

## A multi-sensor approach for the protection of vulnerable traffic participants - the PROTECTOR project

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### Abstract

*This paper describes ongoing work in the E.U. project PROTECTOR (Preventive Safety for Unprotected Road User) on the important problem of detecting vulnerable traffic participants from a moving vehicle. We focus on the three sensor technologies that are pursued: laser scanner, radar and video. We discuss their characteristics and present the relevant pattern recognition techniques. First prototype systems have been integrated in our demonstrator vehicles.*

### Keywords

*PROTECTOR, vehicle safety, unprotected road users, pedestrian detection, sensor fusion.*

## I. INTRODUCTION

The large majority of work on sensor-based intelligent vehicles has dealt with issues related to lane detection and vehicle recognition for applications such as advanced cruise controls. Little attention has been given so far to the issue of protecting vulnerable traffic participants. Yet more than 150.000 pedestrians are injured yearly in traffic accidents E.U.-wide [7]. Of these, more than 6000 are killed - children are affected disproportionately.

The European Union fifth-framework project **PROTECTOR** [1] represents the first concerted effort to bring together major vehicle manufacturers, electronic system suppliers, and research and technology partners, in order to develop intelligent systems on-board vehicles for the reduction of the accident rate involving pedestrians, bicyclists and other vulnerable traffic participants. Of interest are sensor-based solutions as well as solutions which rely on communication between vehicles and vulnerable traffic participants that can detect potential hazardous situations ahead of time; this facilitates the use of warning and preventive measures to avoid or minimize the impact of upcoming collisions. The complete list of PROTECTOR partners is given in Table 1.

The initial phase of the PROTECTOR project involved an analysis of relevant accident statistics [7] and a study of user needs [3]. In this paper, we focus on the subsequent sensor processing phase and cover the main three sensor technologies that are pursued within the project: laser scanner (Section 3), radar (Section 4) and video (Section 5).

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Table 1: PROTECTOR partners

## II. LASER SCANNER

The IBEO laser scanner (see Figure 1a) has a field of view of 180° and is mounted in the mid front section of the vehicle. From this position it can detect all relevant objects as shown in Figure 1b. It has a range of up to 40 m onto targets with at least 5% reflectivity and an angular resolution of 0.5°. One scan consists of 360 measured distances, each of which is measured with an accuracy of +/-5 cm (1σ). The scan frequency is 20 Hz which allows to track all objects with high accuracy in both lateral and longitudinal direction. The built-in DSP computer runs the corresponding algorithms for object identification and tracking; it has sufficient computational power to track up to 20 objects in real-time. The scanner is eye-safe with laser class 1.

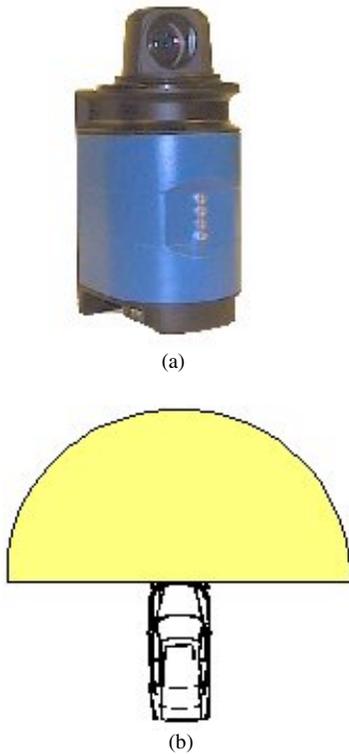
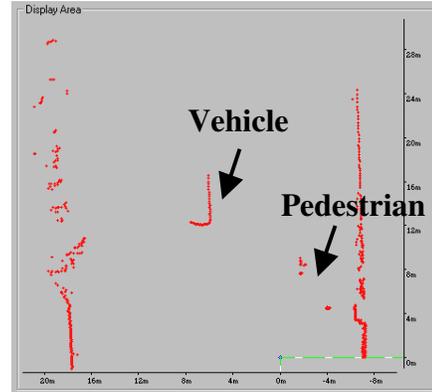


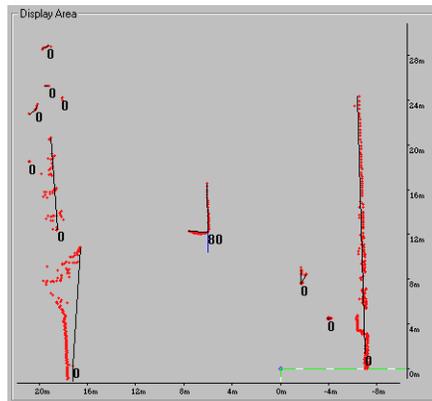
Figure 1: (a) the IBEO laser scanner (b) coverage area (not drawn to scale)

The laser scanner measures the distances to all targets within its scan area. A sample scan is shown in Figure 2a. To the left and right of the road, bushes and walls can be seen. A vehicle is approaching on the left side, and a pedestrian is standing on the right. The object detection and tracking algorithm interprets this scan data and tracks the detected objects through subsequent scans. Object velocity is derived from the positional information of each scan. Figure 2b shows the same scene as in Figure 2a, but with object information. The number shown for each object shows the relative velocity of the object in km/h. The dark straight line at the vehicle is the velocity vector, showing that the object will pass us at a distance of approximately 5 m.

