

Autonomous Driving in Urban Environments: Boss and the Urban Challenge

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CMU, GM, Caterpillar, Continental, Intel

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OUTLINE

- Introduction
- Moving Obstacle Detection and Tracking
- Curb Detection Algorithm
- Intersections and Yielding
- Distance Keeping and Merge Planning
- Lessons learned
- Conclusion

Urban Challenge

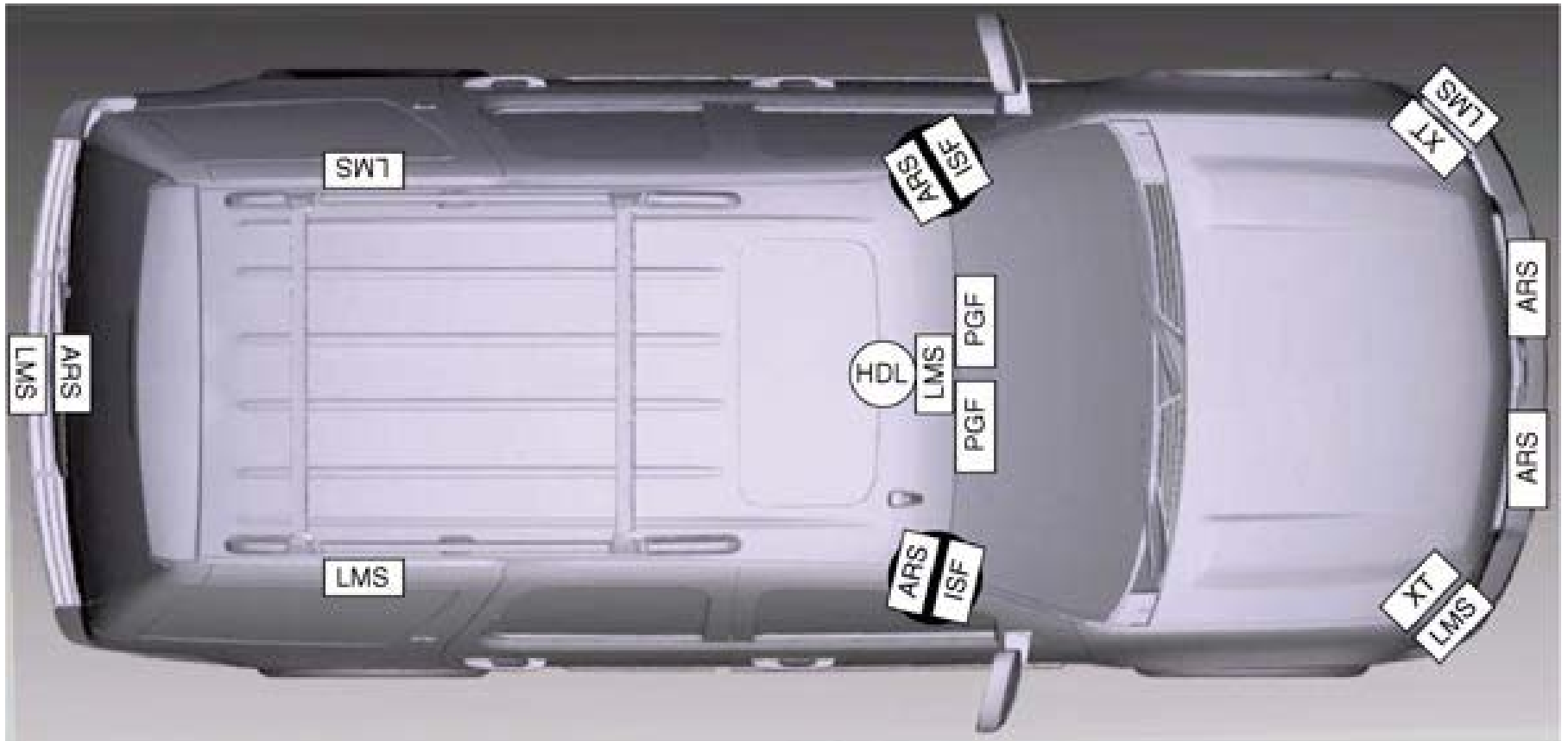
- Launched by DARPA(Defense Advance Research Project Agency)
- Develop Autonomous vehicles
- Target: US military ground vehicles be unmanned by 2015

