# Real Time Vehicle Country of Origin Classification Based on Computer Vision 

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## University of Zagreb

- University of Zagreb, Croatia
- Established in 1669.
- 29 faculties and 3 academies

- 4.850 research staff members and 50.000 students
- Faculty of Transport and Traffic Sciences
- Established in 1984.
- 15 departments
- Cover all transport modes, logistics, ITS, aeronautics
- 100 research staff members / 2.200 students
- Publisher of the journal
- PROMET - Traffic \& Transportation

- Cited in SCIE, TRIS, Geobase, FLUIDEX, and Scopus


## Outline

- Introduction
- Problems and approaches
- Vehicle classification
- Vehicle detection and license plate recognition
- Vehicle detection speed up
- Experimental results
- Conclusion and future work


## Introduction

- Faculty of Transport and Traffic Sciences - Computer Vision Group
- Developing algorithms for road traffic analysis based on computer vision
- Applications
- Traffic management
- Dynamic behaviour of a road traffic system derived from known parameters
- Traffic flow between nodes in a traffic network
- Driver information system
- Origin-Destination analysis of traffic on highways
- Computation of current and estimated OD matrices of a road traffic network
- Possibility to estimate the route of a traced vehicle


## Problems and approaches

- Problems of manual measurement of traffic parameters
- Inaccurate data due to human error
- Impracticable to measure data $24 / 7$
- Measuring number of passed vehicles on complex intersections requires a large number of people for counting
- Increase need in human resources
- Impracticable to measure complex traffic parameters (vehicles queue, vehicle velocity, distance between vehicles)
- Sensors for measuring traffic parameters
- Pneumatic road tube sensors and piezoelectric sensors
- Inductive loops and magnetic sensors
- Radars, LIDARs
- Video cameras (color, IR, multi-spectral)

- Current commercial systems use one camera per lane
- Detection and tracking of vehicles
- Based on performing segmentation between objects of interest and noninterest objects using


ARH


Tattile various image processing methods ( $\mathrm{Fg} / \mathrm{Bg}$ image segmentation, optical flow, Haar method, Hough method)

- Estimation of vehicle trajectory
- Based on knowing vehicle location at certain time
- Describing vehicle movement by mathematical models which take into account vehicle dynamics
- Estimating next possible location (trajectory) of the vehicle


## Problems and approaches <br> OD matrix analysis

- Trajectory of moving vehicle through road traffic network (from node A to node B)
- Providing unique identification to each vehicle that is passing through road traffic network using automatic number (license) plate recognition
- Reduction of false positive/negative vehicles using additional statistical information given from origindestination (OD) matrix



## Vehicle classification System architecture



## Vehicle detection

- Application objectives
- Detection of vehicles in video
- Tracking static vehicles (if vehicle stops to move)
- Vehicle license plate recognition for further traffic analysis
- Vehicle detection
- Pre-processing image imported from video with Gaussian blur filter
- Passing image through foreground / background image segmentation algorithm
- Finding contours which localize regions of detected vehicles


## Vehicle detection Speed up

- Disadvantages of currently developed application
- Vehicle detection depends on license plate recognition
- High requirements for system resources (slow execution of algorithm due to sub-optimal approach)
- Optimization approach
- Executing algorithms on GPU as much as possible
- Adding support for CPU SIMD instructions to algorithms which are incapable to run on GPU
- Performing computations using multiple threads
- Parallelization of image processing algorithms


## Experimental results Accuracy and execution time

- Accuracy

| Approach | Total <br> evaluation <br> time [min] | Real vehicle <br> Count | Corrected <br> Vehicles | Wrong <br> Vehicles | Correct/Real [\%] |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Analysis with <br> sharpener filter | 30 | 534 | 507 | 27 | $94 \%$ |
| Analysis without <br> sharpener filter | 30 | 532 | 515 | 17 | $96 \%$ |

- Execution time

| Approach | Contours for loop |  | Processing time of <br> an image with vehicle |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Avg time <br> $[\mathrm{ms}]$ | Min time [ms] | Avg time [ms] | Min time [ms] |
| Single-thread | 909 | 100 | 904 | 100 |
| Multi-thread | 5 | 4 | 14 | 13 |

## Experimental results Vehicle classification

- Extracted classification of vehicles by its country of origin
- Test video length - 30 [min]

| COUNTRY | NUMBER <br> OF VEHICLE | RATIO <br> [\%] |
| :--- | :---: | :---: |
| Germany | 166 | 31.2 |
| Poland | 88 | 16.5 |
| Austria | 83 | 15.6 |
| Czech Republic | 72 | 13.5 |
| Croatia | 17 | 8.8 |
| Slovenia | 13 | 3.2 |
| Turkey | 11 | 2.4 |
| Slovakia | 35 | 6.8 |
| Others | $\mathbf{5 3 2}$ | $\mathbf{1 0 0}$ |
| Total |  |  |



## Experimental results Arised problems

- Overlapping vehicles cause false positive and false negative detections
- Environment conditions (sun reflection, rapid lighting changes), camera vibrations caused by strong wind or passing of large vehicles



## Conclusion <br> Future work

- Developed application has shown possibility of extracting a large number of information from video footage
- License plate number - vehicle country of origin, vehicle trajectory, flow, number of vehicles, etc.
- One camera can be used for multiple lanes
- First results promising
- Further development of the application is currently in progress and it consists of following goals
- Estimation of vehicle trajectory on a road traffic network
- Detection and analysis of vehicle queue
- Determination of vehicle velocity
- Computation of origin-destination matrix of large road traffic network for purposes of traffic modelling


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- University of Zagreb, Faculty of Transport and Traffic Sciences


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