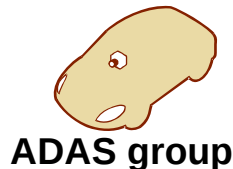


# Robust lane lines detection and quantitative assessment

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# Outline

1. Context : ADAS and lane markings
2. Goals
3. Method : what's new
4. Results
5. Conclusions

# What's ADAS



ADAS="Advanced driver assistance systems".

Onboard systems which combine sensors and algorithms to *understand the vehicle environment* so that the driver can receive assistance or be warned of potential hazards.

Vision is the most important sense employed for driving → computer vision is a natural (but not unique) choice.

# What's ADAS



Lane Departure Warning  
Automatic Cruise Control  
Stop & Go  
Platooning  
Collision avoidance  
Pedestrian Protection  
Intelligent frontlights  
Intelligent airbags ...

**need**

Detection of lane markings  
Vehicle recognition & tracking  
Pedestrian detection  
Road segmentation  
Driver, occupants monitoring  
...  
*in highly varying conditions  
(lighting, road, traffic...)*

# Lane markings



may seem easy...



# Lane markings



but occlusions, shadows, low contrast ... make it difficult

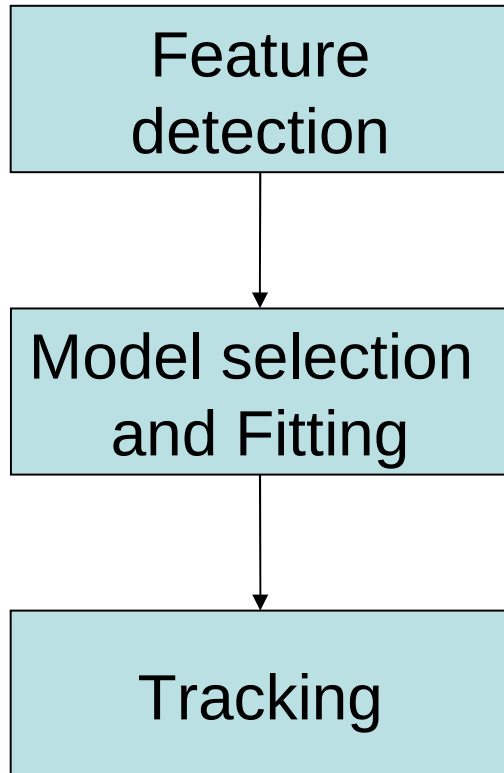


# Goals



- Extraction lane lines on video sequences
- Real time ( $>25$  *fps* or  $<40$  *ms/frame*)
- Robustness : deal with lighting changes, occlusions, etc.
- Computation of meaningful geometric parameters : road curvature, lane width, vehicle lateral offset and heading orientation w.r.t lane axis
- Validation: what ground truth ?

# Method : what's new



- Ridges

- Two paralel hyperbola + RANSAC robust fitting

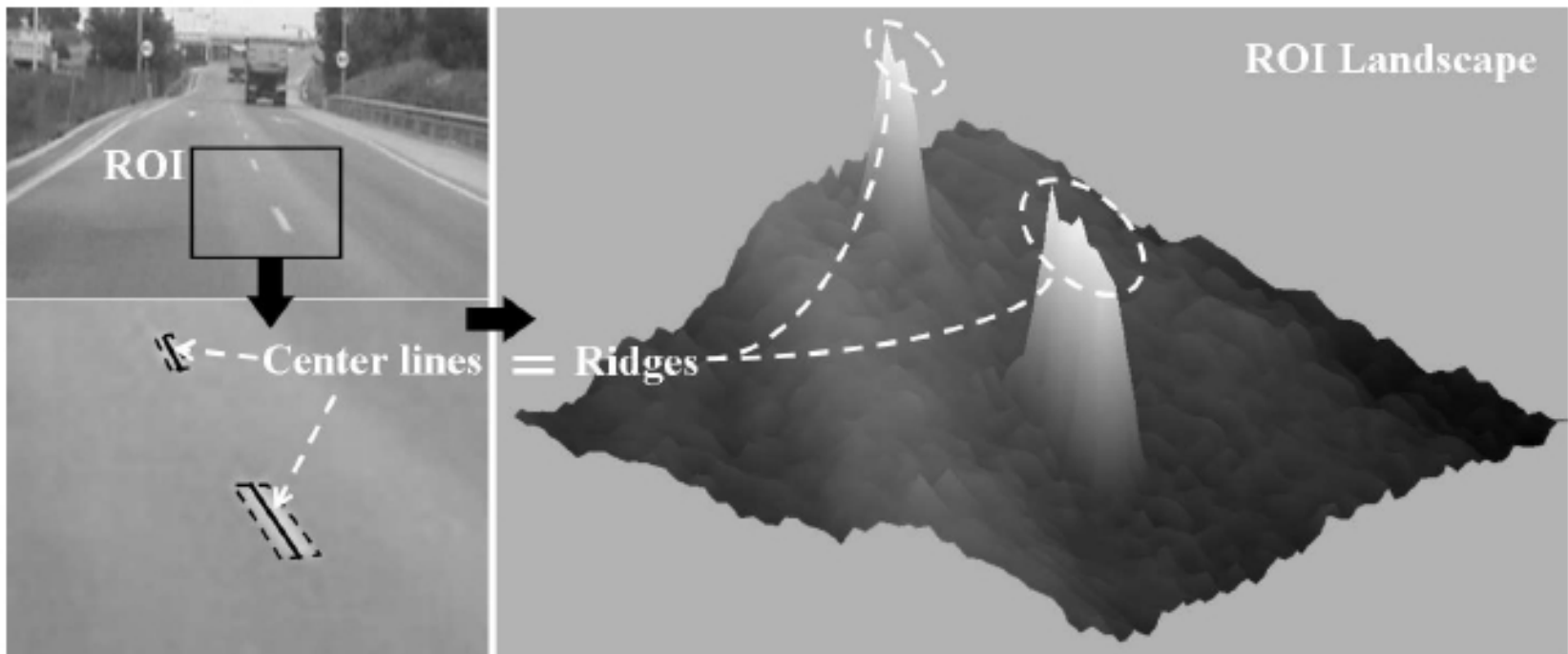
- No tracking : frame by frame processing
- Kalman filter



