

# Computer Vision for Road Safety

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New Zealand



Auckland (1.5 million people) - New Zealand (4.5 million people)



15% of population of NZ is Asian; many Chinese students

# Hon. Dr. Wan Gang, Minister of Science and Technology of PRC, at The University of Auckland on March 28, 2011

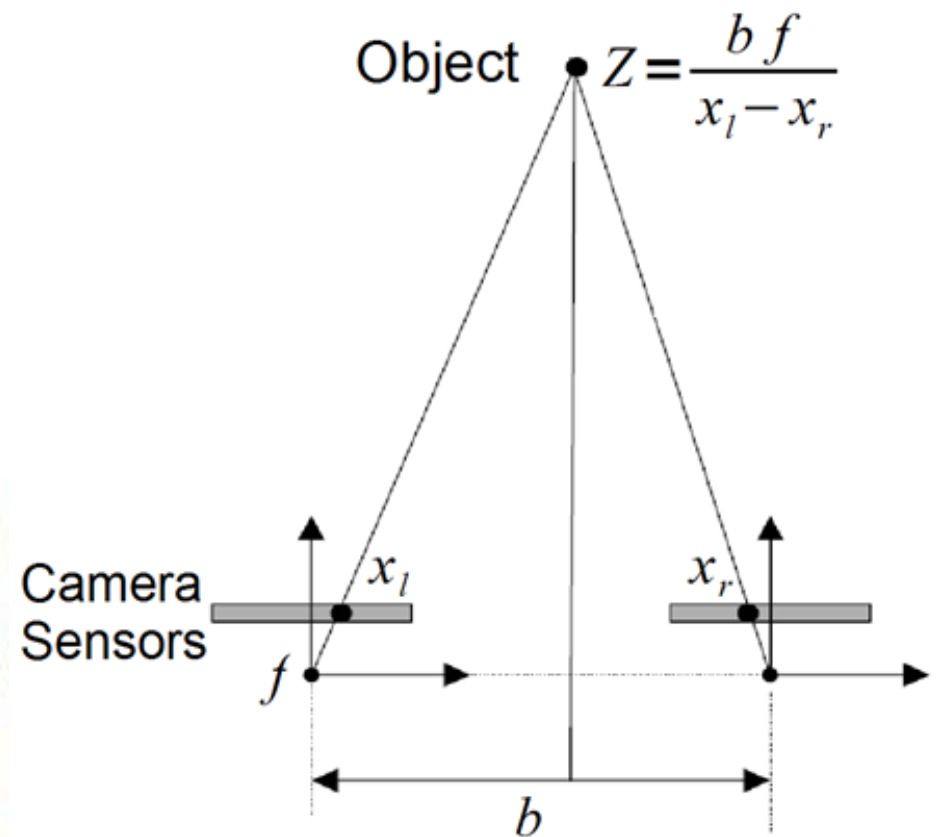
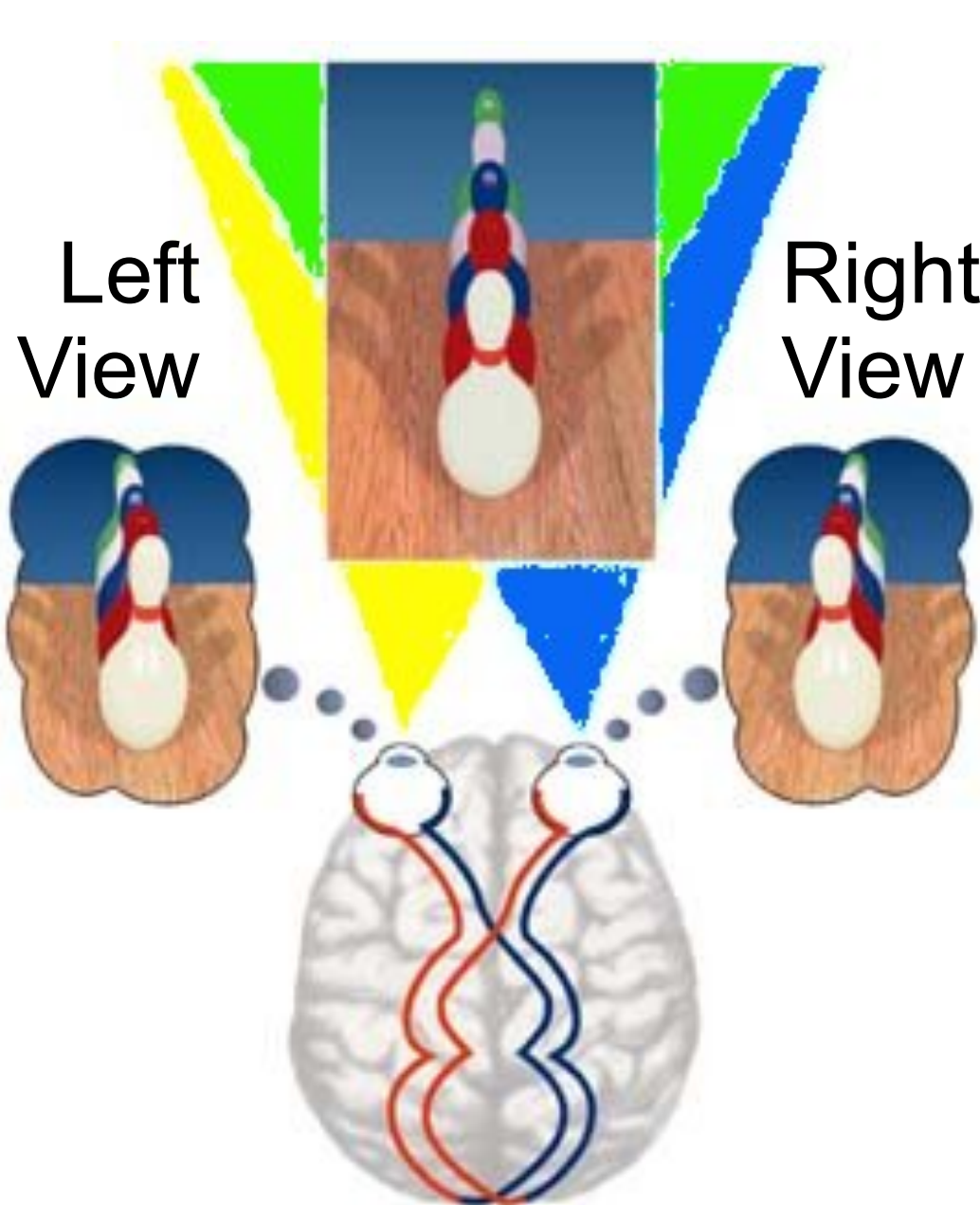


# Computer Vision

## Example: Stereo Vision



# Binocular Stereo



$Z$  = distance

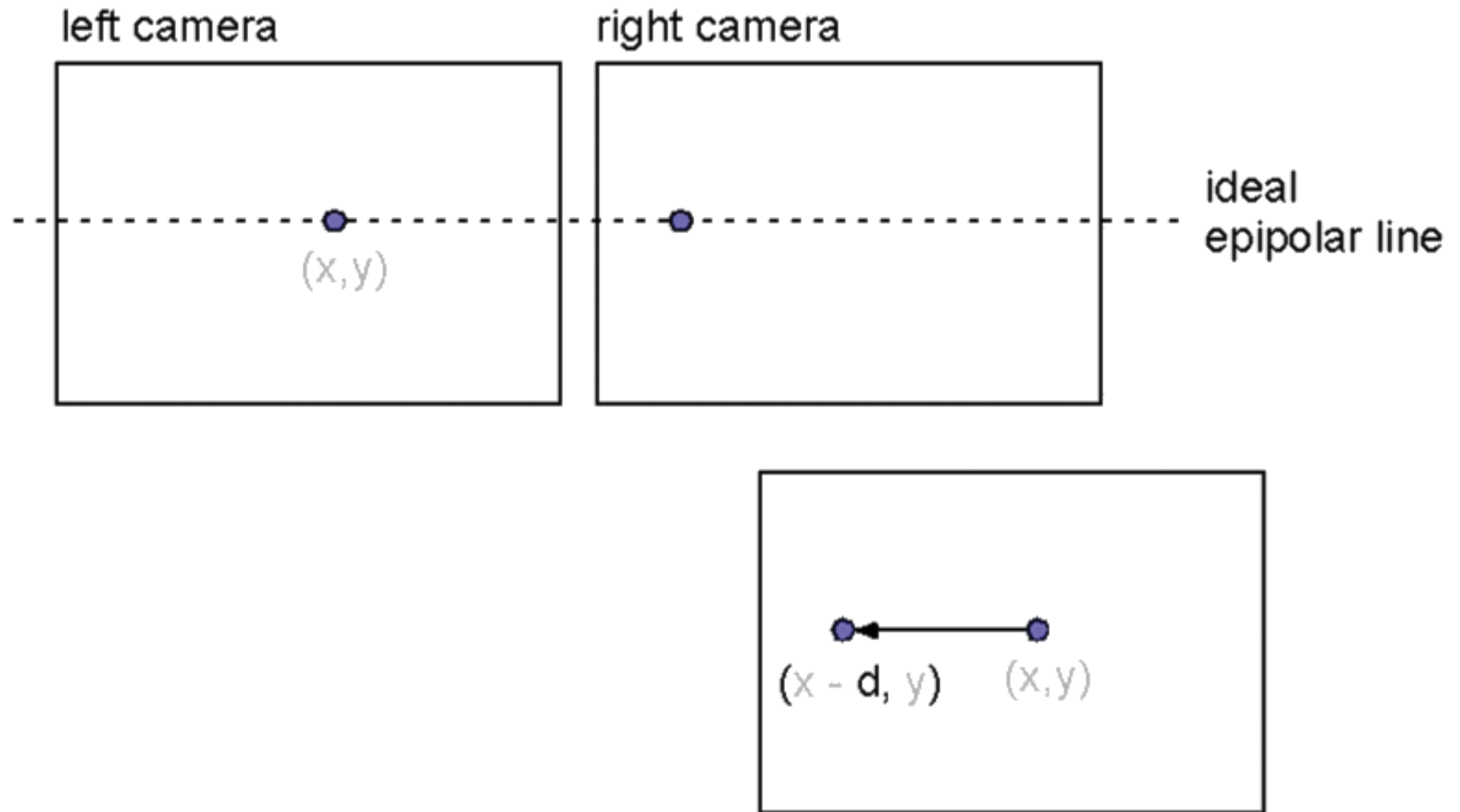
$b$  = baseline

$f$  = focal length

$x_l$  = left cam. pixel dist.

$x_r$  = right cam. pixel dist.

