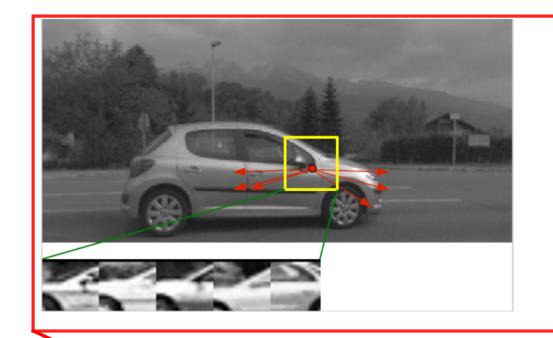
Stereo Mask

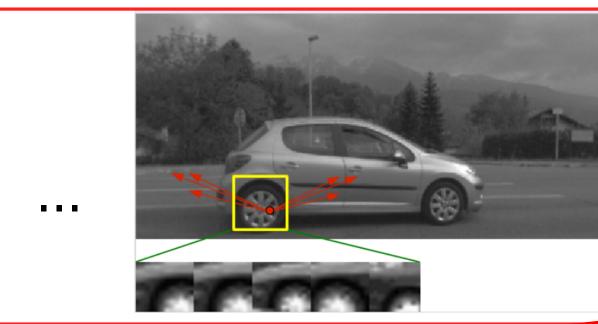
# **Camera Inputs**

Intensity Features 1

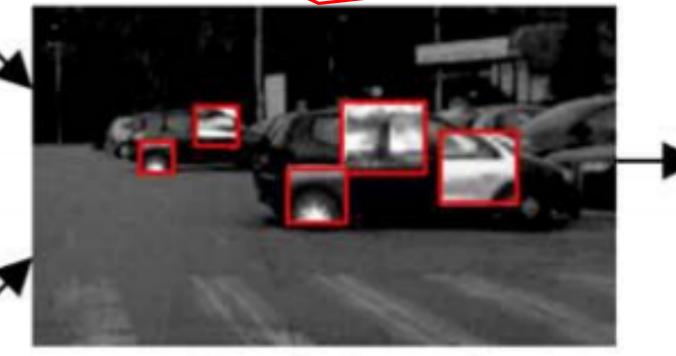








**Hough Voting** 



Codebook Matching

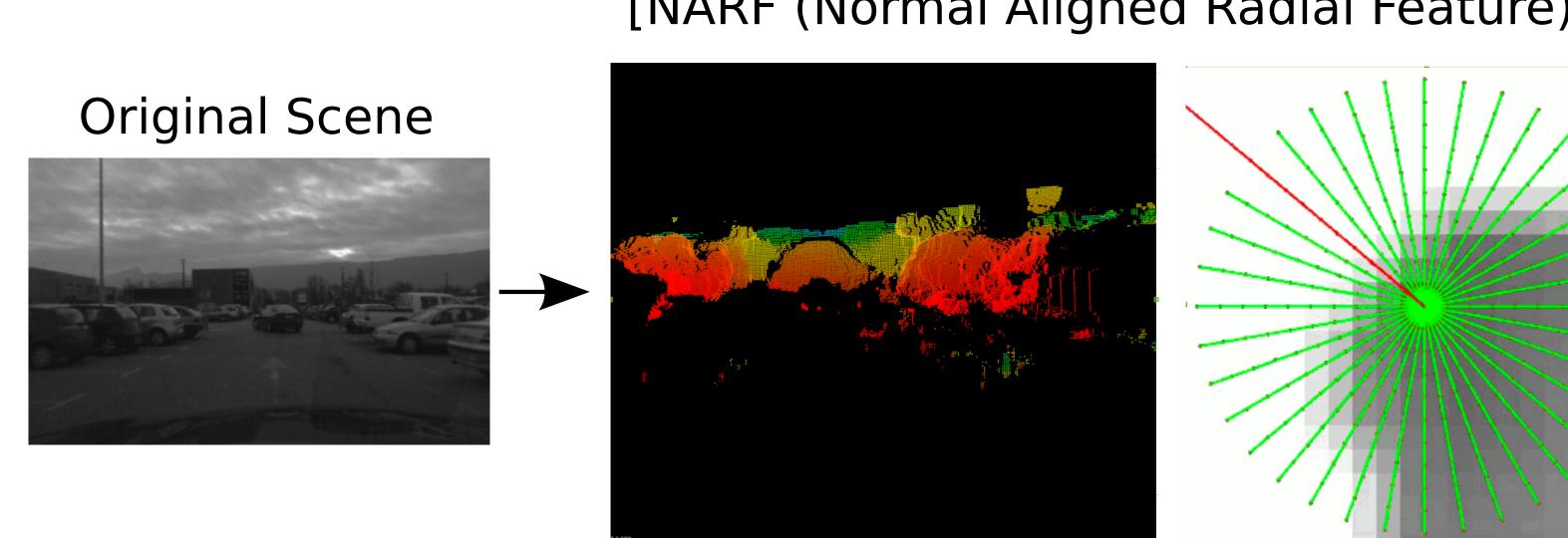


Detections

Depth Features [2,3]

# **Depth Features** Sufficient Changes in the Immediate Depth focus on areas that are unique, e.g. car borders

[NARF (Normal Aligned Radial Feature)]



# References

- [1] Leibe, Leonardis, Schiele, "Robust Object Detection with Interleaved Categorization and Segmentation", International Journal of Computer Vision, 2008, 77 (1-3):259-289.
- [2] Alonso, Llorca, Sotelo, Bergasa, de Toro, Nuevo, Ocana, Garrido, "Combination of Feature Extraction Methods for SVM Pedestrian Detection", IEEE Transactions on Intelligent Transportation Systems, 2007, 8(2):292-307.
- [3] Rohrbach, Enzweiler, Gavrila, "High-level Fusion of Depth and Intensity for Pedestrian Classification", DAGM-Symposium, 2009, pg 101–110.
- [4] Makris, Perrollaz, Paromtchik, Laugier, "Integration of Visual and Depth Information for Vehicle Detection", 2011, IROS.
- [5] Makris, Perrollaz, Laugier, "Probabilistic Integration of Intensity and Depth Information for Part-Based Vehicle Detection", IEEE Transactions on Intelligent Transportation Systems, 2013, 14(4):1896-1906.