
Integrated Collision Warning System for Transit Buses

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Transit ICWS

- Integrated Collision Warning System
- Federal Transit Administration (FTA) merged two existing Intelligent Vehicle Initiative (IVI) transit research efforts:
 - Side collision warning system (SCWS, PA)
 - Forward collision warning system (FCWS, CA)



Primary Warnings

- **Alert: Yellow LEDs**
 - Detected a threat with the potential to become more dangerous
- **Imminent Warning: Red LEDs**
 - Detected a threat with a high probability of making contact with the bus unless evasive action is taken

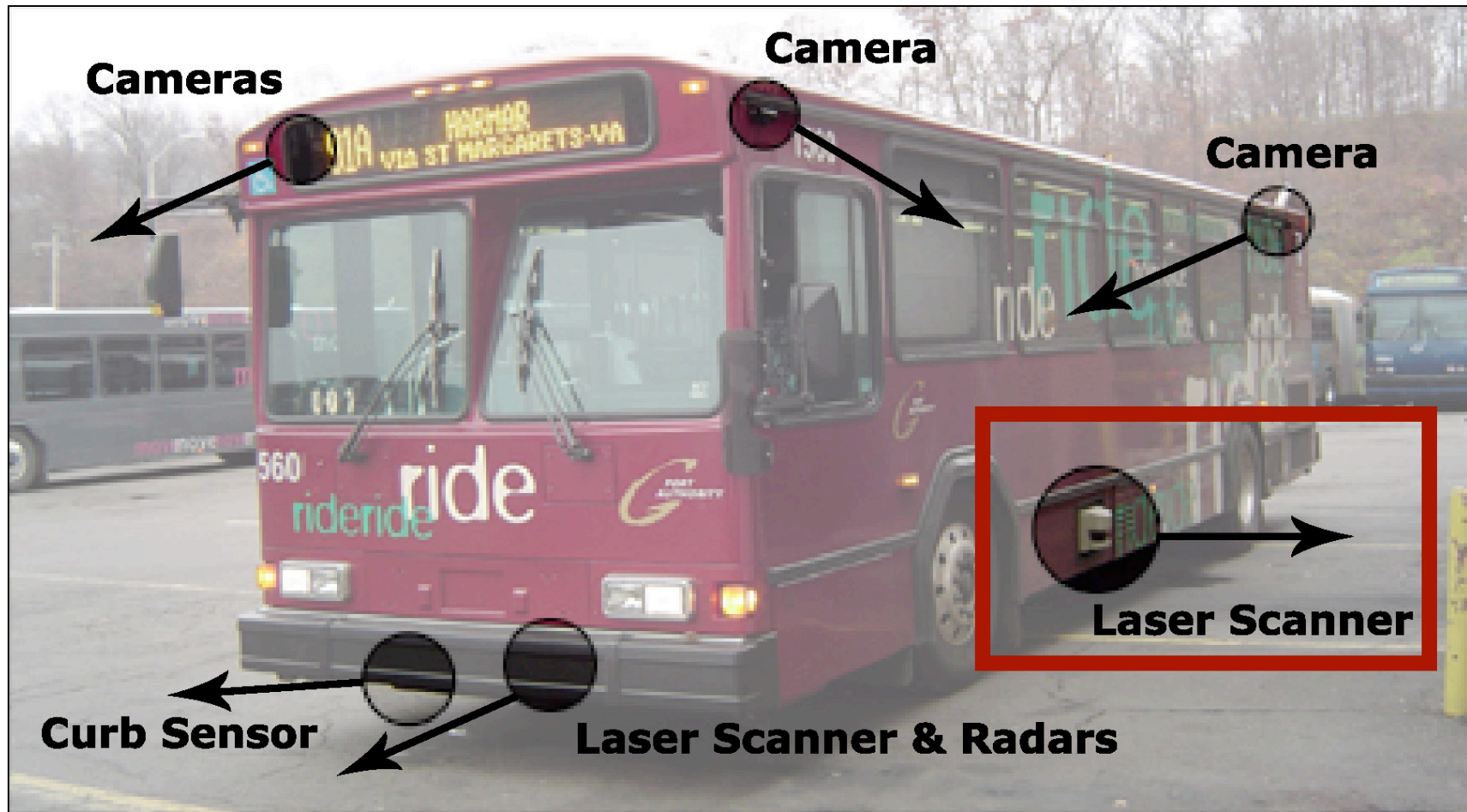


Secondary Warnings

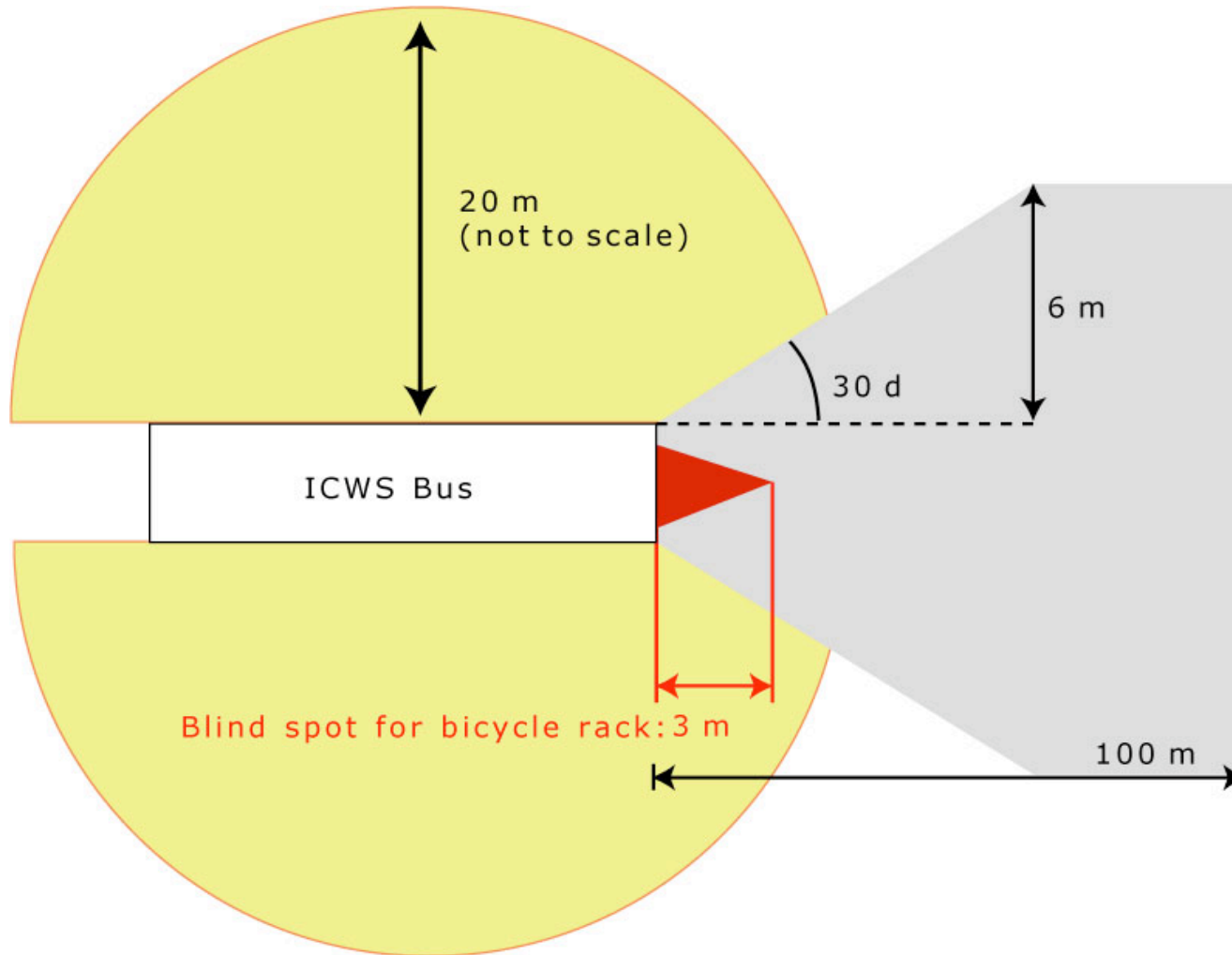
- **Contact: Triangles blink yellow** for the appropriate side
 - Detected a potential side collision
 - Check mirrors and inspect as necessary
- **Under Wheel: Triangles blink red** for the appropriate side
 - Detected a potential pedestrian slipping under the bus
 - Check mirrors and inspect as necessary