# Stereo Disparity – 1D Search



disparity  $d$  at  $(x, y)$  in left image



## Stereo vision in my group at TU Berlin, 1993



disparity: the visual shift left to right between corresponding pixels



## Stereo vision in my group at TU Berlin, 1993



disparity: the visual shift left to right between corresponding pixels



# Stereo matching 1993

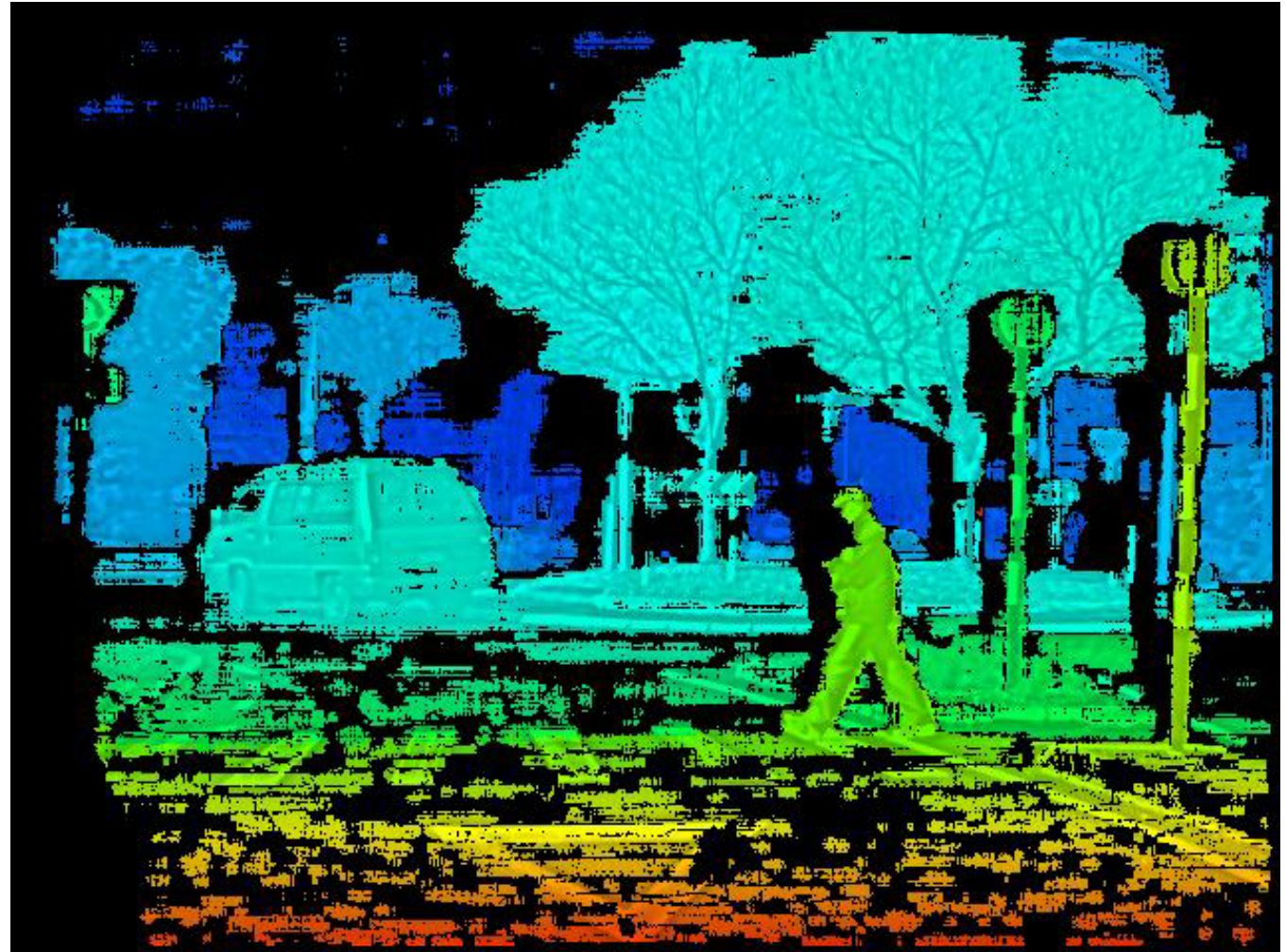
using a correlation-based hierarchical stereo matcher

Disparity map:

Grey values  
represent disparity  
(i.e. distance)



.enpeda.. solution for: Stereo analysis 2011



disparity map: use of a color key for showing disparities



*.enpeda..* solution for: 3D visualization of stereo analysis result



# The *.enpeda..* Project at UoA



Since 2007: The .enpeda.. project at Tamaki Innovation Campus

## Environment Perception and Driver Assistance

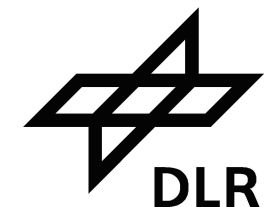


Main partners:

**Daimler AG**

**German Aerospace Center**

**DAIMLER**



# Road Safety



## Annual **road accident toll** worldwide:

deaths: 1.3 million people  
(260,000 children)

injuries: 50 million people

social costs: US\$ 518 billion

(numbers from 2009, and steady  
at about that level)



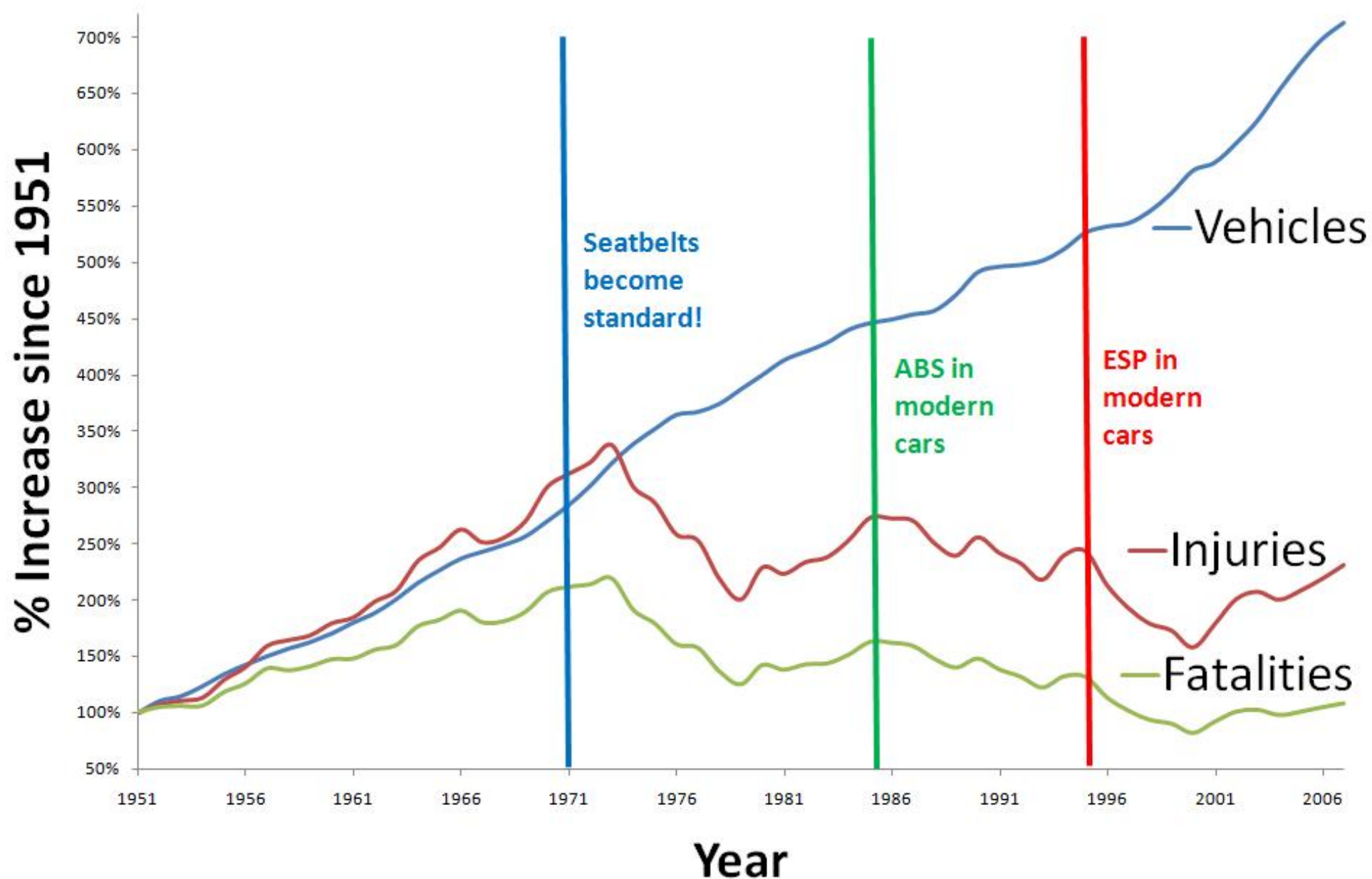


(CHINA OUT) Rescuers work at the traffic accident site on April 1, 2011 in Xi'an, Shaanxi province of China. A truck collided with a bus at a cross on Friday morning. As the truck headed for the sidewalk, it collided into a pedestrian and 6 vehicles which were stopped nearby. As a result 16 people were injured, one currently has severe injuries.