# Method : what's new



(1) Features : ridges instead of edges



$$\left. \begin{aligned} L_{\sigma_d}(\mathbf{x}) &= G_{\sigma_d}(\mathbf{x}) * L(\mathbf{x}) \\ \mathbf{w}_{\sigma_d}(\mathbf{x}) &= (\partial_u L_{\sigma_d}(\mathbf{x}), \partial_v L_{\sigma_d}(\mathbf{x}))^\top \end{aligned} \right\} \tilde{\kappa}_{\sigma_d, \sigma_1}(\mathbf{x}) = -\text{div}(\tilde{\mathbf{w}}_{\sigma_d, \sigma_1}(\mathbf{x}))$$

# Method : what's new



(1) Features : ridges instead of edges



# Method : what's new



(2) Model selection involving 4 road and vehicle geometric *meaningful* parameters.

Under the assumptions of

- planar road
- piecewise constant curvature,

lane lines are imaged as two hyperbolae with a common horizontal asymptote.

$$v = v_0$$

$$u - u_0 = a(v - v_0) + \frac{b}{(v - v_0)}$$

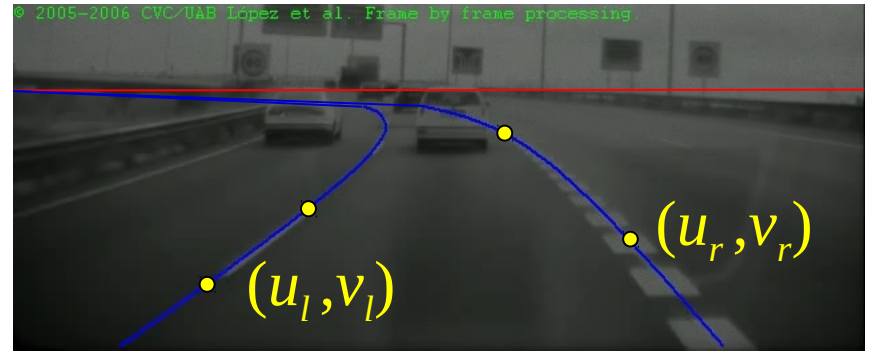


# Method : what's new



(2) Model selection involving 4 road and vehicle geometric *meaningful* parameters

$$\begin{bmatrix} 1 & 0 & v'_l & 1/v'_l \\ 1 & -v'_r & v'_r & 1/v'_r \end{bmatrix} \begin{bmatrix} a_1 \\ a_2 \\ a_3 \\ a_4 \end{bmatrix} = \begin{bmatrix} u_l \\ u_r \end{bmatrix}$$



