

# How Many Ways to Crash?

TRB Annual Meeting

Nicolas Saunier  
nicolas.saunier@polymtl.ca



ÉCOLE  
**POLYTECHNIQUE**  
M O N T R É A L

January 13<sup>th</sup> 2010

Collaboration with Karim Ismail, Clark Lim and Tarek Sayed  
University of British Columbia

# Outline

Motivation

Probabilistic Framework for Automated Road Safety Analysis

Experimental Results using Video Data

Conclusion

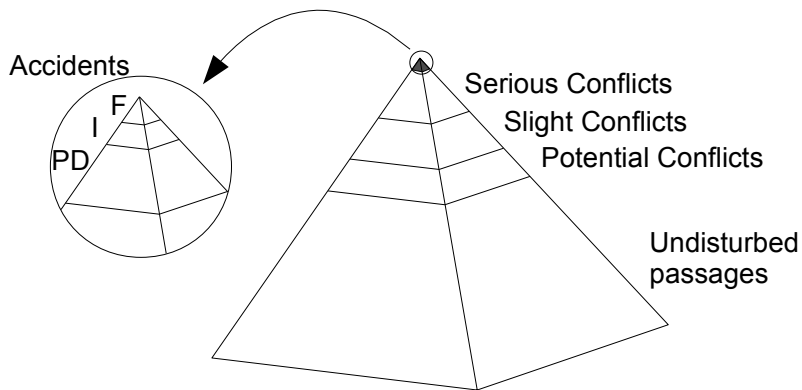
# Road Safety Analysis

- Limits of the traditional approach based on historical collision data:
  - Problems of availability and quality,
  - Insufficient data to understand the mechanisms that lead to collisions,
  - **Reactive** approach.
- Need for **proactive** approaches and **surrogate** safety measures that do not depend on the occurrence of collisions.

# Surrogate Safety Measures

- Research on surrogate safety measures that
  - bring complementary information,
  - are related to traffic events that are more frequent than collisions and can be observed in the field,
  - are correlated to collisions, logically and statistically.
- A **traffic conflict** is “an observational situation in which two or more road users approach each other in space and time to such an extent that a collision is imminent if their movements remain unchanged” [Amundsen and Hydén, 1977].

# The Safety/Severity Hierarchy



Various severity measures.

# The Collision Course

- A traffic conflict is “an observational situation in which two or more road users approach each other in space and time to such an extent that a collision is imminent **if their movements remain unchanged**”.
- For two interacting road users, **many** chains of events may lead to a collision.
- It is possible to estimate the probability of collision if one can **predict** the road users' future positions.

## What about Evasive Actions?

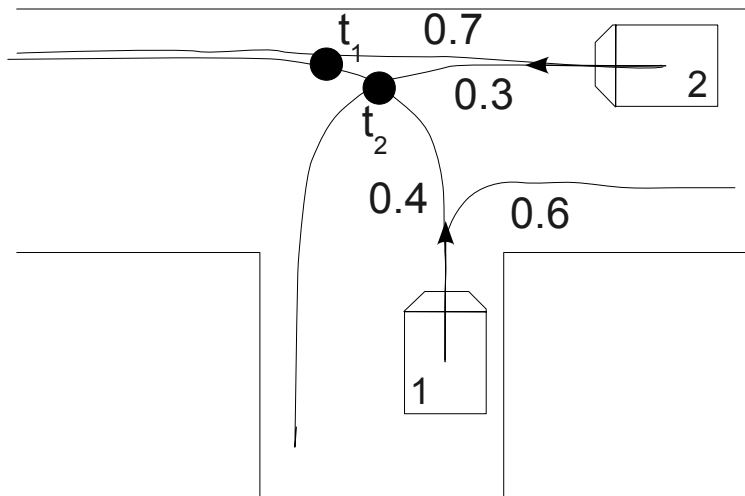
- Necessary by construction for traffic conflicts.
- The severity of a traffic conflict does not depend on the characteristics of the evasive action (e.g. the Swedish traffic conflict technique).
- The emphasis on evasive actions is most likely related to the traffic conflict collection techniques: emergency evasive actions are relatively easy to identify by observers in the field.
- Future work: understand why collisions are avoided, and the link between interactions with and without a collision.