BOSS

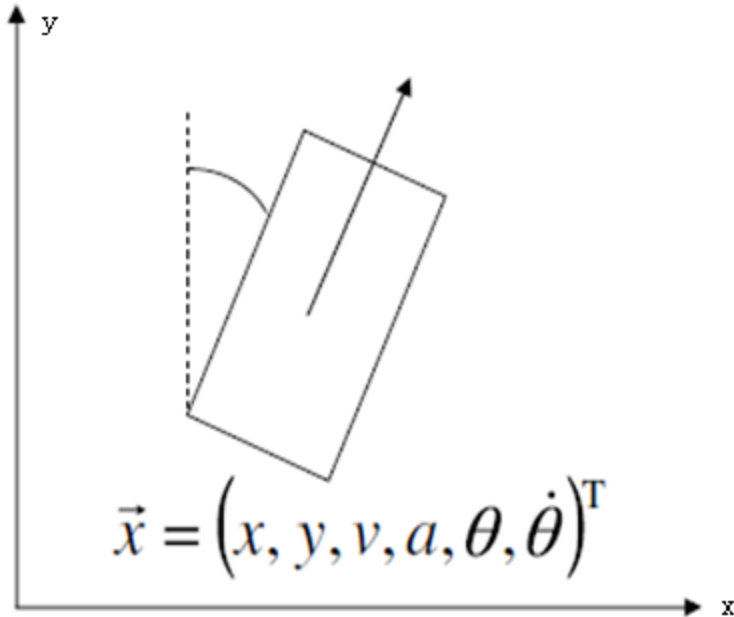
- Team from CMU, GM, Caterpillar, Continental, Intel
- Modified from 2007 Chevrolet Tahoe to provide computer control
- Equipped by drive-by-wire system
- Controlled by CompactPCI with 10 2.16GHz Core2Duo CPU
- Won 2007 urban challenge