$$v'_r = v_r/E_v + \tan \varphi$$

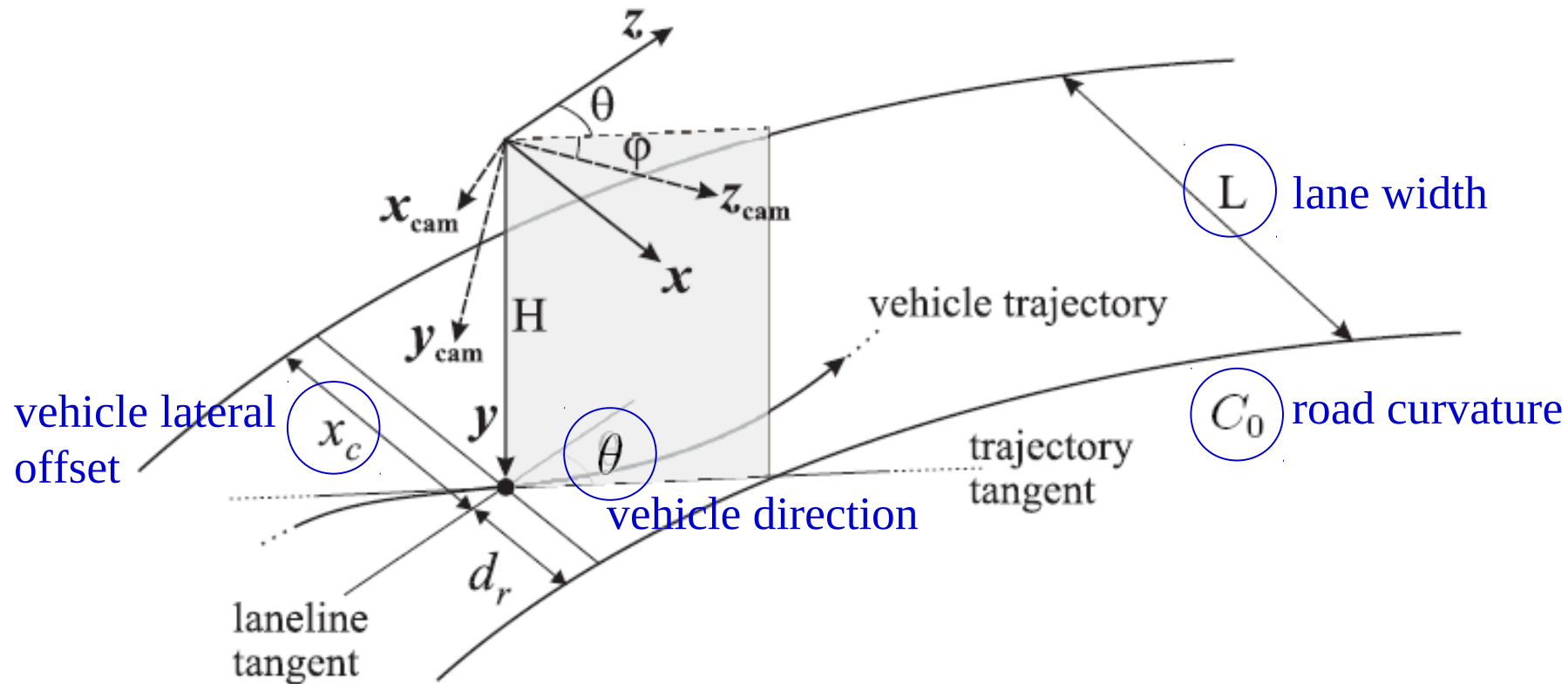
$$v'_l = v_l/E_v + \tan \varphi$$

$$\theta = \frac{\cos \varphi}{E_u} a_1, \quad L = \frac{H}{E_u \cos \varphi} a_2, \quad x_c = \frac{H}{E_u \cos \varphi} a_3, \quad C_0 = \frac{4 \cos^3 \varphi}{E_u H} a_4$$