Installed External Sensors



Sensor Coverage



Collision Warning

Christoph Mertz



Side Collisions

- Only a very small percentage of side collisions are classical lane change or merge accidents
- Many of the bus accidents involve objects approaching from the side
- The line between safe and unsafe situations is very tight
- In most cases it is not the bus driver who created the dangerous situation

C. Mertz, S. McNeil, and C. Thorpe, "Side collision warning systems for transit buses," *IEEE Intelligent Vehicle Symposium (IV)*, 2000.



Side Collisions (cont.)

- Many of the most serious accidents involve pedestrians
- In a quarter of all pedestrian fatalities, the pedestrian is partially or completely underneath the bus
- In many cases the bus driver does not notice that a collision with a pedestrian happened

C. Mertz, S. McNeil, and C. Thorpe, "Side collision warning systems for transit buses," *IEEE Intelligent Vehicle Symposium (IV)*, 2000.

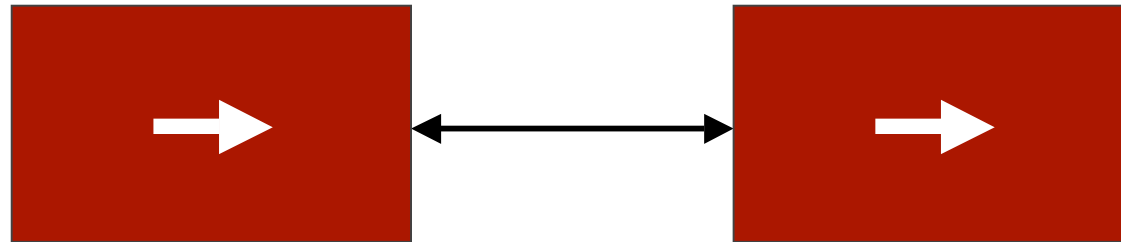


Fundamental Question: What should we warn about?

- What is it that makes a situation dangerous?
- Does the driver decide or the engineer?
- Are there different types of dangerous situations?
- Is there one universal measure?
- What about Contact and Under Wheel warnings?



Typical ID Case



- Warning given if
 - Distance to collision or
 - Time to collision
- is below a given threshold

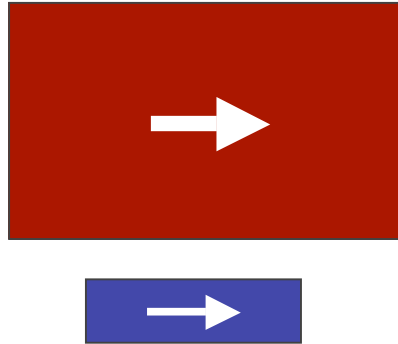


Details to Consider

- Assumption about the lead vehicle, e.g. it will come to a complete stop
- Reaction time of driver
- Response time of vehicle
- Maximum deceleration