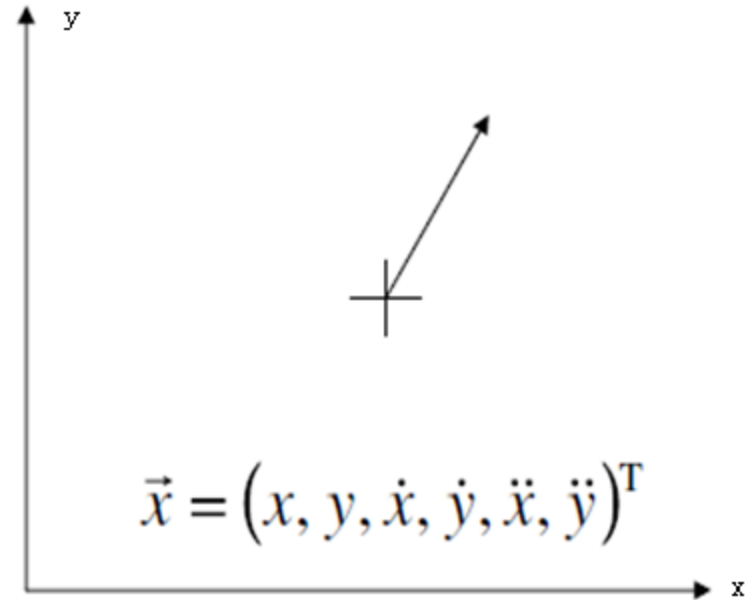
Sensors



Moving Obstacle Detection and Tracking



Fix shape rectangular model

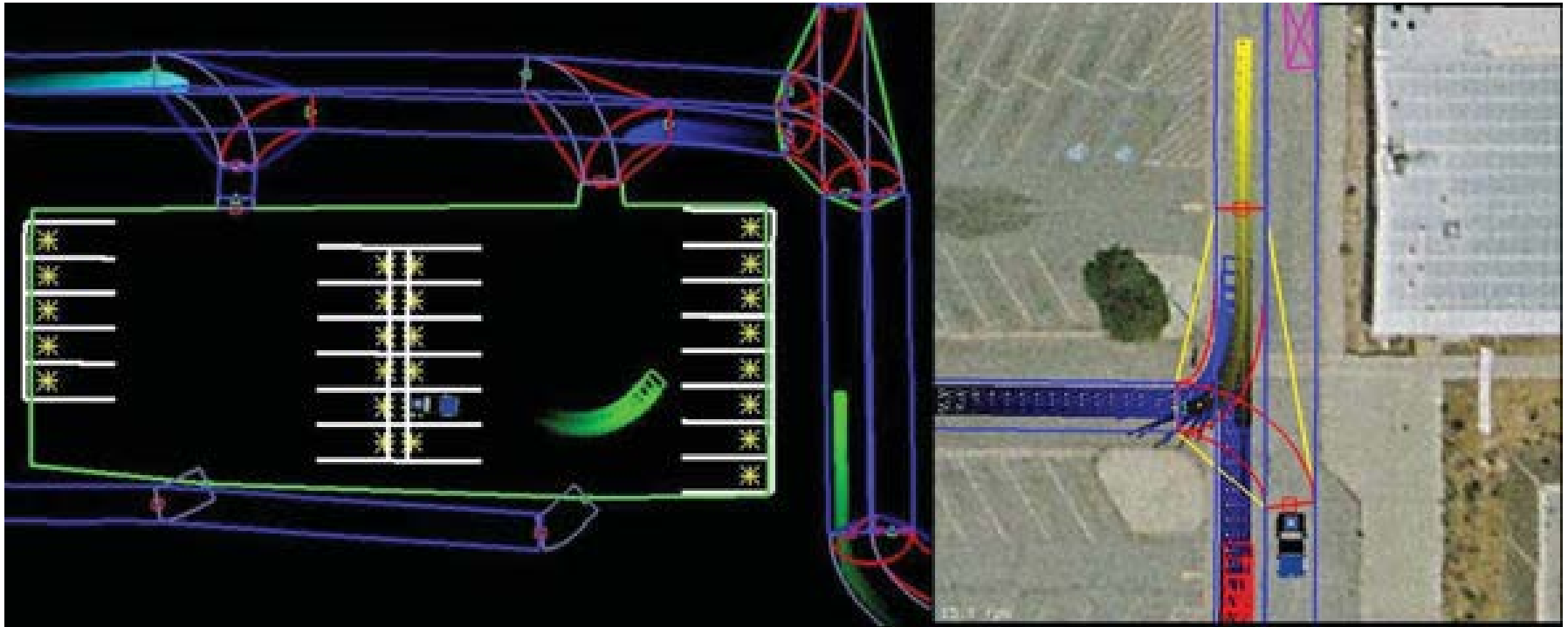


Point model

Object classification

- moving or not moving
 - Moving flag is set when a speed is detected
- Observed moving or not observed moving
 - Observed moving flag is set when keep moving more than a period of time