# Movement Prediction

- Learn road users' **motion patterns** (including frequencies), represented by actual trajectories called **prototypes**
- Match observed trajectories to prototypes and extrapolate



# A Simple Example

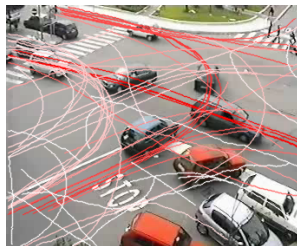
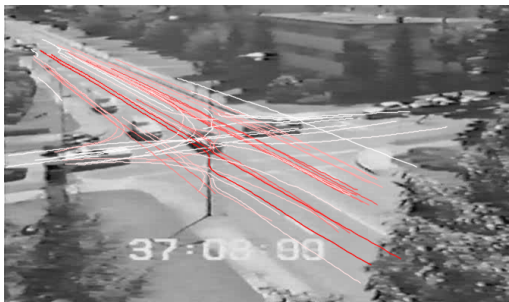


## Collision Points

Using of a finite set of extrapolation hypotheses, **enumerate** the collision points  $CP_n$ . Severity indicators can then be computed:

$$P(\text{Collision}(U_i, U_j)) = \sum_n P(\text{Collision}(CP_n))$$
$$TTC(U_i, U_j, t_0) = \frac{\sum_n P(\text{Collision}(CP_n)) t_n}{P(\text{Collision}(U_i, U_j))}$$

# Motion Pattern Learning



Traffic Conflict Dataset, Vancouver	Reggio Calabria, Italy
58 prototype trajectories (2941 trajectories)	58 prototype trajectories (138009 trajectoires)