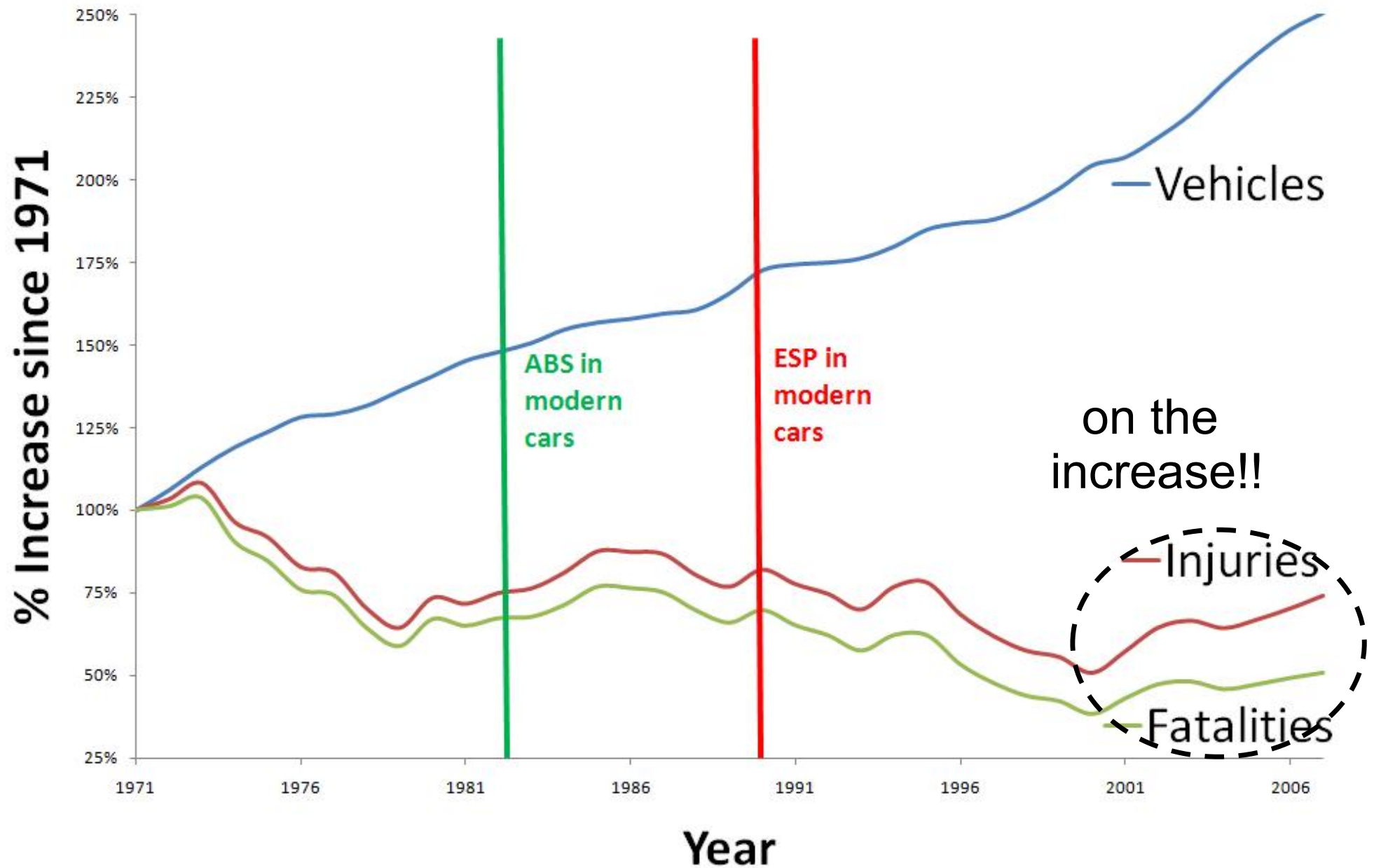
(March 31, 2011 - Photo by Getty Images AsiaPac)



# Accident Statistics for New Zealand



## Statistics since Seatbelt



According to the World Health Organization, the  
**10 leading causes of death worldwide** in 2009:

1. 12.6% Ischaemic heart disease
2. 9.7% Cerebrovascular disease
3. 6.8% Lower respiratory infections
4. 4.9% HIV/AIDS
5. 4.8% Chronic obstructive pulmonary disease
6. 3.2% Diarrhoeal diseases
7. 2.7% Tuberculosis
8. 2.2% Trachea/bronchus/lung cancers
9. 2.2% Malaria
10. **2.1% Road traffic accidents**



# Computer Vision and Road Safety



Options for used sensors:

**Radar:** Very good longitudinal distance/speed  
Poor lateral distance/speed.

**Ultrasound:** Only accurate at low speed.

**Laser / LIDAR:** Very good for distance,  
not for motion estimation.

**Cameras:** Can do it all!  
Vision-based DAS is developing quickly.



# Mature Systems



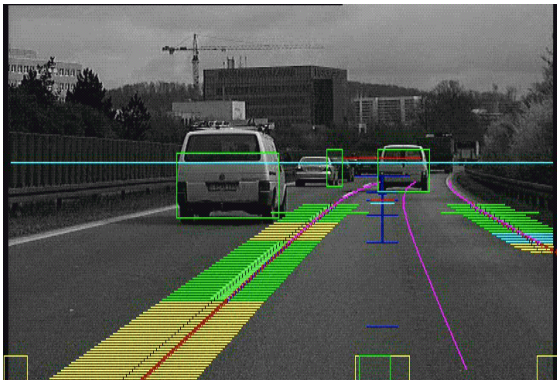
Speed Limit Assistance



Self Parking (2008)



Backing-Up Aid



Lane Recognition



NightView (2005)



Blind spot supervision

# DAS in the Market

- Anti-Lock-Brakes(1982), Electronic Stability Programs (1995) (inertial sensors)
- Mitsubishi Diamante (1995-1996): Camera for lane recognition and Radar for ACC
- Mercedes Truck (since 2000): Lane Departure Warner
- Subaru Legacy (1998-2004): Stereo-based ACC
- Cadillac (2001-2004): FIR Night Vision System
- Toyota (since 2004): Night Vision System, Parking Guide, Lane Monitoring
- Nissan (since 2004): Lane Keeping System
- Honda (since 2004): Lane Keeping System, Collision Mitigation System (Radar)
- Since 2005 every major car manufacturer offers camera-based driver assistance



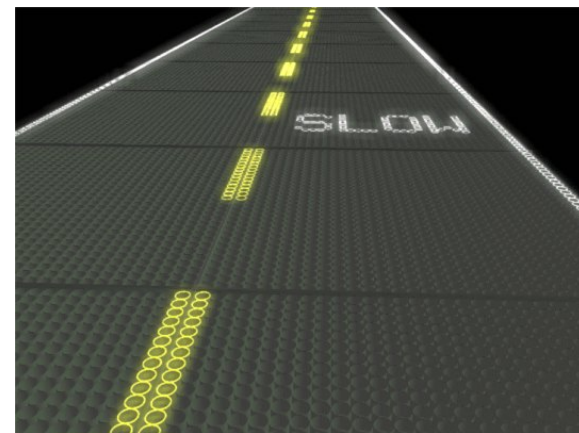
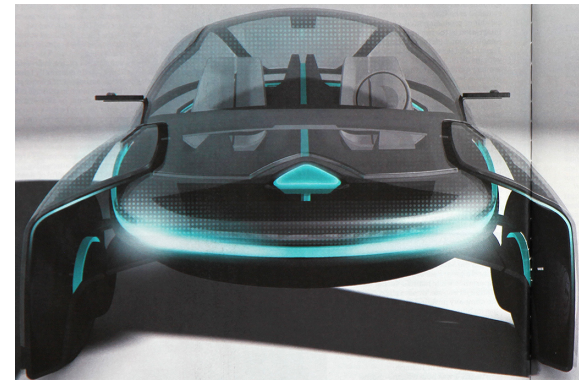
Cameras and computer vision contribute since mid 1990s to the design and implementation of **active safety systems** that perceive the environment around a car and act accordingly. Those systems may also use other sensors (e.g., GPS, LIDAR, radar, ultrasound, or IMU).

**Passive safety systems** (seat belt, air bag, ABS, ESP) are designed to minimize the consequences when a vehicle is already involved in a dangerous situation.

Safe, environmental-friendly, economic, efficient  
**future transportation** will use

**active safety systems** with computer vision  
integrated for

- “intelligent vehicles”
- “intelligent roads”
  - guidance, energy transmission, ... ,
  - energy collectors (whole road a solar panel?)



- Will there also be “intelligent drivers” ?

# Three Roadmaps to Future Traffic



## **DAS**

Driver Assistance  
Systems

lane departure  
safe distance  
blind spot  
speed signs  
stop signs  
free space  
sleepiness

## **AH**

Automated  
Highways

debris detection  
safe distance  
free space  
  
driver readiness

## **DLV**

Driverless  
Vehicles

multi-sensor  
  
**MILITARY**  
ground manifold  
  
...  
  
**CIVIL APPL.**  
**ROBOTICS**  
tracking  
  
...



Cameras and computer vision contribute  
for **DAS**, **AH**, and **DLV**

to components that

- ❑ **control the vehicle**
- ❑ **perceive the environment and**
- ❑ **monitor the driver (if in manual mode)**

Typically integrated with other sensors:

GPS, LIDAR, radar, ultrasound, or IMU

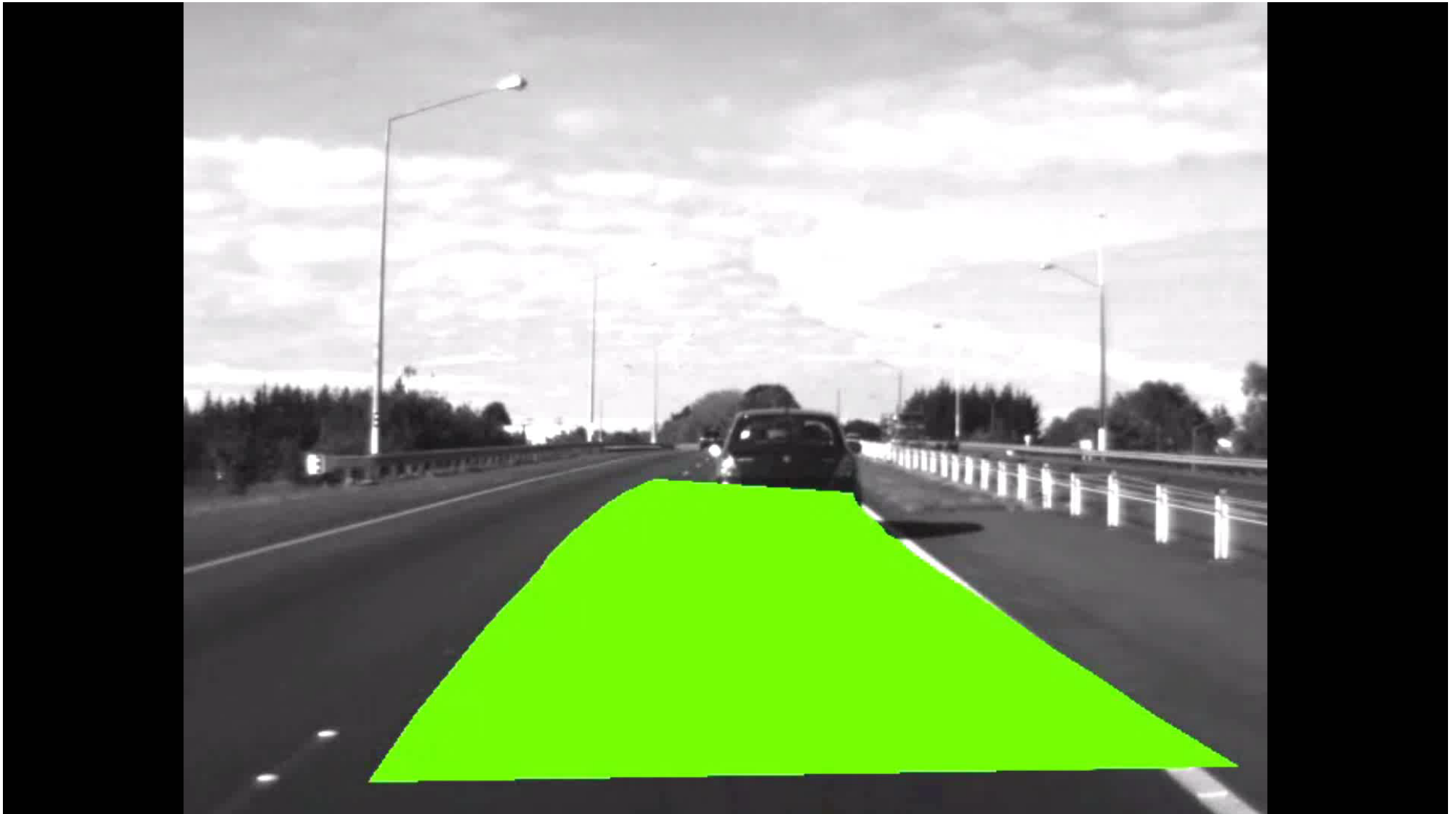


Active **DAS** are developed to

- (i) **predict** traffic situations
- (ii) **adapt** driving and car to the situation
- (iii) **optimize** for safety