Predicts the motion of tracked vehicles

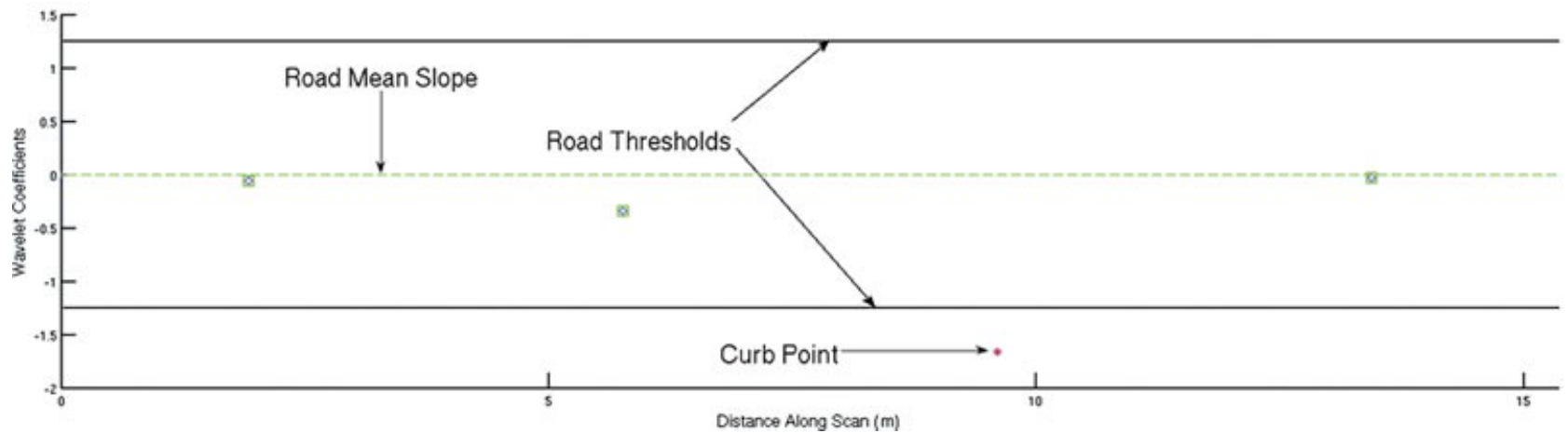
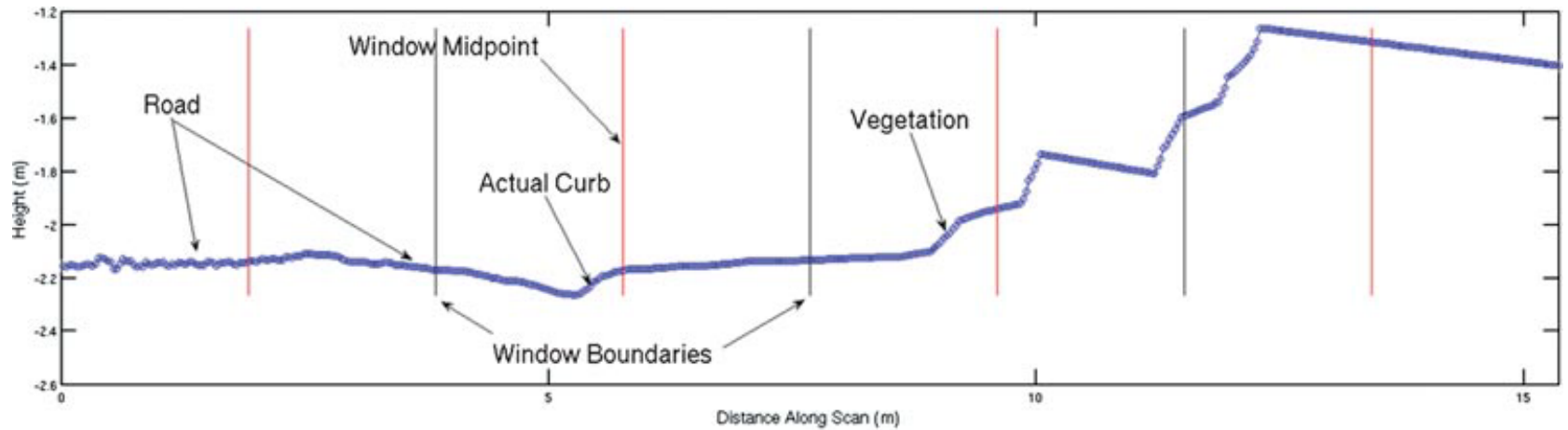


Curb detection algorithm

Wavelet-based feature extraction

- $\Psi(t) = \begin{cases} 1 & \text{if } 0 \leq t < \frac{1}{2}, \\ -1 & \text{if } \frac{1}{2} < t < 1, \\ 0 & \text{otherwise,} \end{cases}$
- $\varphi(2^j t - i) = \begin{cases} 1 & \text{if } 0 \leq t < 1, \\ 0 & \text{otherwise,} \end{cases} \quad j > 0 \wedge 0 \leq i \leq 2^j - 1.$