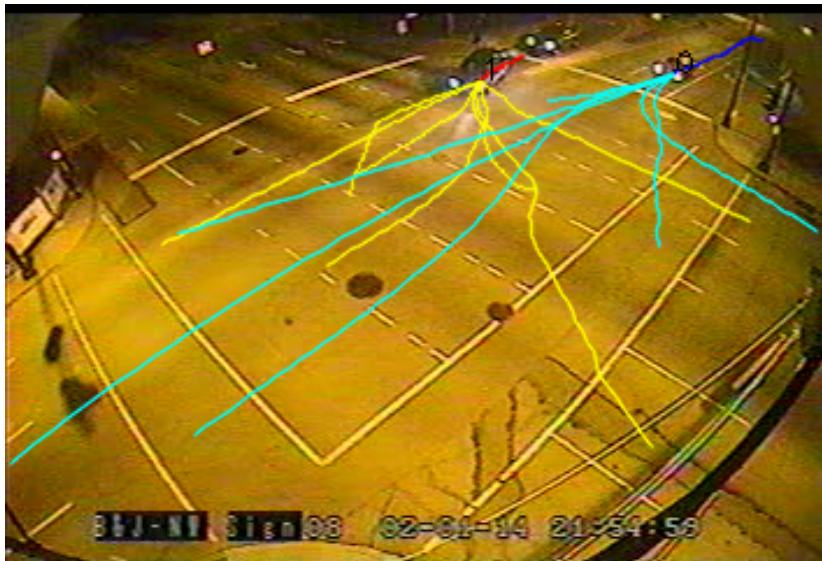
# Road User Tracking



# Motion Prediction



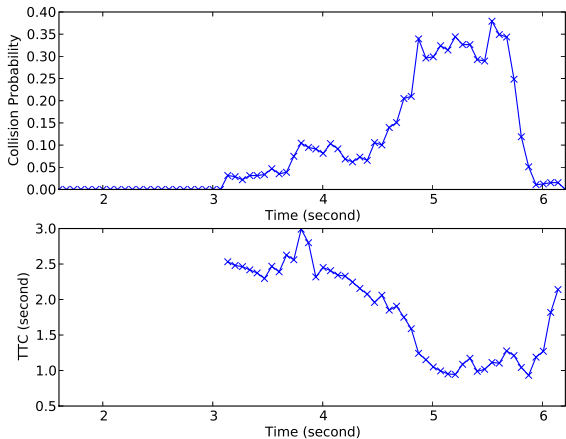
# Motion Prediction



# Motion Prediction



# The Severity Indicators



Parallel conflict, Kentucky dataset



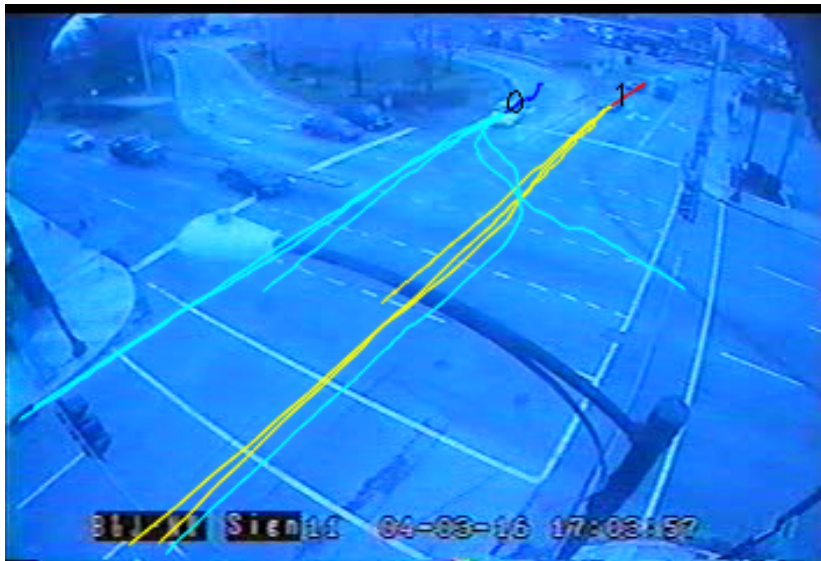
# Road User Tracking



# Motion Prediction



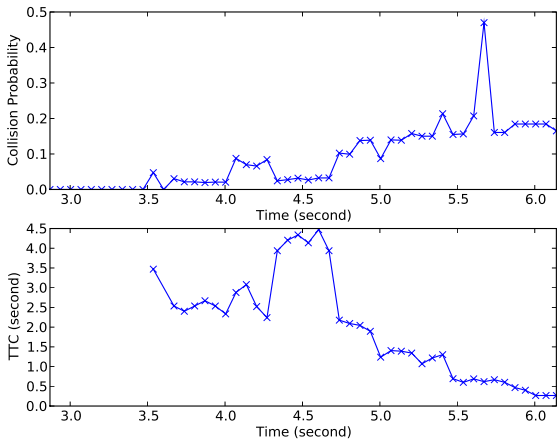
# Motion Prediction



# Motion Prediction

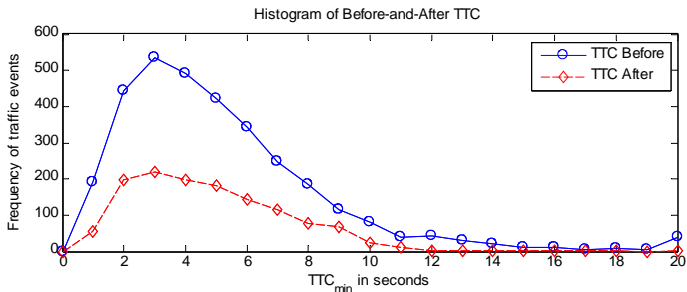


# The Severity Indicators



Parallel collision, Kentucky dataset

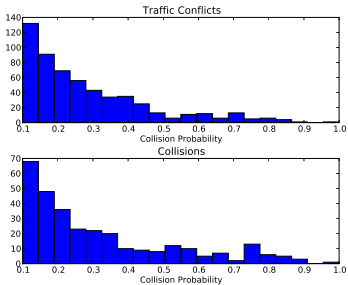
# Distribution of Severity Indicators



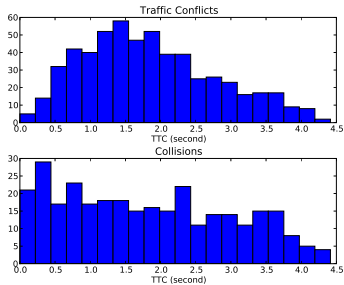
Before and after study, Oakland, CA.