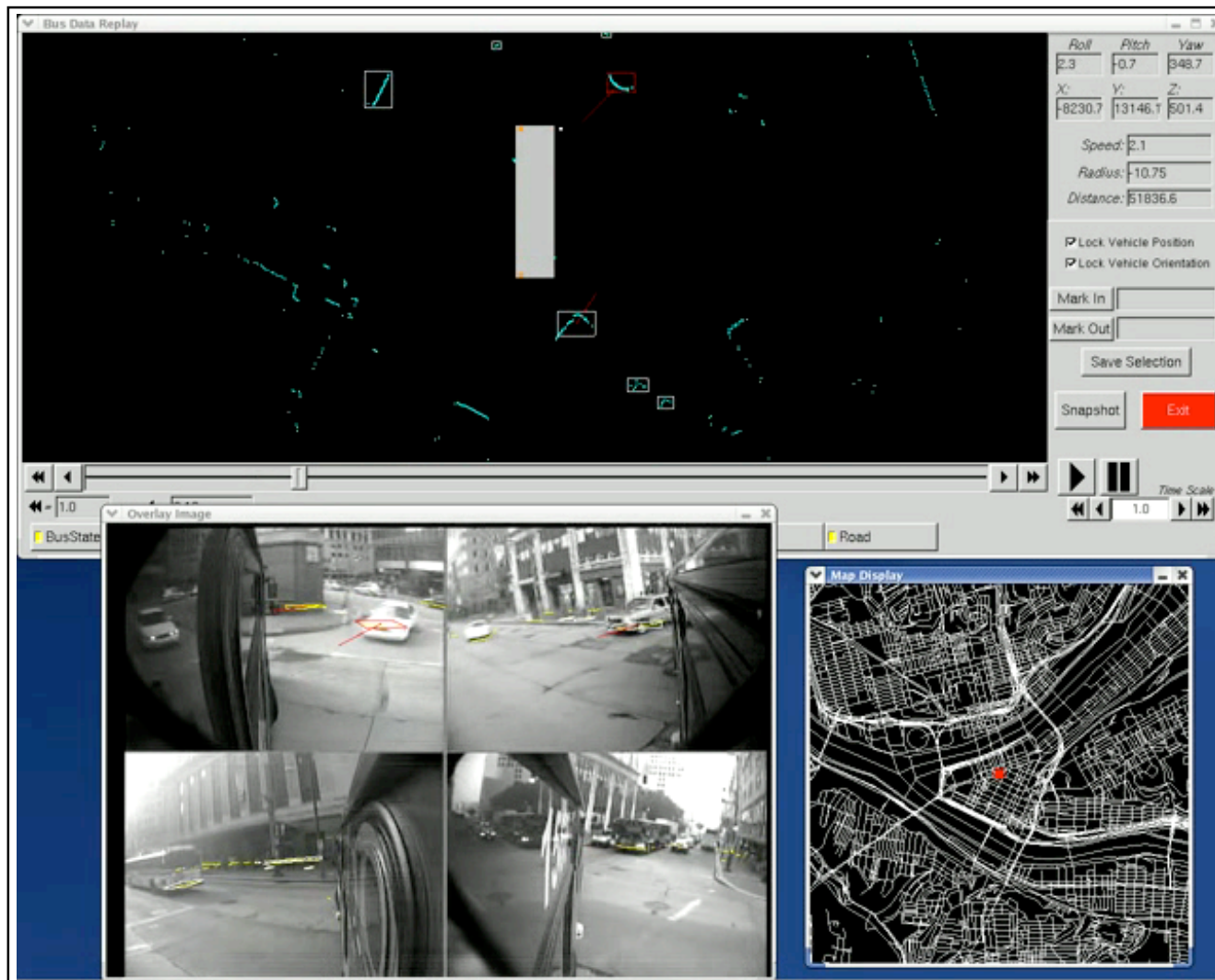
Problem of 2D Cases



- Dangerous or not?
 - Distance to collision is small - dangerous
 - Time to collision is very large - not dangerous
- Slight changes in speed can have large effects on the time to collision.
- Some situations can be very complicated, e.g. several vehicle and pedestrian at an intersection.



Note to Self: This is Hard



Approach:

Probability of collision

- Calculate probability of collision instead of time or distance to collision. Calculation includes:
 - 2D
 - physics equation
 - measurement uncertainties
 - bus + driver model
 - object model
 - environment + object + bus + driver model (e.g. If a pedestrian is on the curb, he/she is much more likely to stay on the curb than to step off the curb)



Mathematical Formulation

$$p(t) = 1 - \int_{all X} w(X, t) dX$$

where:

$$w(X, t) = \begin{cases} 0 & \text{if a collision occurs between } t_0=0 \text{ and } t \\ w(X, t_0=0) & \text{everywhere else} \end{cases}$$

X = vector of all coordinates

$$w(X, t_0 = 0) = S_1(a_1, \Delta a_1) \cdot \dots \cdot G_1(b_1) \cdot \dots \cdot H_1(e_1, X) \cdot \dots$$

S_n = the **error function** of the measured coordinate a_n

G_n = **distribution functions** of the unmeasured quantities b_n

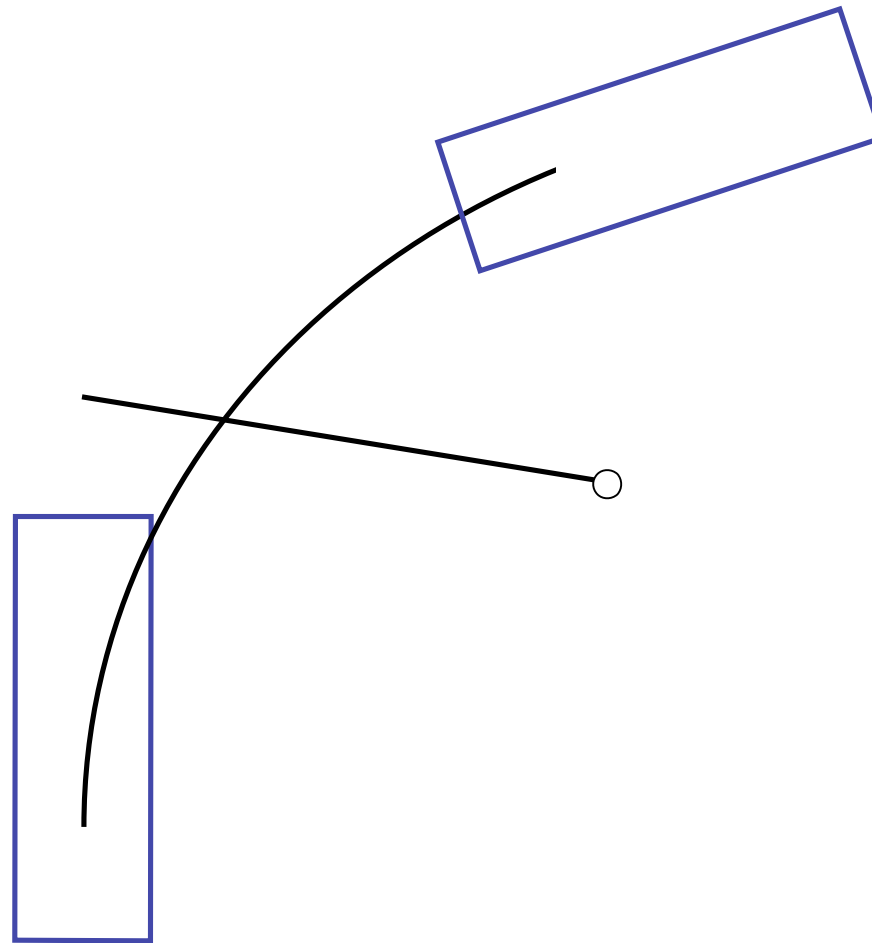
H_n = **weighting functions** taking knowledge of the environment (e_n) into account

Practical implementation: [Monte Carlo integration](#)