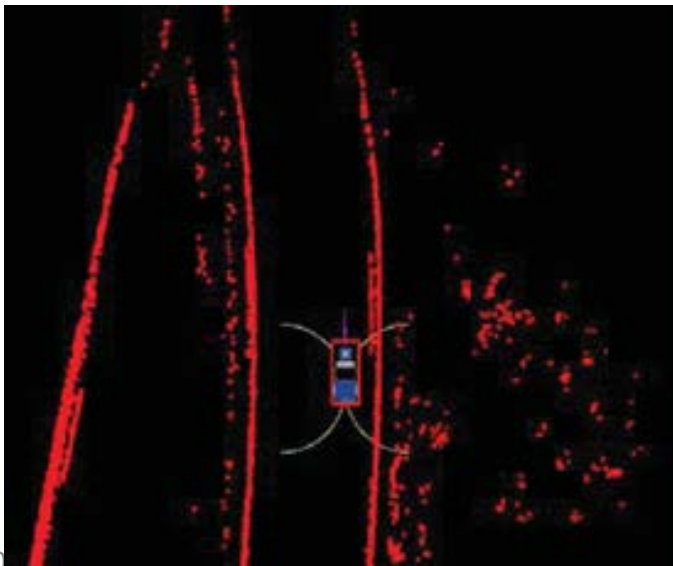
Wavelet-based feature extraction



Wavelet-based feature extraction

- Collect coefficients for the current level i
- Label each coefficient with label of level $i-1$
- Compute \hat{y}_{road} using these labels
- $$\text{Class}(y[n], i) = \begin{cases} 1 & \text{if } y[n] - \hat{y}_{road} \geq d_i \\ 0 & \text{otherwise} \end{cases}$$

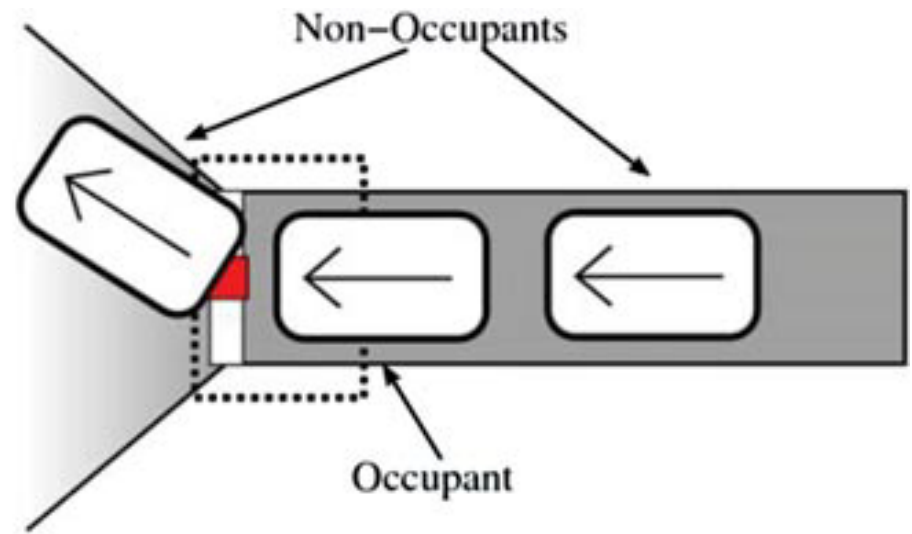
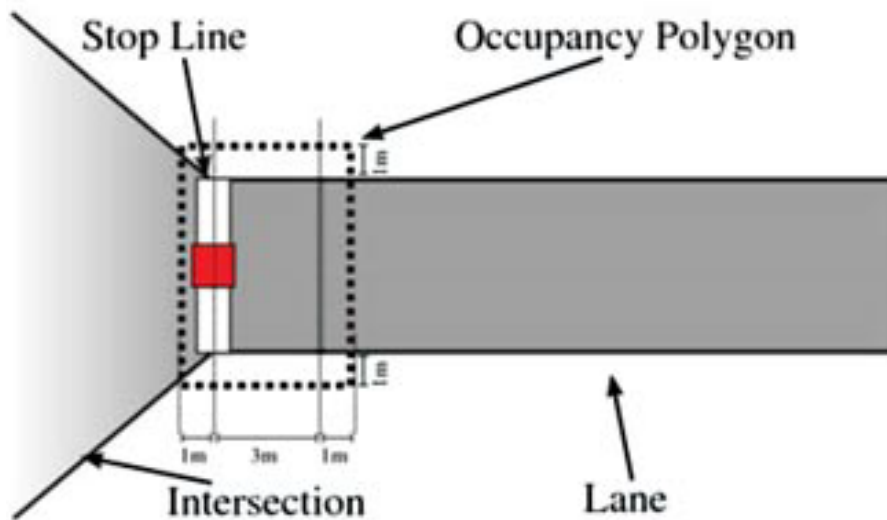
Performance of the algorithm