The object classification is an important addition to object tracking. As shown in Figure 2, the laser scanner measures the outline of objects with high resolution and accuracy. From this outline, a classification into different groups like pedestrians, cyclists, cars, trucks etc. can be made. The sensor reports the classification of the object together with the raw data. All object information is sent to the host computer via a standard CAN bus. This information includes the object outline, the relative object velocity in lateral and longitudinal direction, and the classification, together with a confidence measure. For more details, see [2].



(a)



(b)

Figure 2: Raw data from the laser scanner, without (a) and with (b) object labeling

### III. MICROWAVE RADAR

The technical approach of near distance sensing with microwave radar is based on a multi-functional system concept which provides information situation-dependent to different on-board systems. The motivation to use several radar modules placed on strategic positions of the vehicles outer contour is to achieve a seamless awareness system around the car without any blind zones. Figure 3 shows the realized near-distance micro wave radar.

Radar technology provides all necessary requirements to operate in the harsh environment of exterior sensing and can also respect all automotive specifications. It further has the advantage that it can be hidden behind un-shielding materials.



#### IV. VISION

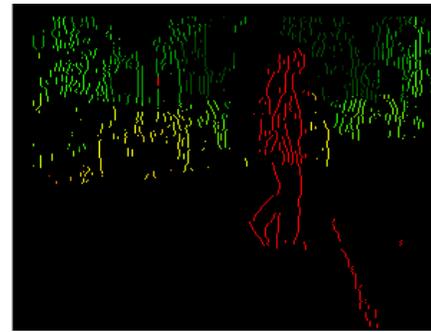
Video sensors have the advantage to provide a high spatial resolution, both horizontally and vertically. Furthermore, many recognition tasks depend on the availability of texture information. Our generic approach to dealing with vulnerable traffic participants involves two steps: object detection followed by object recognition. The purpose of the detection step is to efficiently obtain a region of interest (ROI) in the image that is associated with a potential obstacle. An important contribution to vision-based obstacle detection is provided by stereo vision, which computes depth by triangulation of matched image features in a left and right camera image. See Figure 6. But there are other vision cues as well that can be used to facilitate the detection of vulnerable traffic participants such as pedestrians. Motion and shape have shown to be quite discriminative as well.



Figure 6. Stereo camera on-board demonstrator vehicle

Once a region of interest has been determined in the image (e.g. a rectangular bounding box), one can proceed to a recognition step where the type of objects is determined. Because explicit models are seldom available, models are derived implicitly by learning from examples. Recognition is thus addressed as a classification problem. We typically aggregate the image pixels in the resulting region of interest into a feature vector and use pattern classification techniques (e.g. Polynomial Classifiers, Multi-Layer Perceptrons, Radial-Basis Functions, Support Vector Machines, Hyper-permutation Networks) to classify these.

Figure 7 provides an overview of some of the algorithms that have been developed at DaimlerChrysler Research over the years and applied to pedestrian recognition [4][5][6][8]. Stereo-based obstacle detection followed by a combination of shape and texture-based pedestrian classification runs quite successfully in our Urban Traffic Assistant (UTA) demonstrator vehicle at 4-10 Hz, using a 600 Mhz dual-Pentium with MMX. For some related video clips, visit the web page: [www.gavrila.net](http://www.gavrila.net).



(a)



(b)



(c)



(d)

Figure 7. Video-based pedestrian detection and recognition [4][6]:  
(a) depth image computed by stereo,  
(b) detection of independently moving objects using optical flow,  
(c) shape-based pedestrian detection using the Chamfer System [5], and  
(d) pedestrian gait recognition using a Time Delay Neural Network [8]

## V. DISCUSSION

We discussed various sensors and corresponding pattern recognition techniques for detecting (and recognizing) pedestrians from a moving vehicle. We evidently only stand at the beginning of solving this very difficult problem with the reliability necessary to actually deploy such system. More work is required to improve on the trade-off between correct detection and false alarm rate for the individual sensor technologies. We furthermore expect a future PROTECTOR system to benefit considerably from an integrated multi-sensor approach. Finally, it will be necessary to model the traffic environment on a higher (symbolic) level for improved scenario interpretation, risk prediction, control strategies and decision management.

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