# Distribution of Severity Indicators (2)

## Maximum Collision Probability

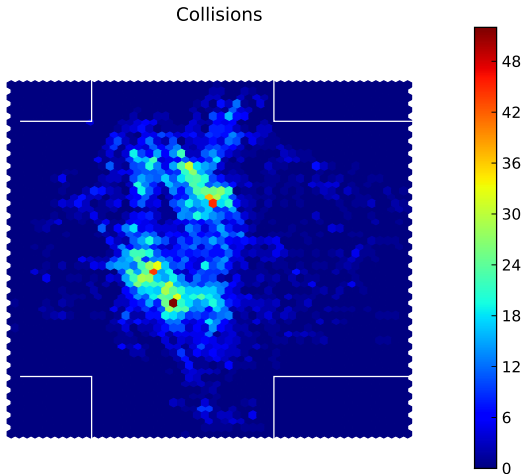


## Minimum TTC



Kentucky dataset.

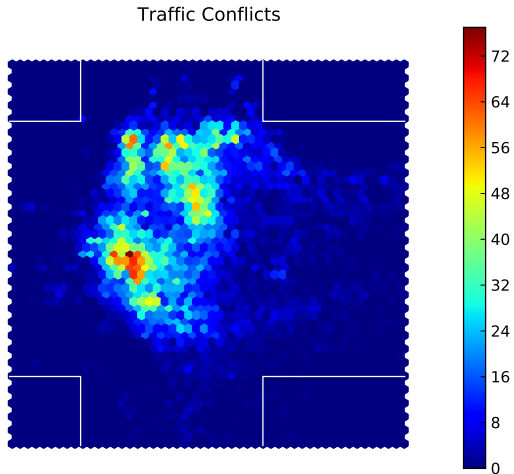
# Spatial Distribution of the Collision Points



Kentucky dataset.



# Spatial Distribution of the Collision Points



Kentucky dataset.

# Conclusion

- Tools and framework for automated road safety analysis using video sensors
- Data mining and visualization for safety analysis
- Future work:
  - Validation of proactive methods for road safety analysis (Clark Lim and Tarek Sayed at UBC)
  - Understanding and modelling of the mechanisms that lead to accidents (École Polytechnique de Montréal)
- Need for more open science: data and code sharing  
`http://nicolas.saunier.confins.net`

Questions ?

-  Amundsen, F. and Hydén, C., editors (1977).  
*Proceedings of the first workshop on traffic conflicts*, Oslo, Norway. Institute of Transport Economics.
-  Ismail, K., Sayed, T., and Saunier, N. (2010).  
Automated analysis of pedestrian-vehicle conflicts: A context for before-and-after studies.  
*In Transportation Research Board Annual Meeting Compendium of Papers*, Washington, D.C.  
10-3739. Under consideration for publication in  
*Transportation Research Record: Journal of the Transportation Research Board*.
-  Saunier, N. and Sayed, T. (2008).  
A Probabilistic Framework for Automated Analysis of Exposure to Road Collisions.  
*Transportation Research Record: Journal of the Transportation Research Board*, 2083:96–104.
-  Saunier, N., Sayed, T., and Ismail, K. (2010).

Large scale automated analysis of vehicle interactions and collisions.

*In Transportation Research Board Annual Meeting Compendium of Papers, Washington, D.C.*

10-4059. Under consideration for publication in *Transportation Research Record: Journal of the Transportation Research Board*.



Saunier, N., Sayed, T., and Lim, C. (2007).

Probabilistic Collision Prediction for Vision-Based Automated Road Safety Analysis.

*In The 10<sup>th</sup> International IEEE Conference on Intelligent Transportation Systems*, pages 872–878, Seattle. IEEE.



Sonnenburg, S., Braun, M. L., Ong, C. S., Bengio, S., Bottou, L., Holmes, G., LeCun, Y., Müller, K.-R., Pereira, F., Rasmussen, C. E., Rätsch, G., Schölkopf, B., Smola, A., Vincent, P., Weston, J., and Williamson, R. (2007).

The need for open source software in machine learning. *Journal on Machine Learning Research*, 8:2443–2466.