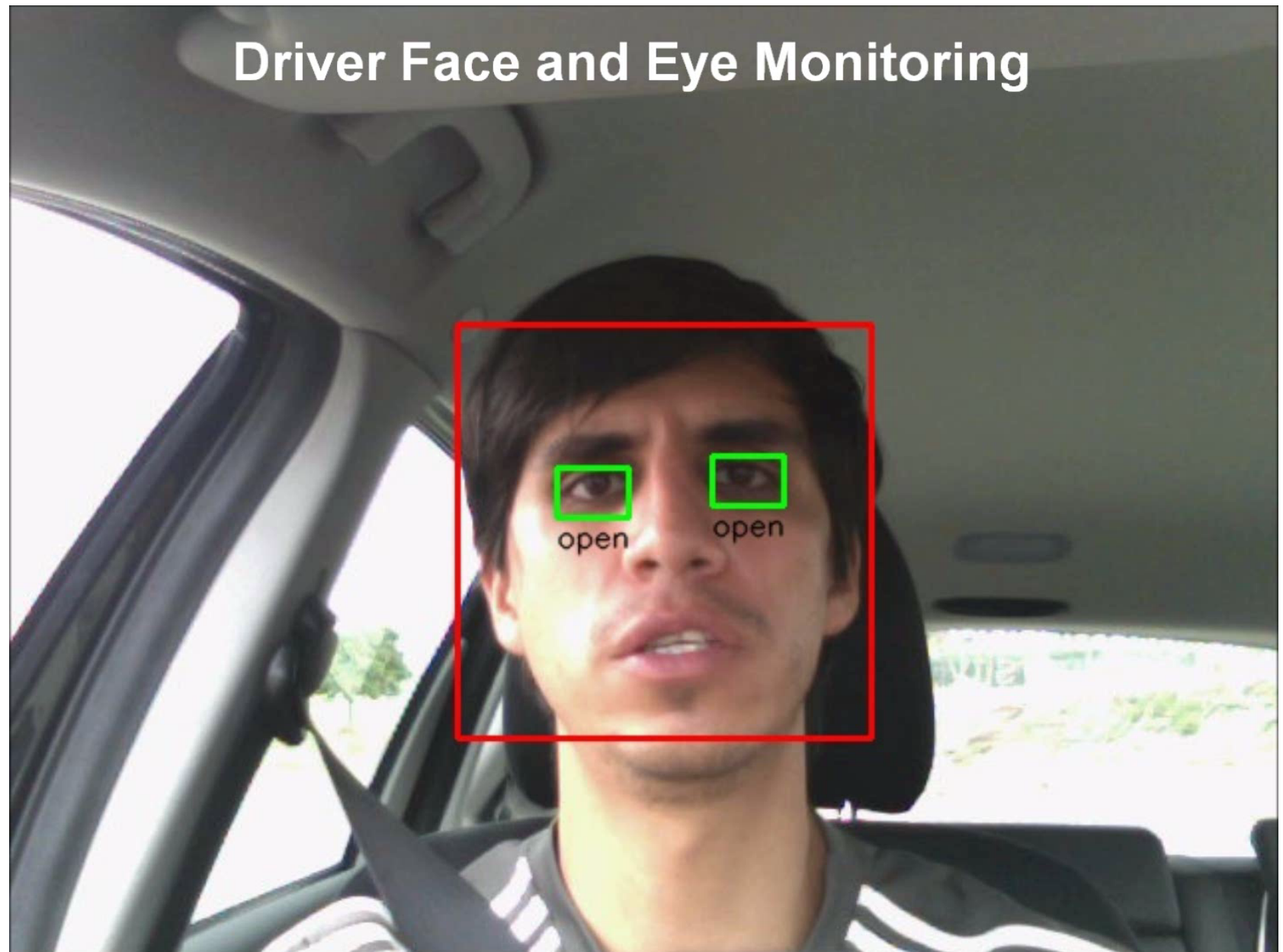
*.enpeda..* solution for: Predict the area the car is driving in



# Driver Monitoring



*.enpeda..* solution for: **Driver monitoring**



Five cases with response between: fine ... attention ... alarm



OK

distracted

blinking/falling asleep



Hon. Dr. Wan Gang, Minister of Science and Technology of China, March 28, 2011, at The University of Auckland when talking to me:

" Every truck or long-distance bus in China should be equipped with such a driver monitoring system."

We plan to collaborate on this with Jinan University and SINOTRUK and welcome further partners.



# DAS on a Mobile Phone



.enpeda.. solution for: **Lane detection**






GPS with lane detection on the mobile phone

Feixiang Ren and Jinsheng Huang, **SkyEye Technologies Ltd.**

*.enpeda..* solution for: Lane departure warning



Feixiang Ren and Jinsheng Huang are former MSc students of *.enpeda..* , their startup company **SkyEye Technologies Ltd.** collaborates with **Mail-Bit**, Israel, and develops DAS for iPhone  , Android  , and Windows mobile  .

# Test Vehicle of *.enpeda..*



# Research Vehicle HAKA1 at Tamaki campus



2 x 2MP 10 bit  
gray-value (fish-  
eye) cameras  
(Basler)

five VGA 10 bit  
gray-value cameras  
(PointGray)

Default recording mode:

two gray-value  
(10 bit)  
PointGray cameras,  
640 x 480 resolution



High Awareness Kinematic Automobile No. 1

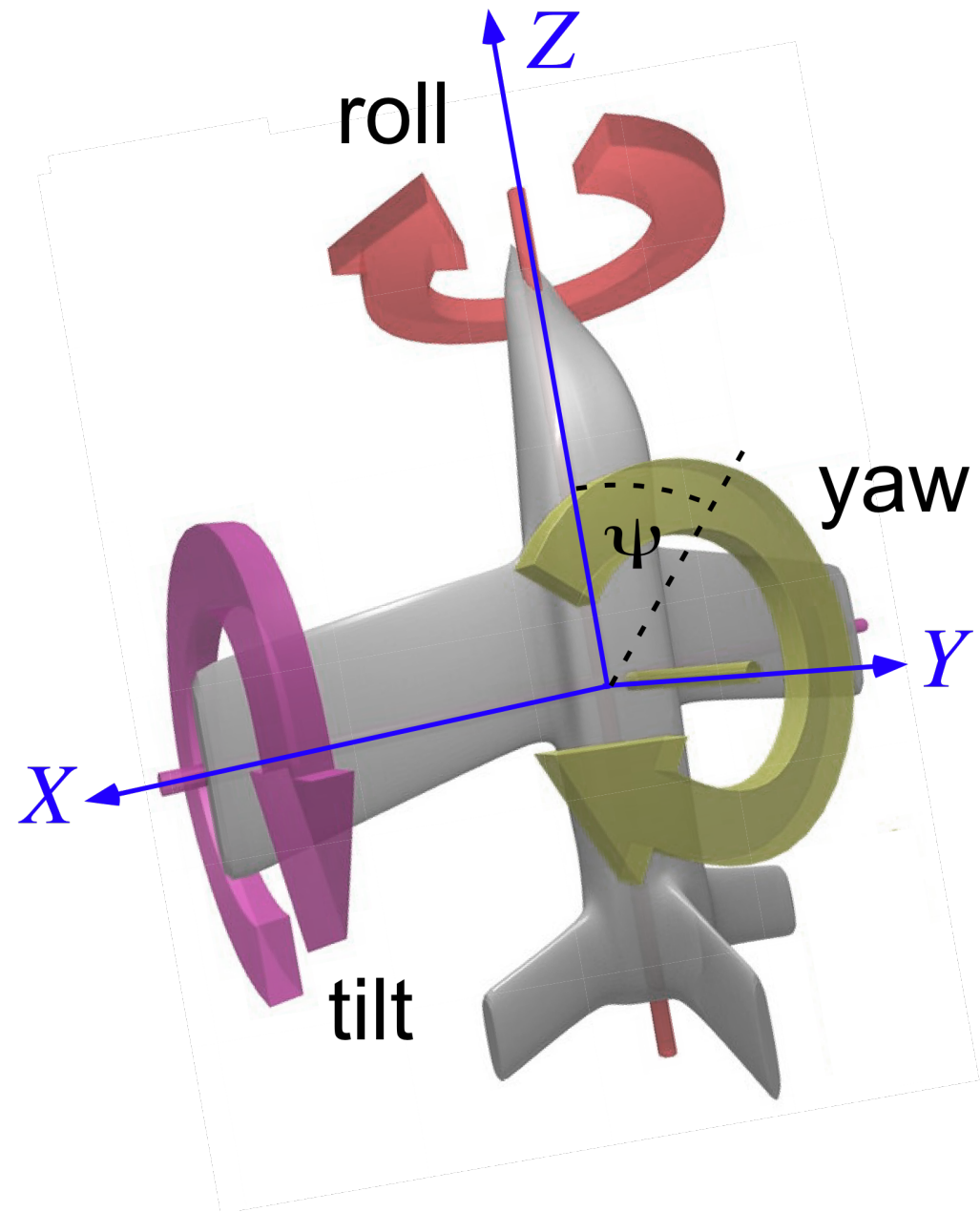
# HAKA1

High Awareness Kinematic Automobile no. 1  
test vehicle in the *.enpeda..* project