# Method : what's new



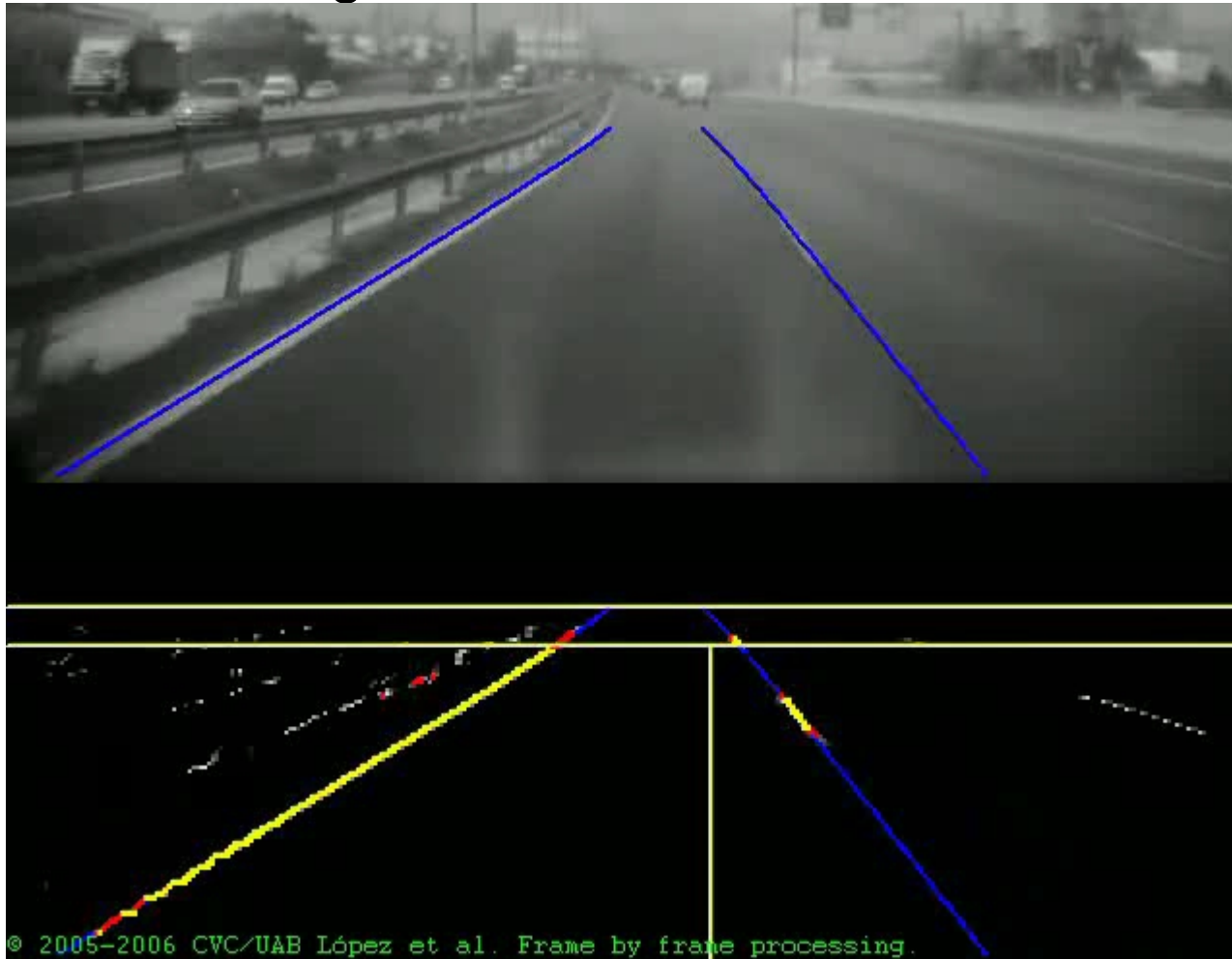
(2) Model selection involving road and vehicle geometric *meaningful* parameters



# Method : what's new



## (3) Robust fitting with RANSAC



inlier

outlier

rejected

# Results



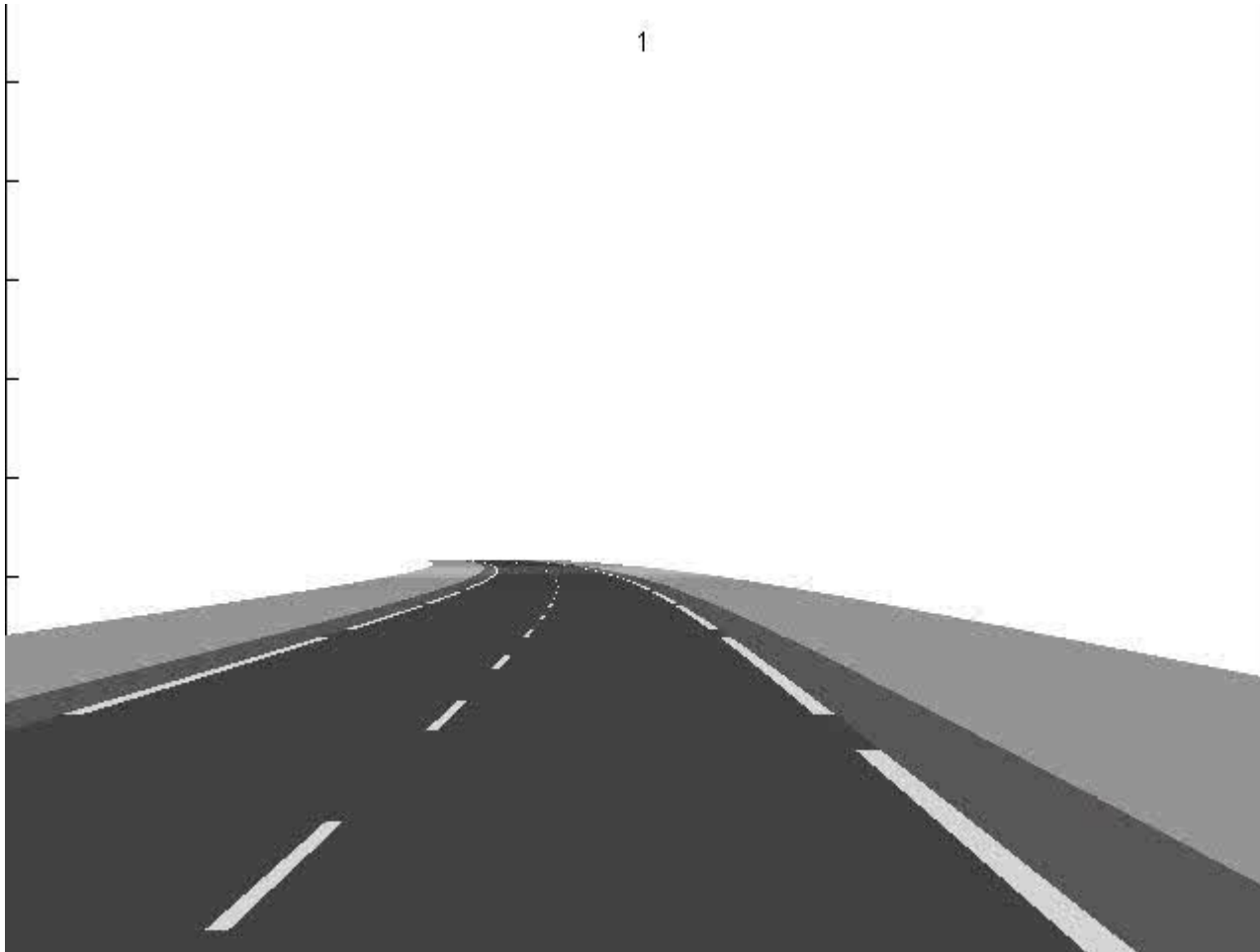
There is no ground truth available for quantitative assessment: exact (*cm*) vehicle trajectory and road curvature.