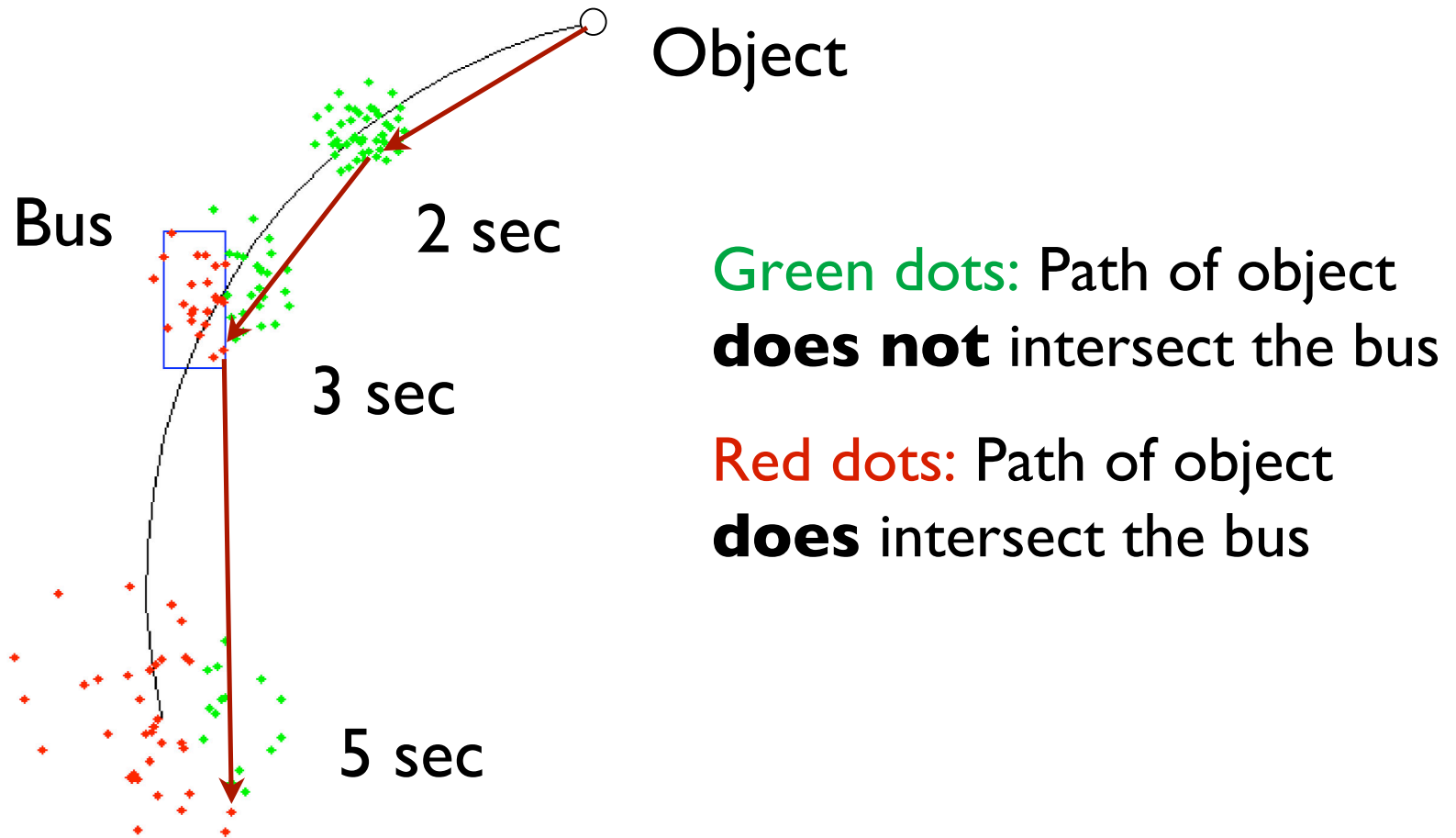
Sample Situation

Bus is turning right while object travels right to left



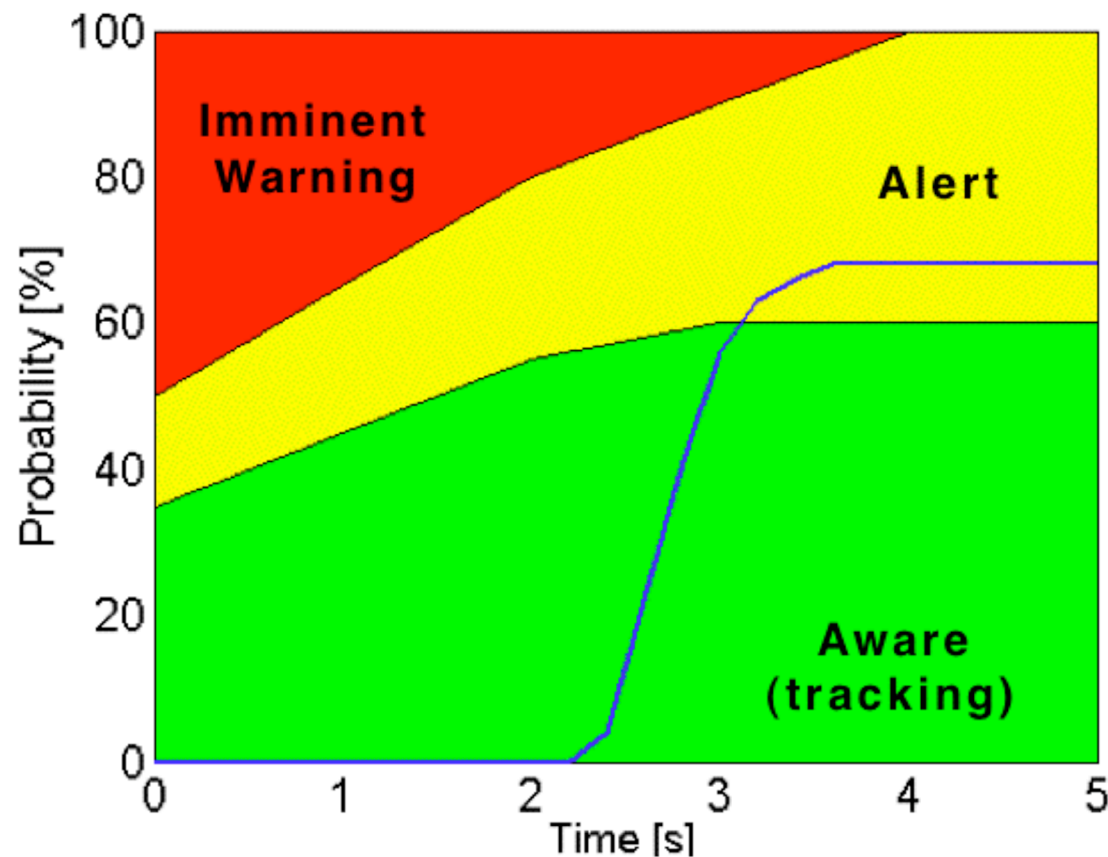
Calculate Threat