**Yaw**  $\psi$   
steering angle

**Tilt and roll**  
often 'disturbing'  
ego-motion  
components



## Ego-vehicle

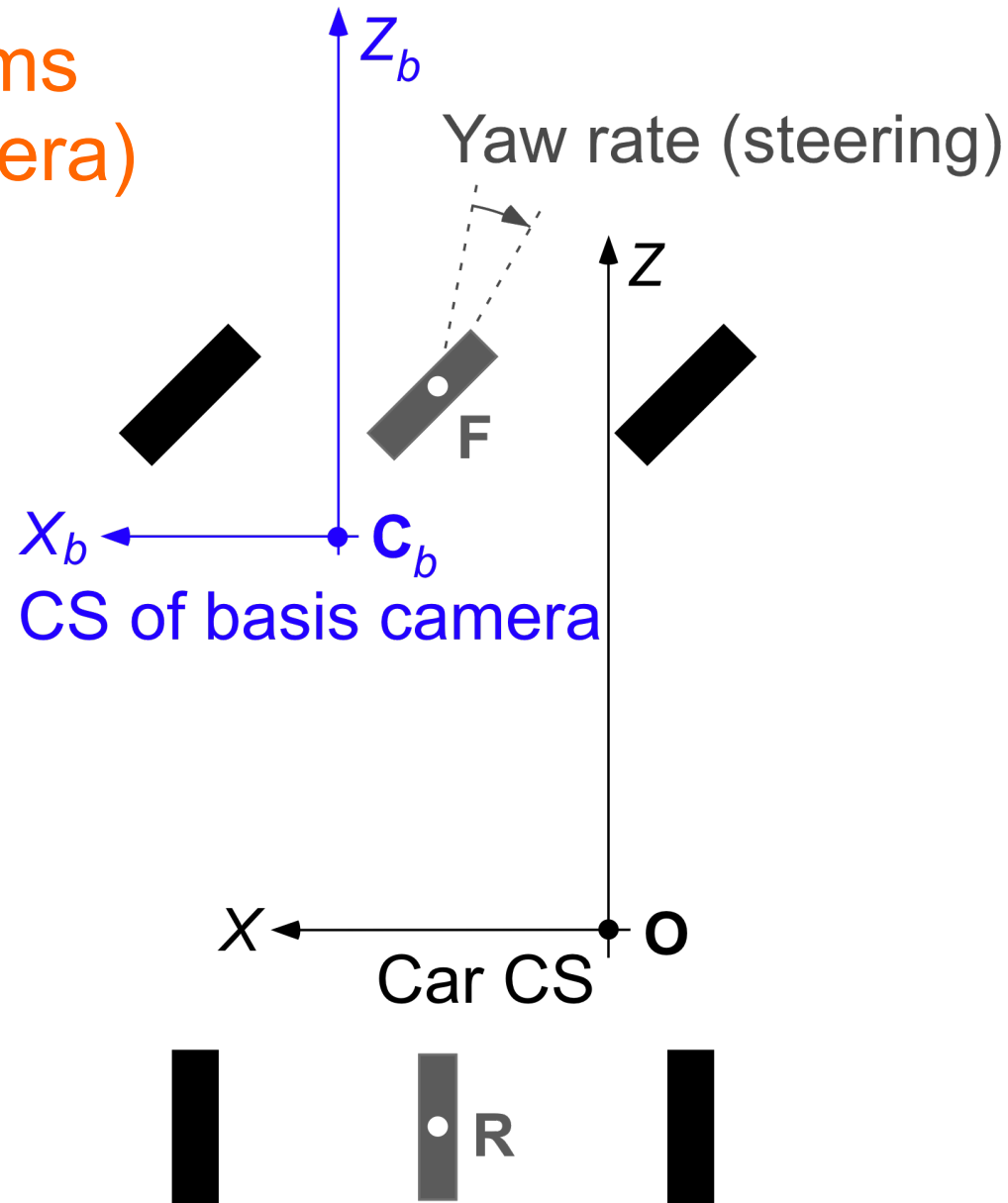
the car where the system is operating in

## Ego-motion

changes in yaw, tilt, roll and velocity  
(on ground manifold)



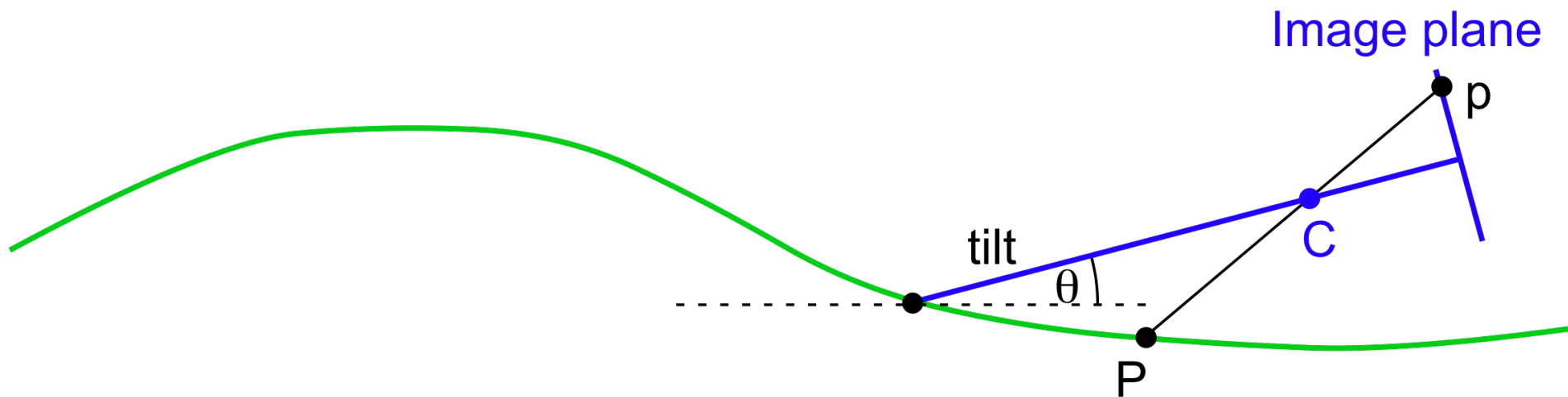
## Coordinate systems (car and one camera)



**F** and **R** define the *bicycle model* of the car

## The ego-vehicle on the road

Visual odometry, ground manifold estimation, free space calculation, lane detection, corridor detection, ...



# Our Input Data



two gray-value cameras, that means ...

Imagine a driver with allochromasia, tunnel vision (limited peripheral viewing), and myopia (distance blur), but stereo vision:



Did you see the bird flying through?

At what distance to the car?