Synthetic sequences : ground truth available for the 4 estimated parameters → *quantitative assessment* is possible.

Geometrically realistic :

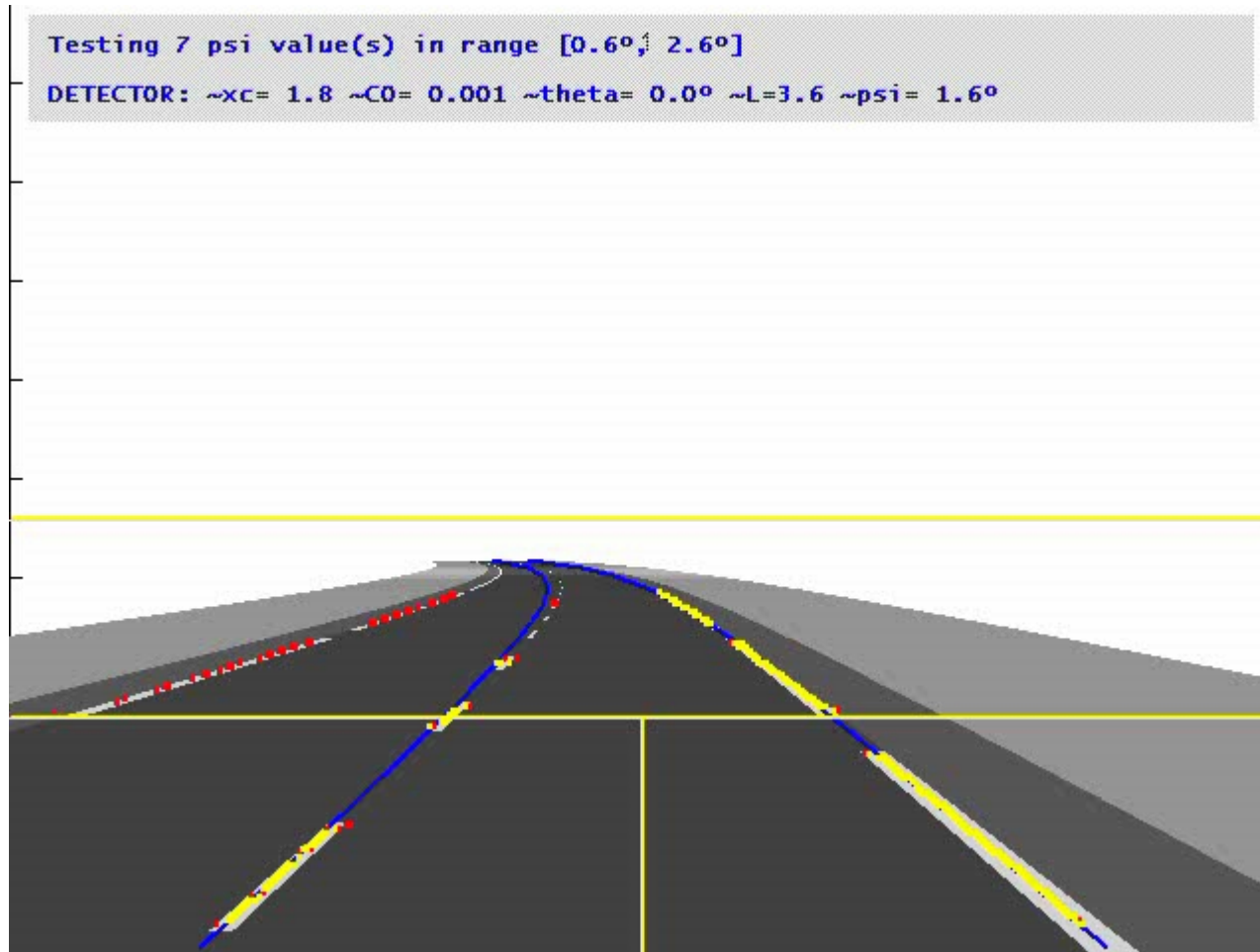
- smoothly varying curvature
- slope changes
- varying pitch angle  
(horizon line)