Randomly generated tracks in the frame of the moving bus



Probability Thresholds

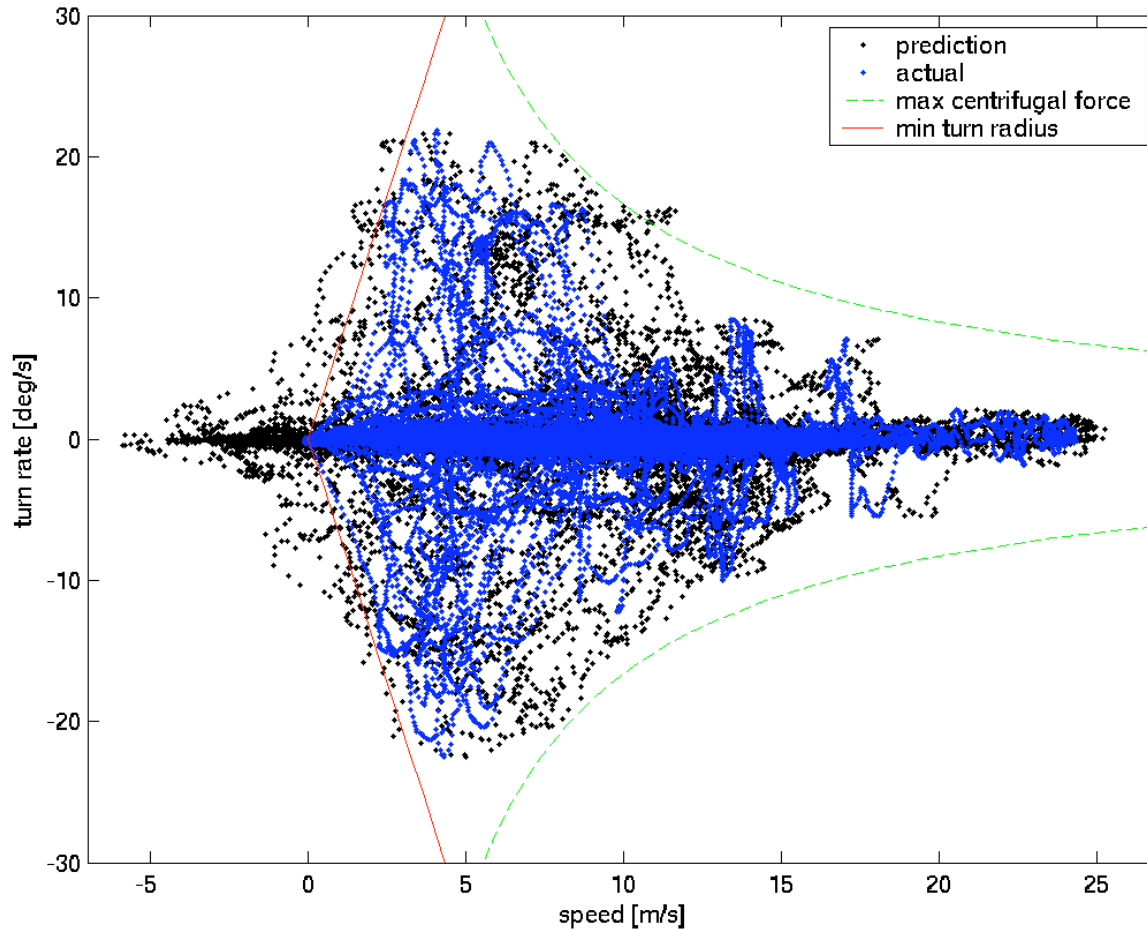
Probability plotted in the aware-alert-warn graph