Intersections and Yielding

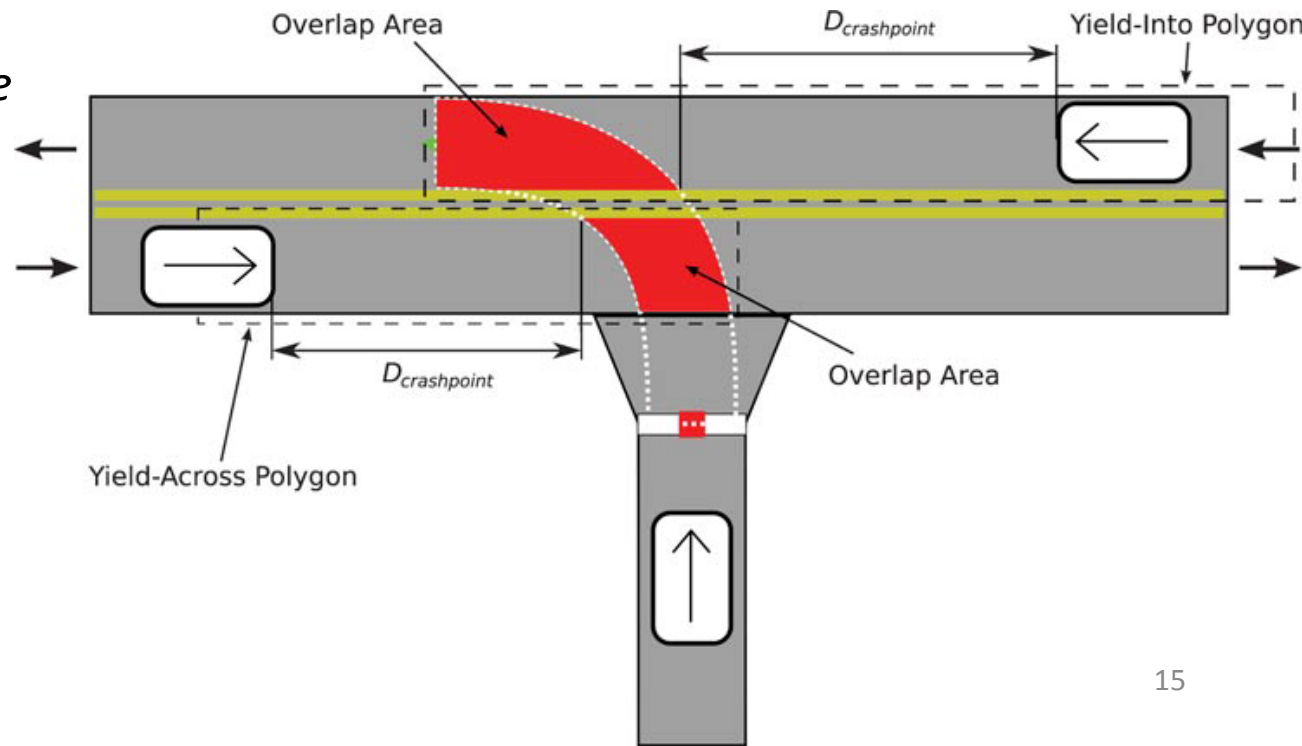
- Intersection-Centric Precedence Estimation
- Yielding

Intersection-Centric Precedence Estimation



Yielding

- $T_{required} = T_{act} + T_{delay} + T_{space}$
- $L_{yeild\ polygon} = V_{maxlane} \cdot T_{required} + d_{safety}$
- $T_{arrival} = d_{crash} / v_{obstacle}$
- $T_{arrival} > T_{require}$