# Stereo Frames, Auckland to Hamilton



Left Camera



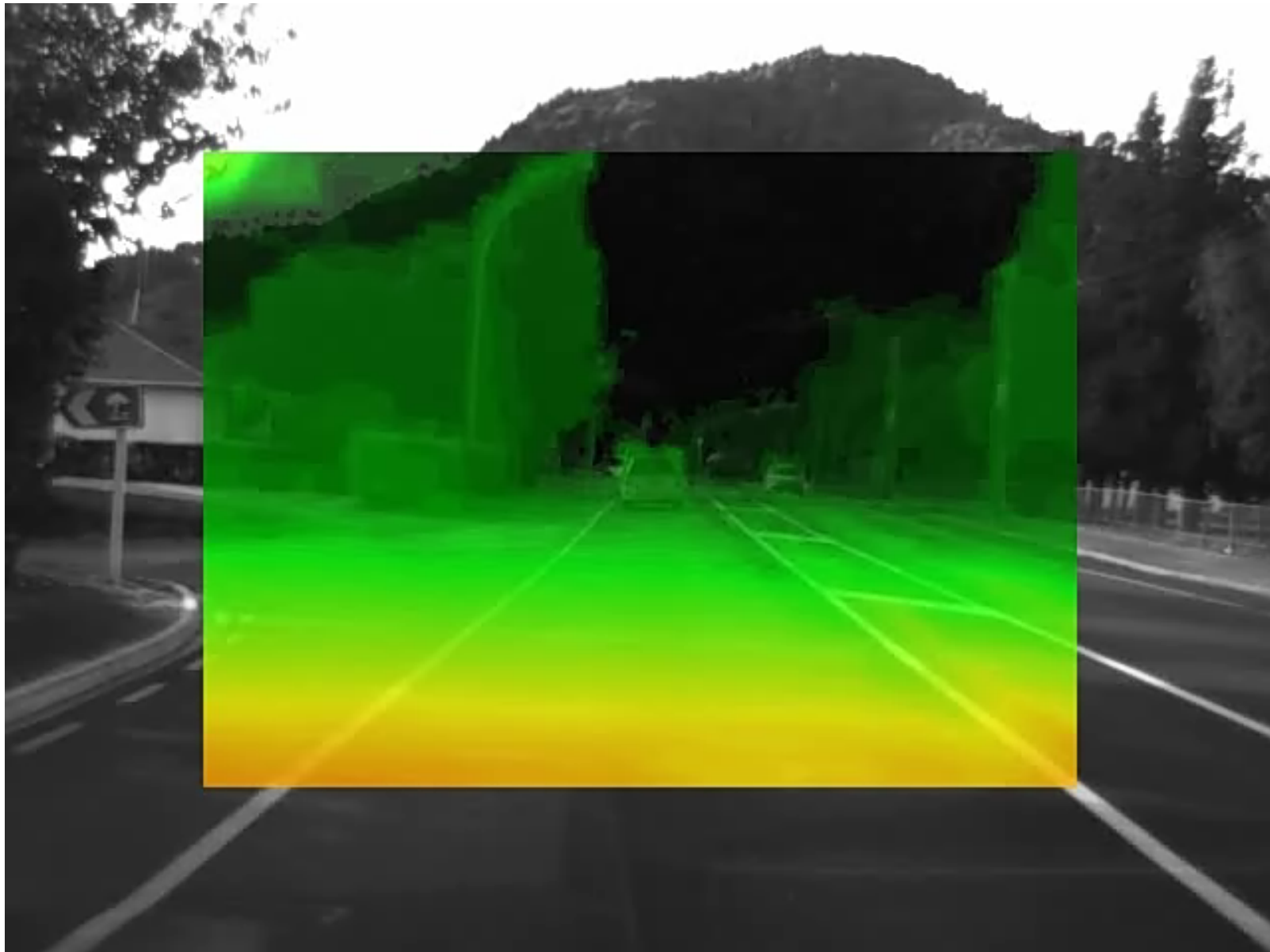
Right Camera



# Distance Information

close ..... far

The Key



## Traffic scenes are a challenge for vision:



Dense night traffic, but not yet rain, snow, or fog

# Performance Evaluation



## *.enpeda..* solution for: Performance Evaluation



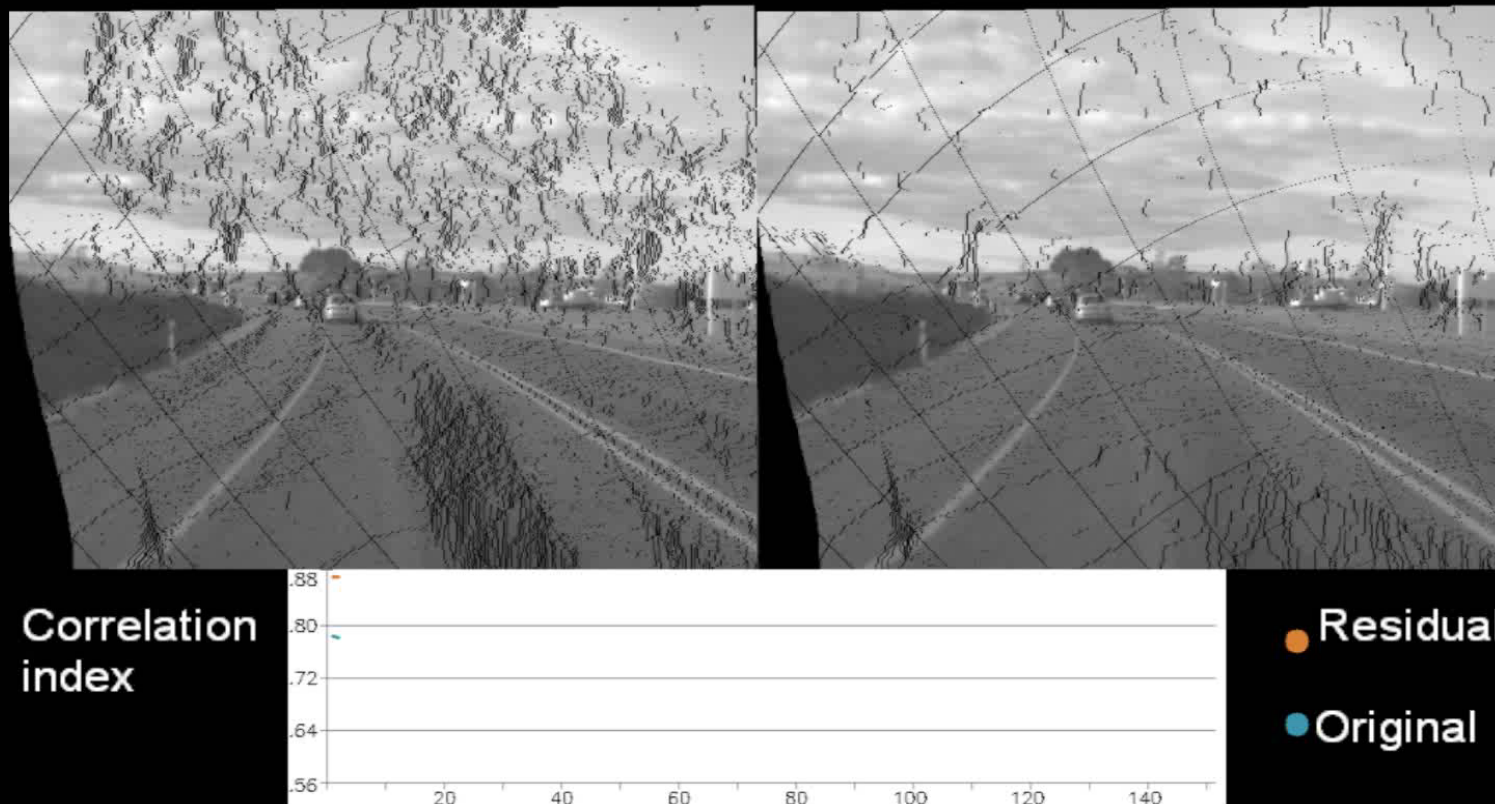
A third camera provides “ground truth”.

Distance data evaluated based on this ground truth.

Technology now used by Daimler A.G.



Our technology supports real-time confidence estimation



# Motion Analysis

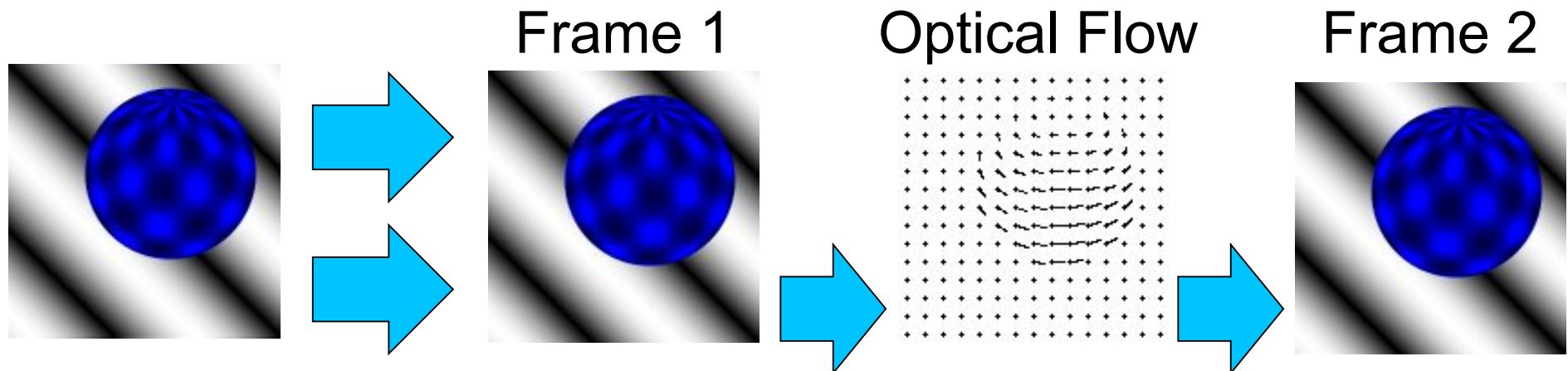


# Motion Information (Optical Flow)

Compare sequential images over time

Use global matching algorithms to find the “flow” of the images

Only 2D motion obtained (image plane)



# Optical Flow Example

Image 1

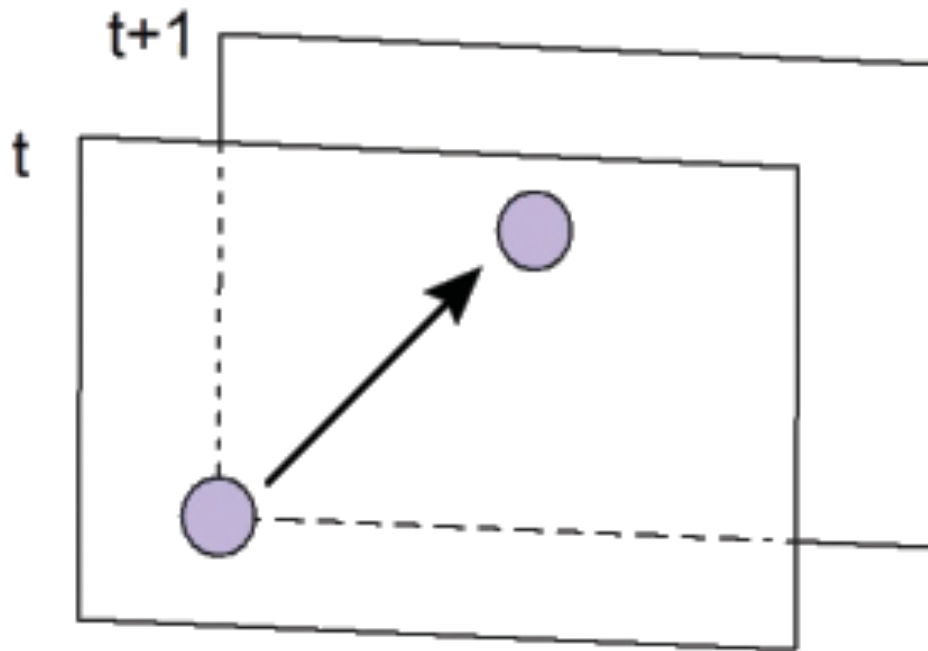
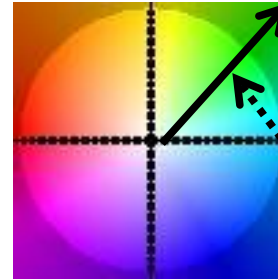