➔ Alert should be triggered



Predict

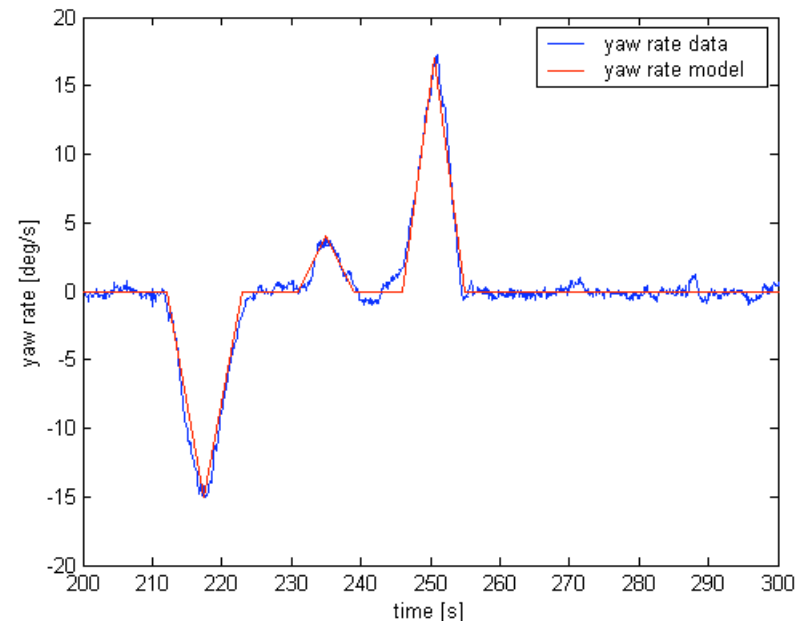


Simple prediction
3 seconds ahead
using **speed**,
acceleration, and
yaw-rate

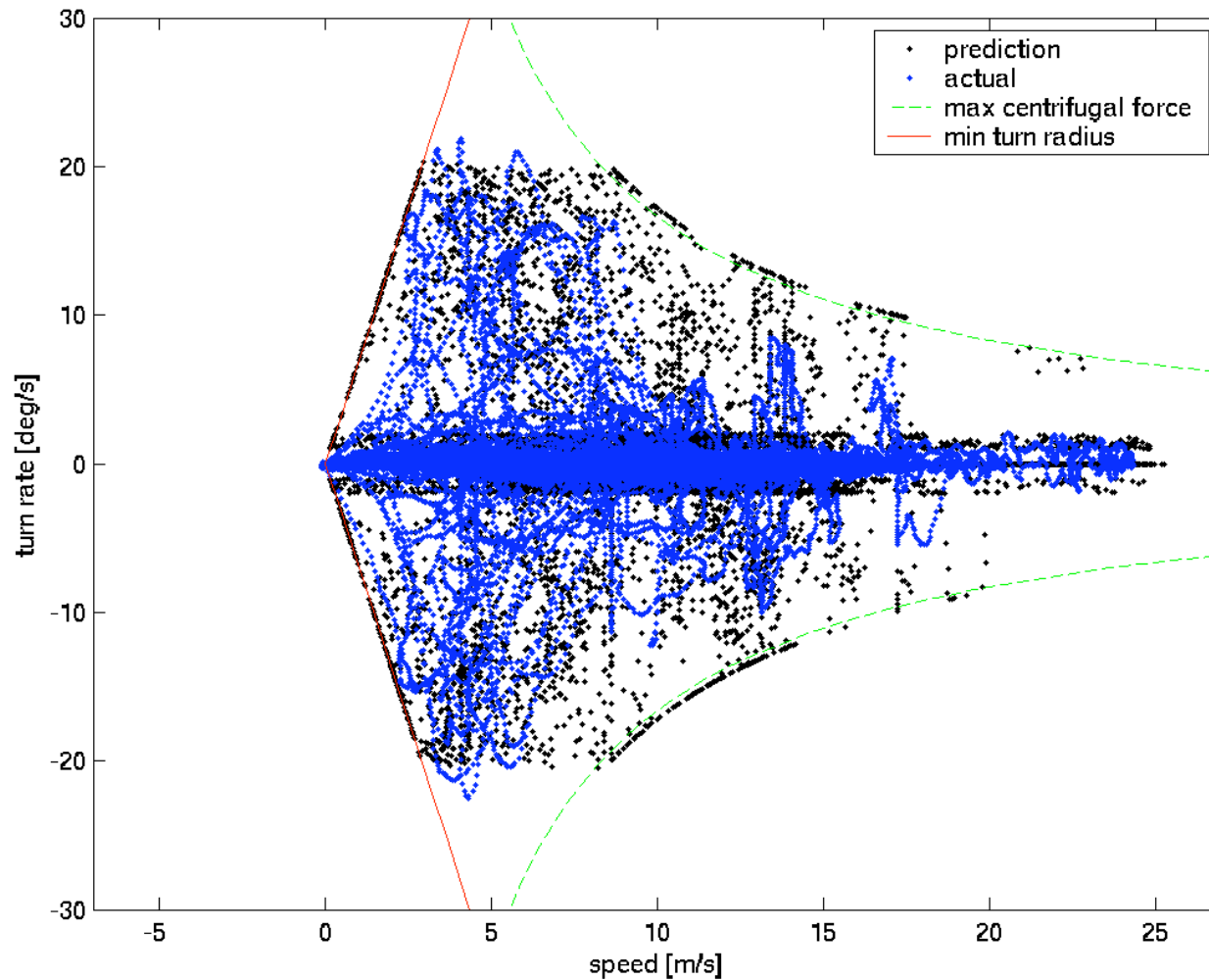


Apply Models

- Vehicle Model 1: Limits on the turning rate of the bus
- Vehicle Model 2: Speed is not negative
- Vehicle Model 3: The yaw-rate is characterized by symmetric spikes on top of zero-background.



Improved Prediction



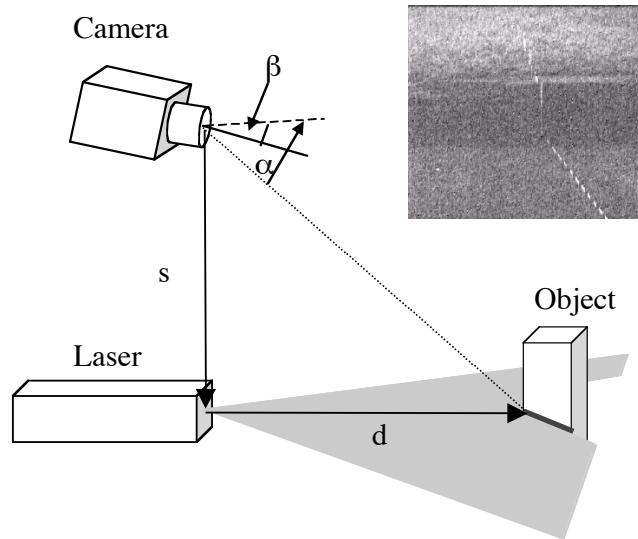
Prediction using
the 3 models,
3 second ahead

10% improvement



Pedestrian Model

(Curb detection)