Distance Keeping and Merge Planning

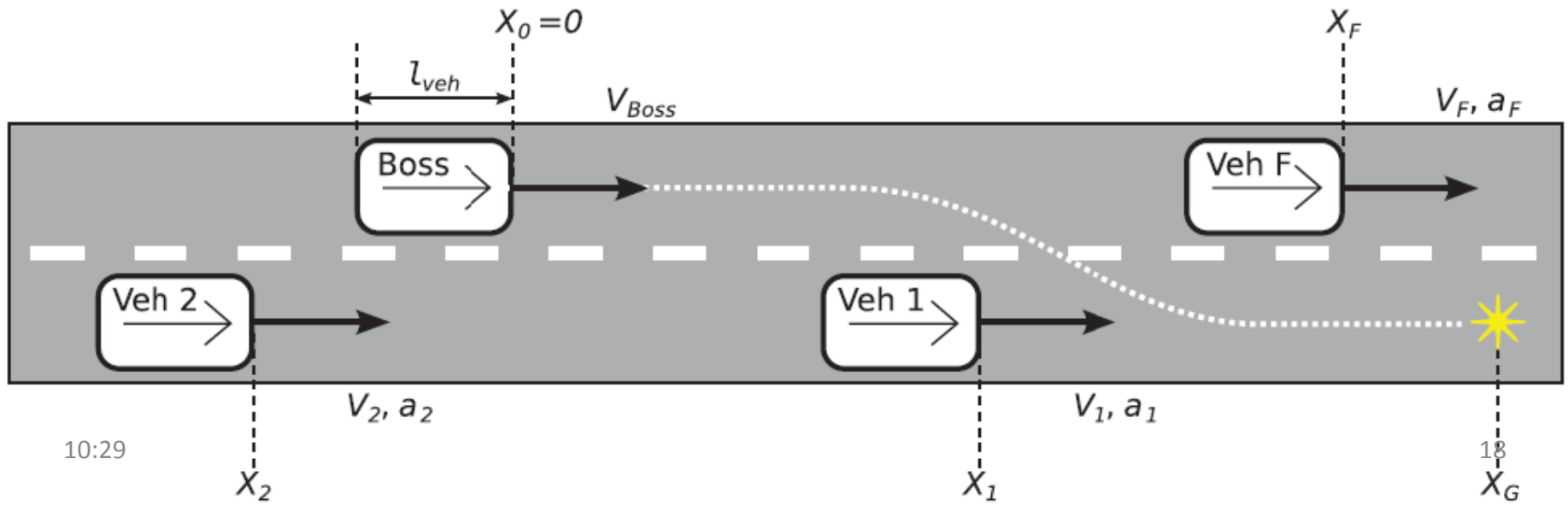
- Distance Keeping
- Merge Planning

Distance Keeping

- $v_{\text{cmd}} = K_{\text{gap}} \cdot (d_{\text{target}} - d_{\text{desired}})$
- $d_{\text{desired}} = \max(v_{\text{target}} \cdot l_{\text{vehicle}} / 10, d_{\text{mingap}})$
- $a_{\text{cmd}} = a_{\text{min}} + K_{\text{acc}} v_{\text{cmd}} \cdot (a_{\text{max}} - a_{\text{min}})$

Merge Planning

- $d_{\text{merge}}=12\text{m}$
- $d_{\text{obst}}=v_0 \cdot d_{\text{init}} / (v_0 - v_1)$
- $X_0 - l_{\text{vehicle}} - X_1 \geq \max(v_1 \cdot l_{\text{vehicle}} / 10, d_{\text{mingap}})$
- $X_1 - l_{\text{vehicle}} - X_0 \geq \max(v_1 \cdot l_{\text{vehicle}} / 10, d_{\text{mingap}})$



Lessons Learned

- Sensors are insufficient for urban driving
- Road shape estimation maybe replaced by estimating position relative to the road
- Human level driving require a rich representation
- Validation and verification of the system is an unsolved problem
- Driving is a social activity

Conclusion

- A moving obstacle and static obstacle detection and tracking system
- A road navigation system that combines road localization and road shape estimation where road geometry is not available
- A mixed-mode planning system that is able to both efficiently navigate on roads and safely maneuver through open areas and parking lots
- A behavioral engine that is capable of both following the rules of the road and violating them when necessary
- A development and testing methodology that enables rapid development and testing of highly capable autonomous vehicles

Questions?