Image 2

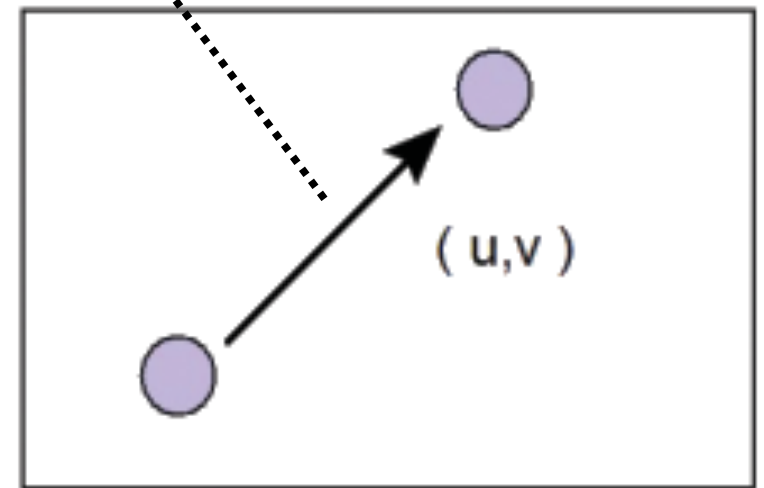


# Optical Flow – 2D Search

The Key



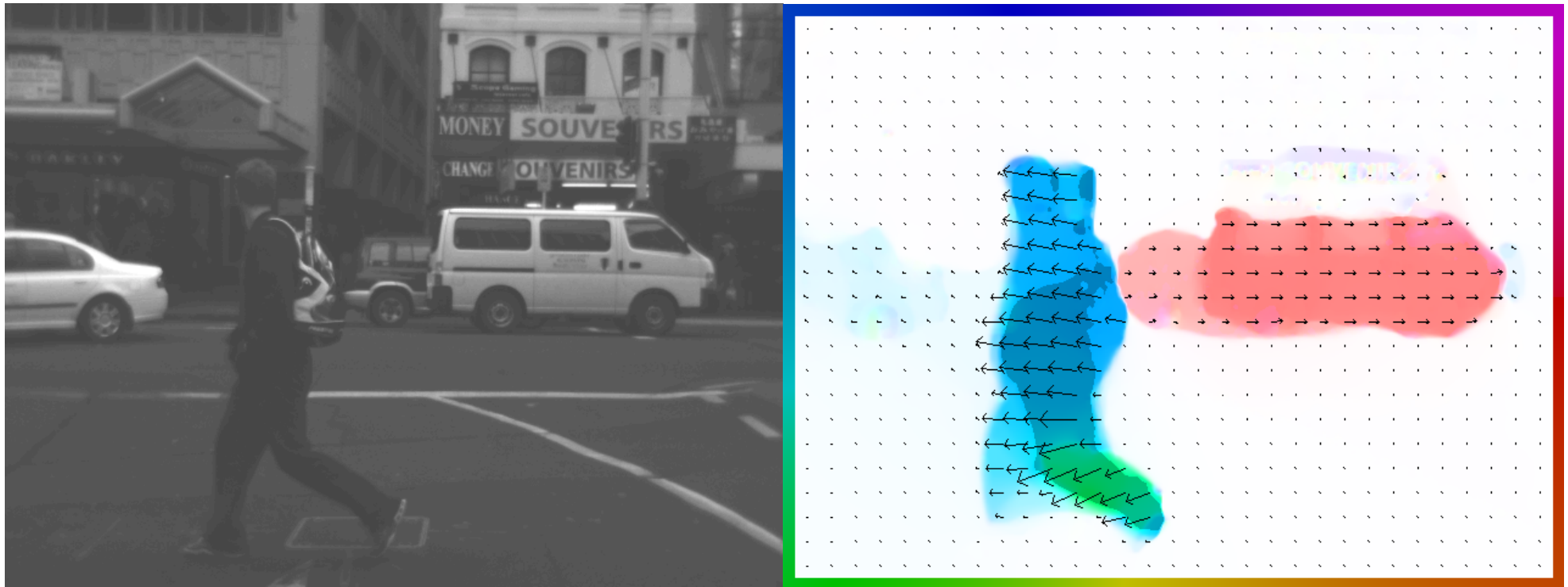
Original Frames



Optical flow

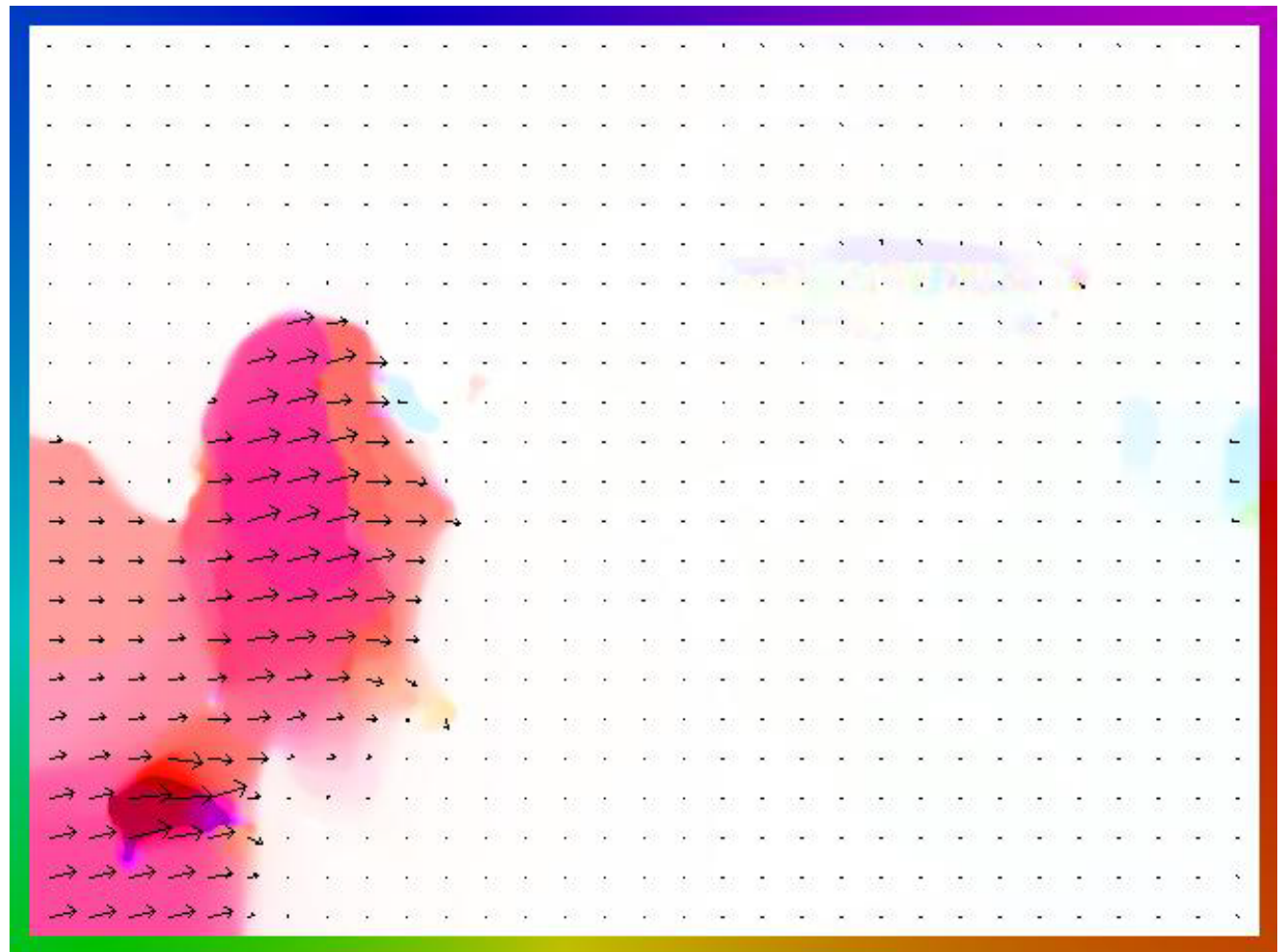
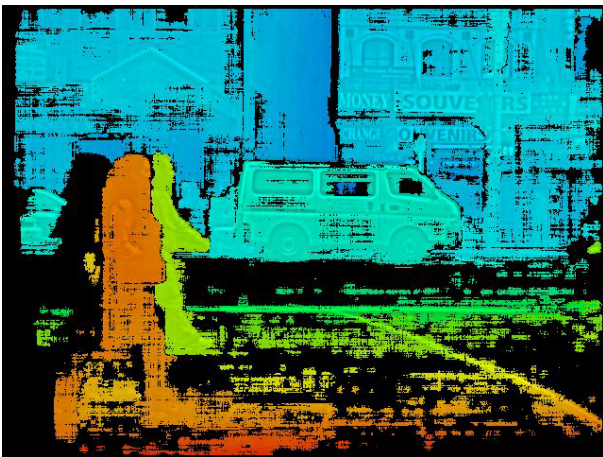


# .enpeda.. solution for: Dense motion analysis



Used color key for showing motion





.enpeda.. solution for: Visualization of 3D stereo and motion



# Combining stereo with motion



# Scene Flow

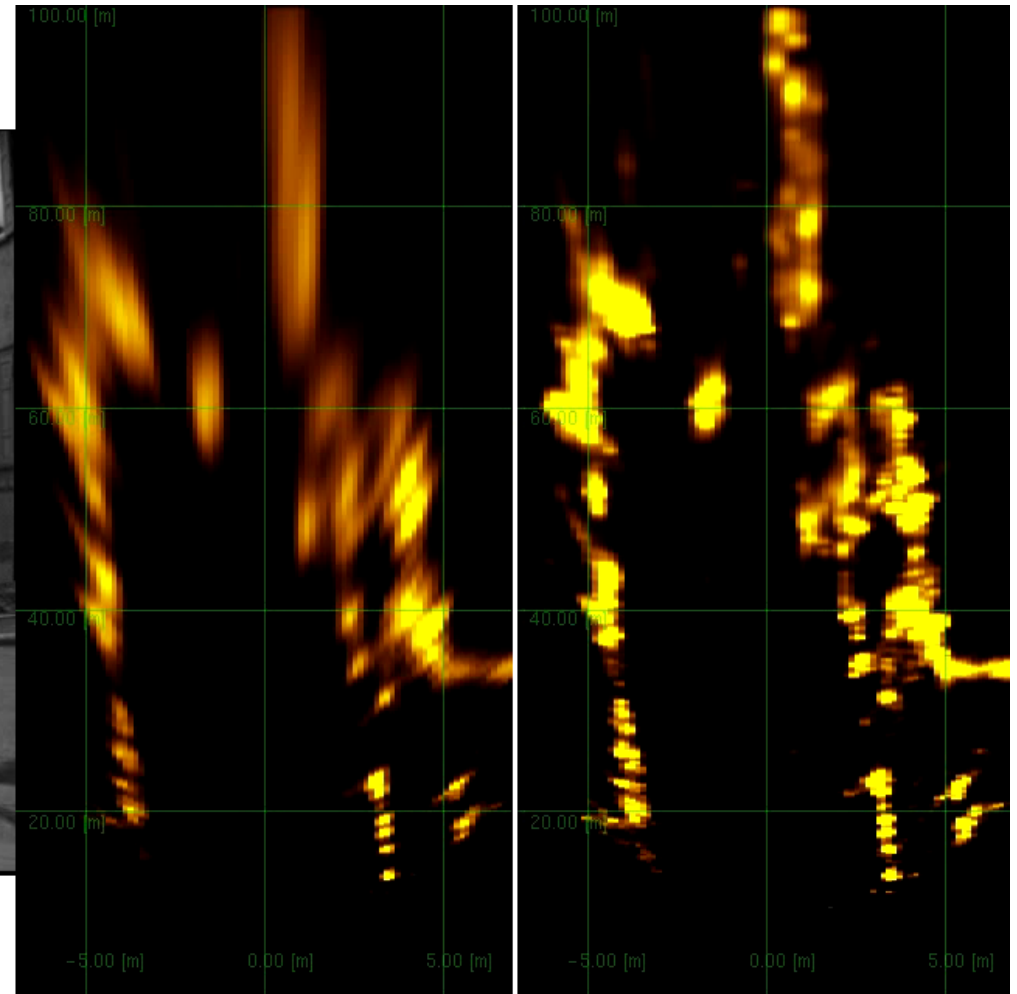
In collaboration with Daimler A.G., Germany