Example: Environment + Pedestrian Model

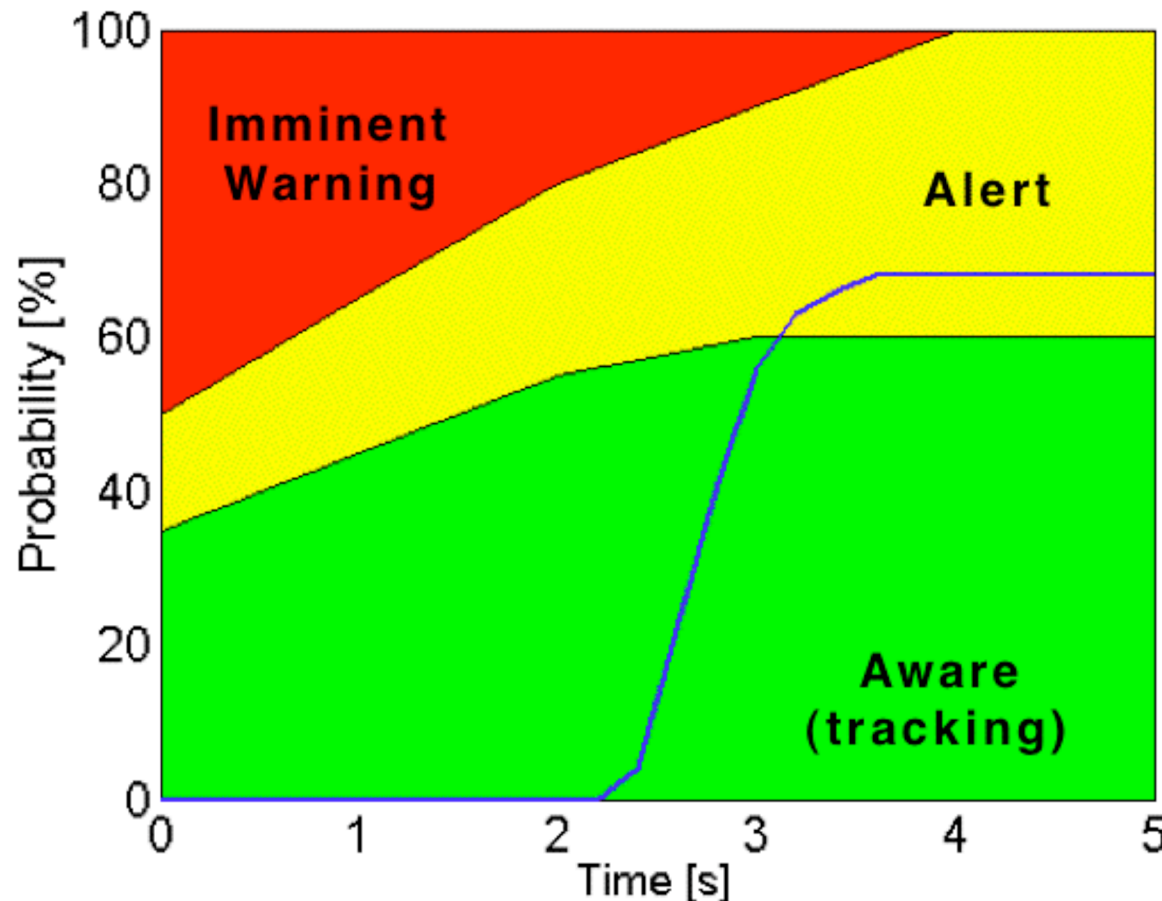


If a pedestrian is **on** the curb: *he/she is much more likely to stay on the curb than to step off the curb.*

If a pedestrian is **off** the curb: *he/she is more likely to stay off the curb than to step on the curb.*



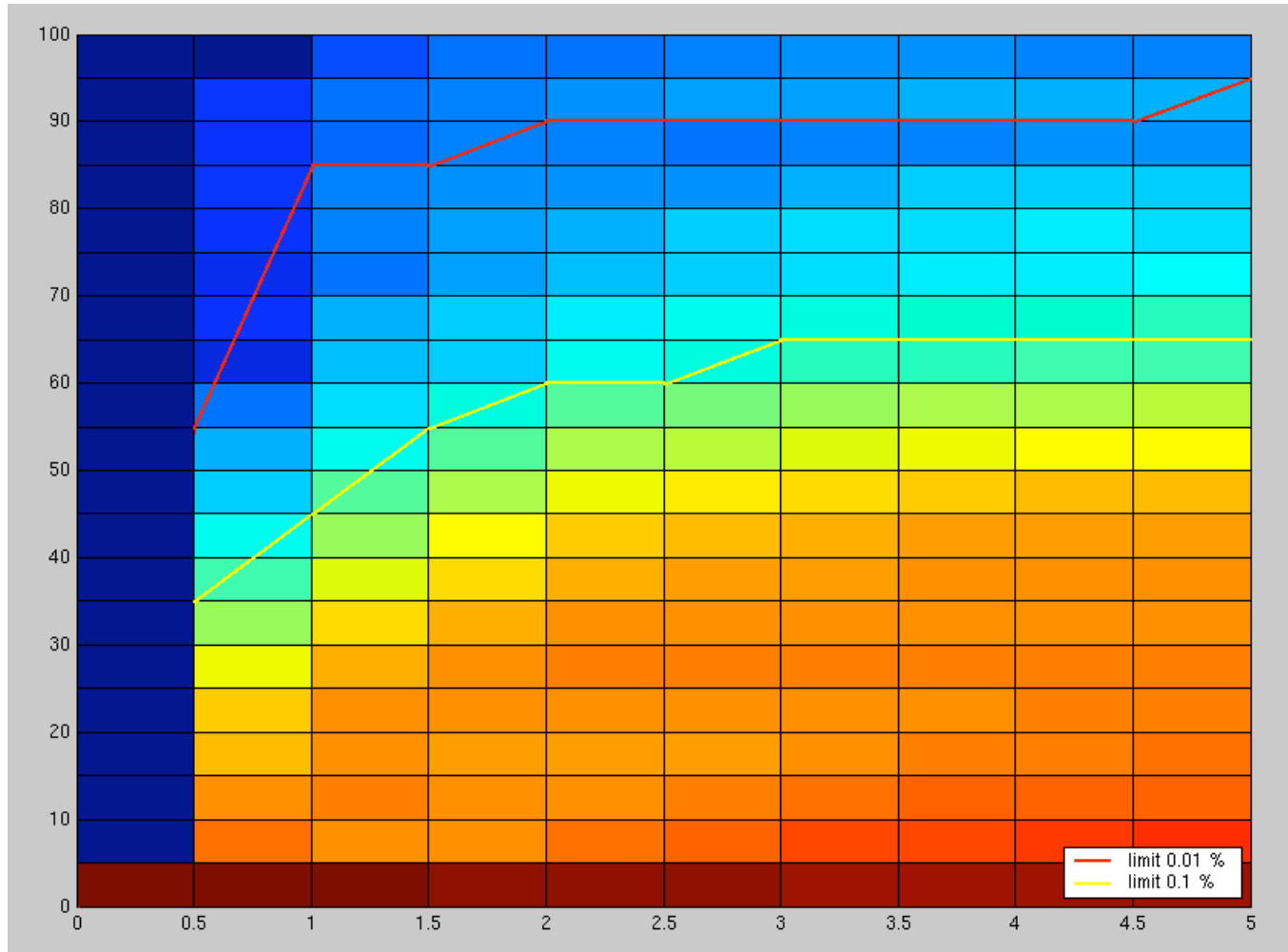
Determination of the Limits of Safety Levels



One curve for each object every 0.1 seconds



Distribution of All Curves of All Objects



Limits for 0.1 and 0.01 percentile (shown)



Contact and Under Wheel

- Contact
 - Object is close to bus (0.5 m)
 - Probability of collision is 100% for 0.5 sec
- Under Wheel
 - Object was close to bus (0.5 m)
 - Object disappears



Driver-Vehicle Interface

Aaron Steinfeld



Interface Paradoxes

1. Drivers agree with the philosophy of **earlier** action rather than harder action yet they would like as **few** alerts and warnings as possible
2. Nighttime drivers prefer **audible** warnings due to concern over glare while daytime drivers tend to focus on **visual** warning options
3. The warning should be salient enough to elicit a **driver** response but should not be readily noticeable by **passengers**



Institutional Concerns

- Union-management relations
 - Monitoring
 - Preventable accidents
- Maintenance
 - Modification, durability, who fixes?
- Fraud
 - Starting gun for falls
- Customers
 - Warning = I'm in danger
 - Isn't PAT broke?