# Results



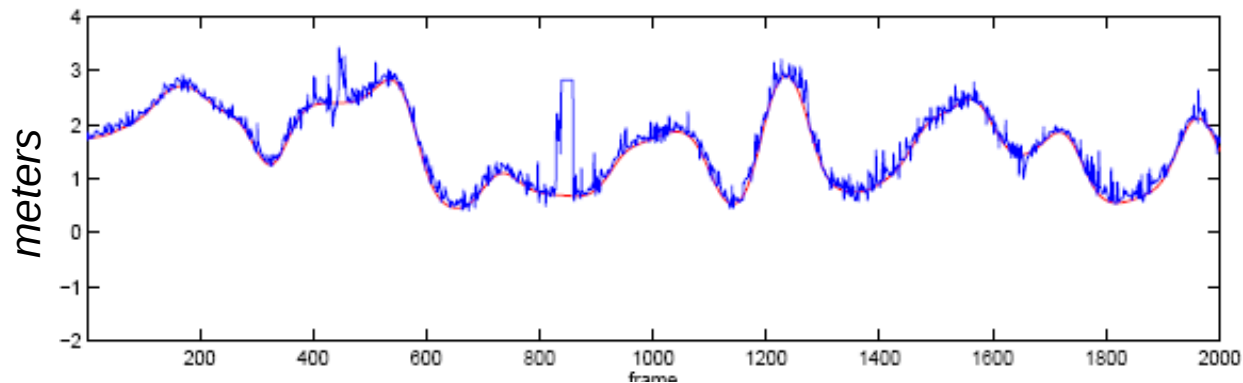


# Results

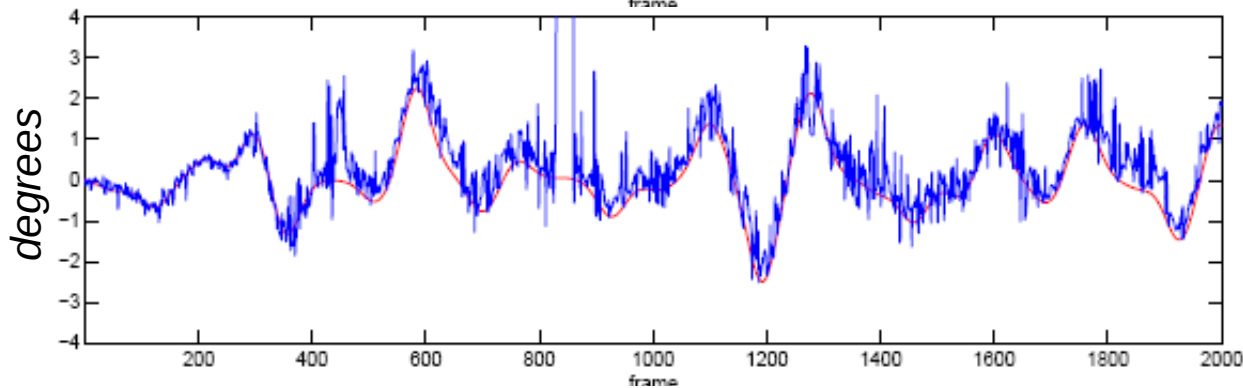


computed  
ground truth

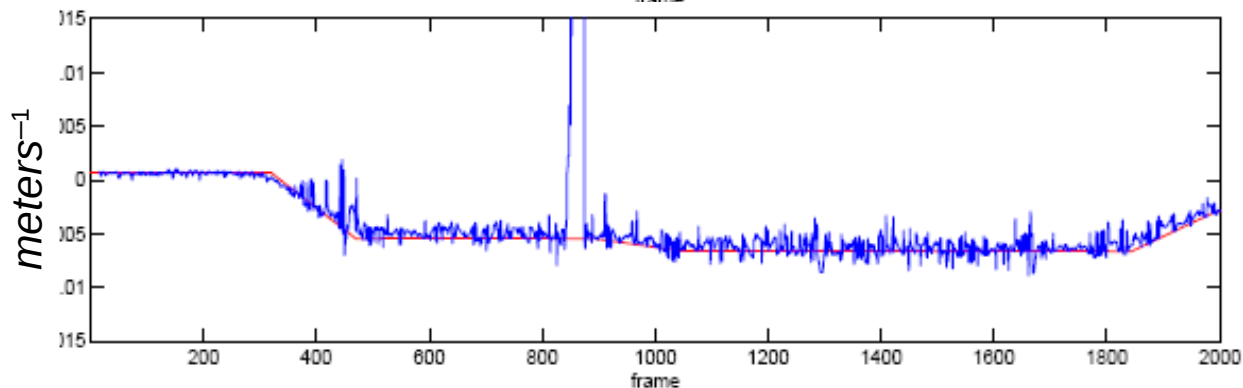
# Results



$x_c$  lateral displacement