# Distance to Obstacle



# Integrating Stereo Over Time

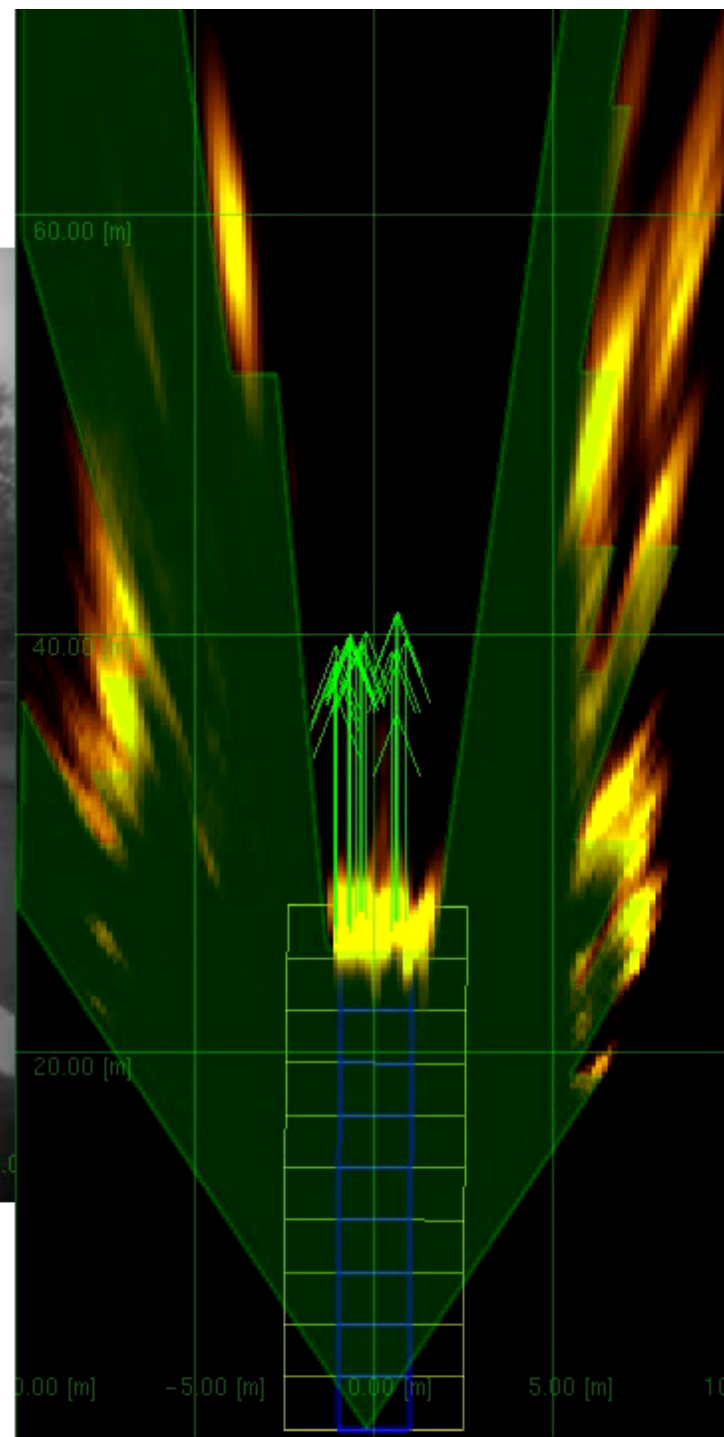


Original

Raw

Integrated





In collaboration with Daimler A.G., Germany

*.enpeda..* solution for: Distance to “obstacles”



# Summaries



## **DAS**

Driver Assistance  
Systems

## **AH**

Automated  
Highways

## **DLV**

Driverless  
Vehicles

lane departure  
safe distance  
blind spot  
speed signs  
stop signs  
free space  
sleepiness

debris detection  
safe distance  
free space  
  
driver readiness

multi-sensor

**MILITARY**

ground manifold

...

**CIVIL APPL.**

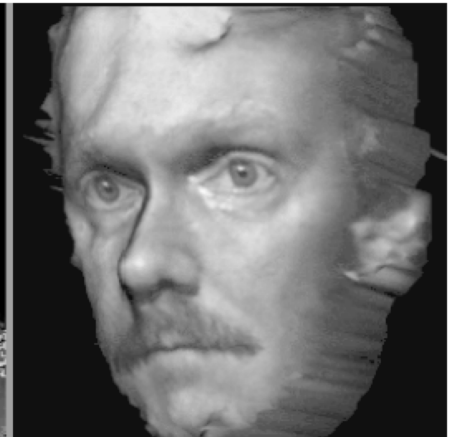
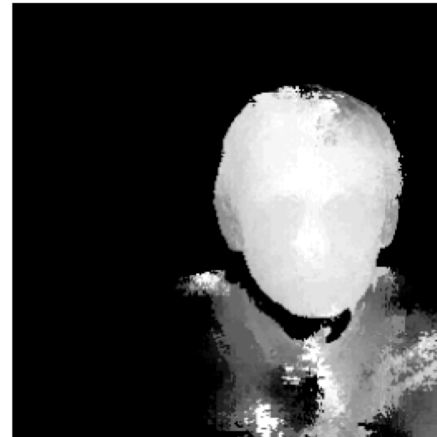
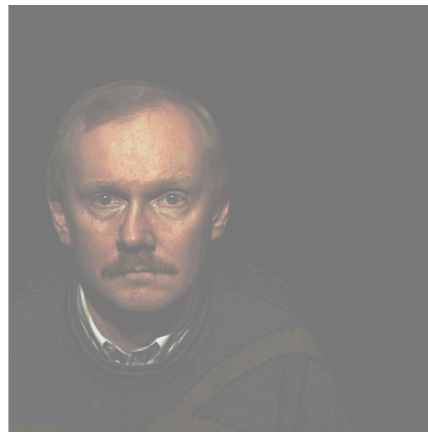
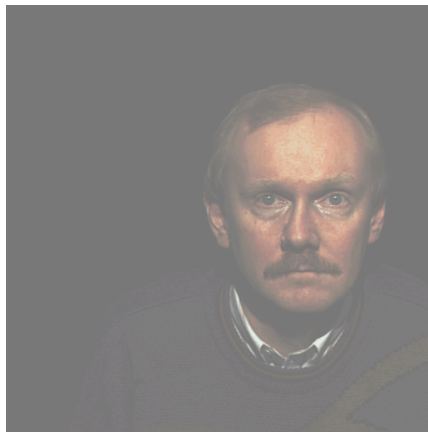
**ROBOTICS**

tracking

...



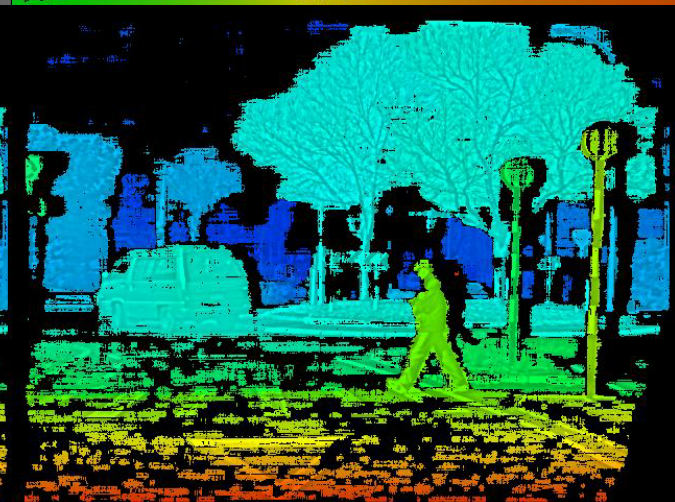
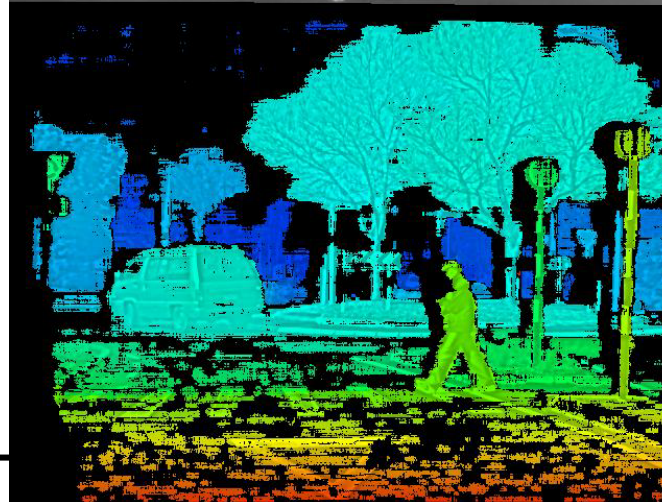
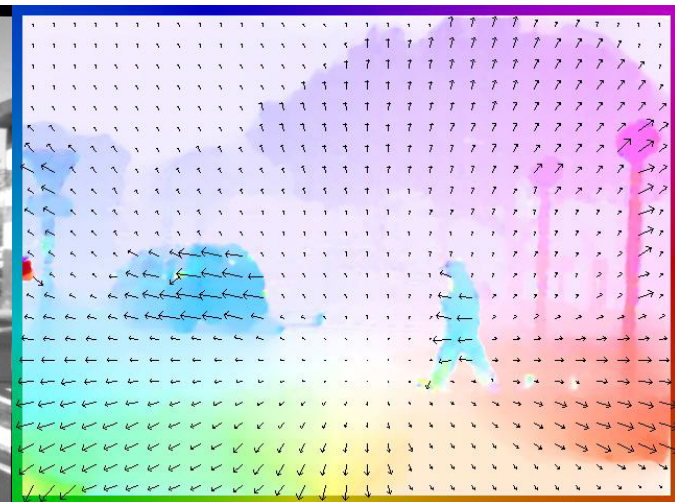
1993



Indoor, single stereo pair,  
slow, inaccurate

2011

Real-time video  
(FPGA, Bosch Germany,  
2 Watt) stereo and motion  
at 30 Hz, sufficient  
accuracy



# Conclusions



Vision-based DAS is the future (an expanding field of research; car industry needs it; road safety requires our attention): **predict**  
**- adapt - optimize**

Low-level vision is still not yet robust ...  
but progress is steady

Pedestrian detection and tracking, ...,  
understanding of complex traffic scenarios  
is still a challenge



**We are ready to go to the next level.  
Our technology applies to all types of cars.**

Options: integration into

a large-scale **automated highway project**

or

a **collaboration with the car industry** in China  
(including our partners in China, e.g. Jinan Univ.)

or ...

**Accident free driving is a realistic goal.**

**See “deaths, injuries, social costs” as above.**