$\theta$  vehicle direction  
w.r.t lane axis

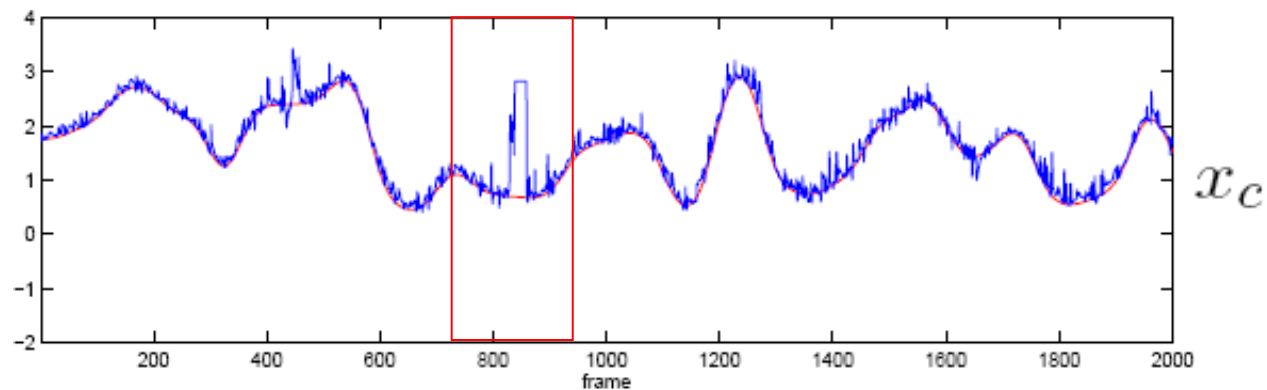
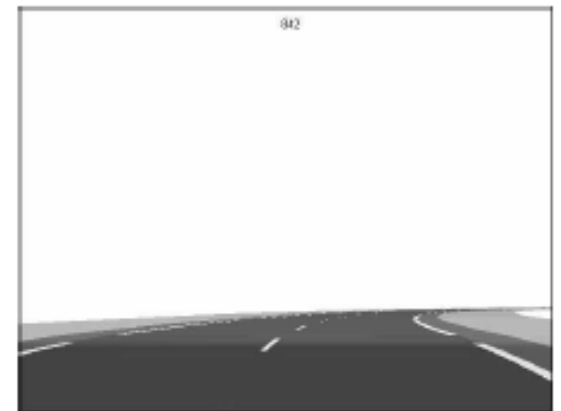
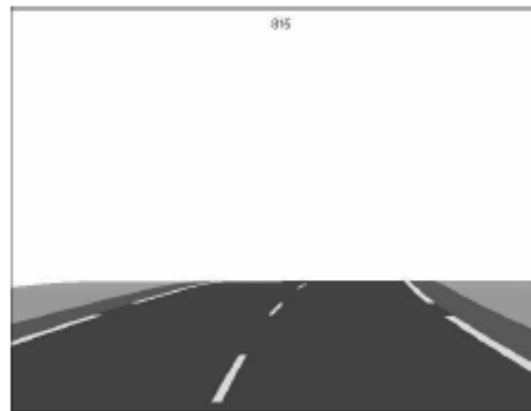
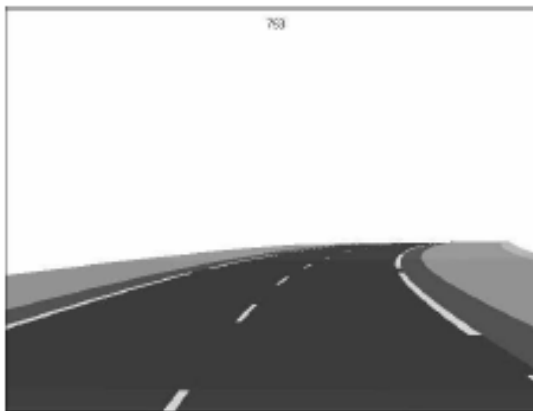


$C_0$  road curvature

# Results



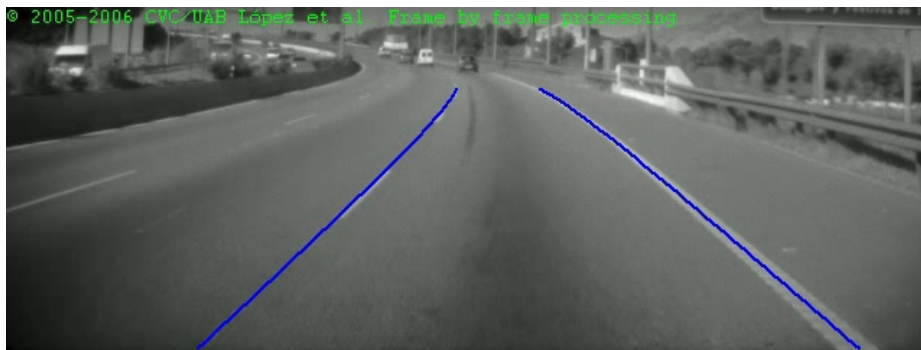
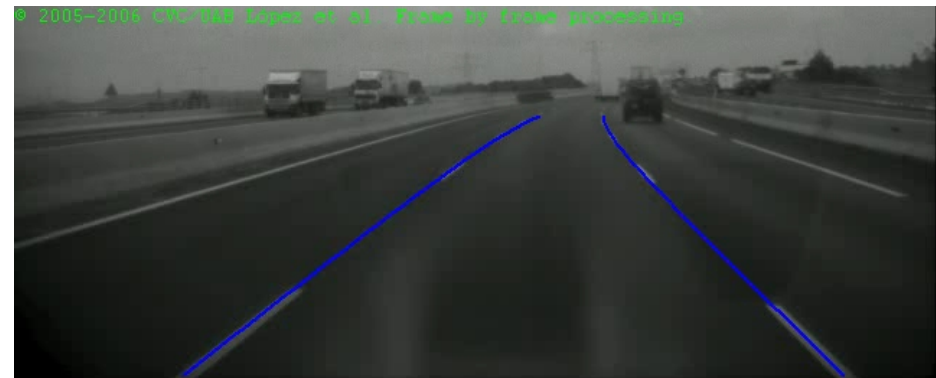
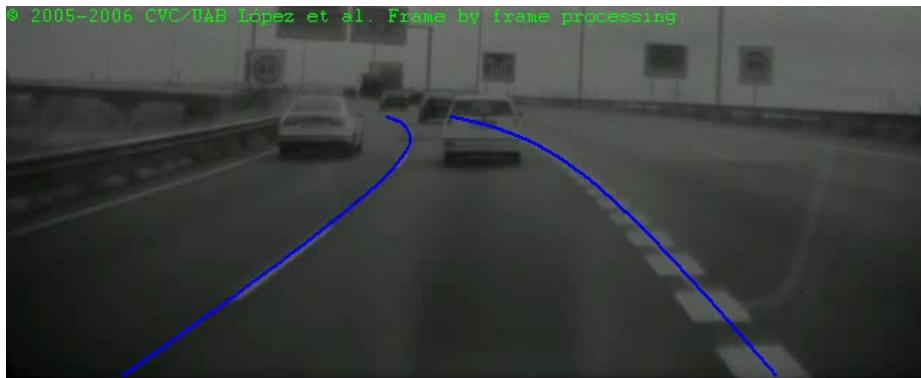
A negative slope change shrinks the road region, causing large errors



# Results



Curved lane lines: 40 ms/frame, 2Ghz Pentium IV



More results at  
[www.cvc.uab.es/adas/projects/lanemarkings/IbPRIA07.html](http://www.cvc.uab.es/adas/projects/lanemarkings/IbPRIA07.html)



# Conclusions



Contribution:

- robust lane lines extraction
- estimation of 4 useful parameters for ADAS applications
- real time
- frame by frame processing
- quantitative evaluation on synthetic sequences

But there is still room for improvement:

- estimation of pitch angle  $\varphi$
- enforce temporal continuity (e.g. Kalman filtering)
- relax assumptions of flat road and constant piecewise curvature

# Results



Straight lane lines: 15 ms/frame