Scott Johnston (PATH)



Prior Work - Cars

- Crash Avoidance Metrics Partnership (CAMP)

- DaimlerChrysler, Ford, GM, NavTech, Nissan, Toyota, BMW, Volkswagen



- Automotive Collision Avoidance System (ACAS UMTRI)

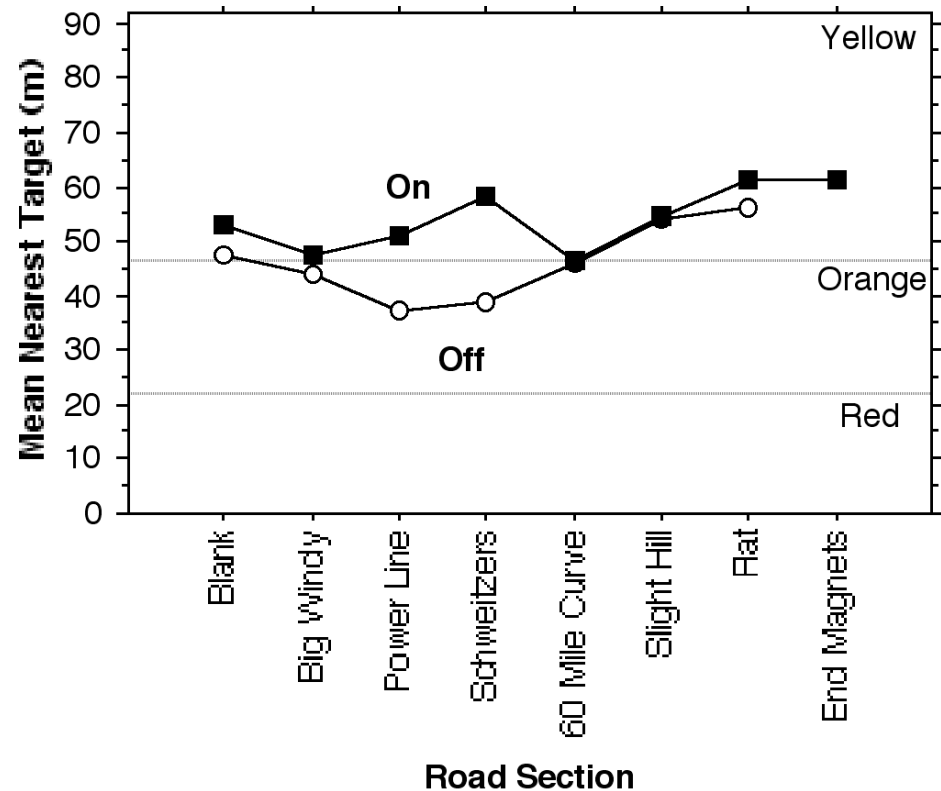
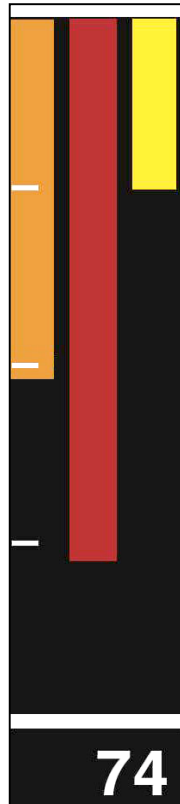
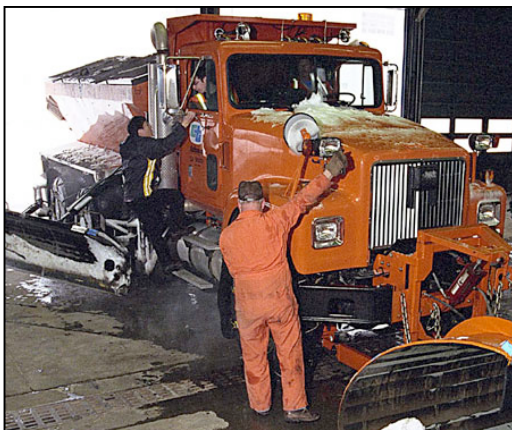


- National Advanced Driving Simulator (Iowa)



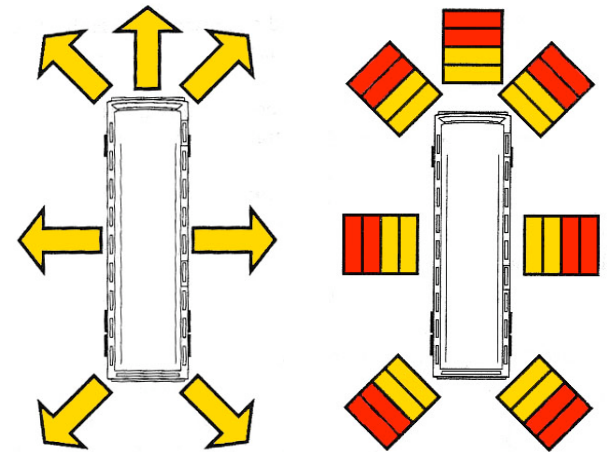
Prior Work – Snowplows

- Advanced Snowplow Project, California PATH
 - Downward moving tapes (range) with color change



Prior Work – Buses

- Greyhound & PAT Phase I
 - Driver acceptance critical
- IVI SBIR (Foster Miller, top)
 - HUDs are a bad idea
 - Center console rarely used
- Blind Spot (Clever Devices, bottom)
 - Peripheral mounts are good
 - Status light is important
 - Non-invasive sounds

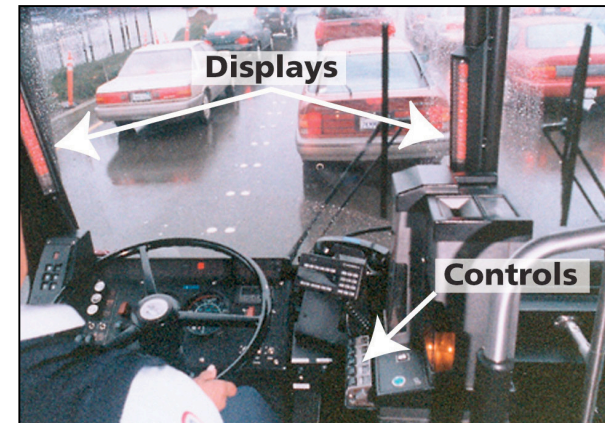
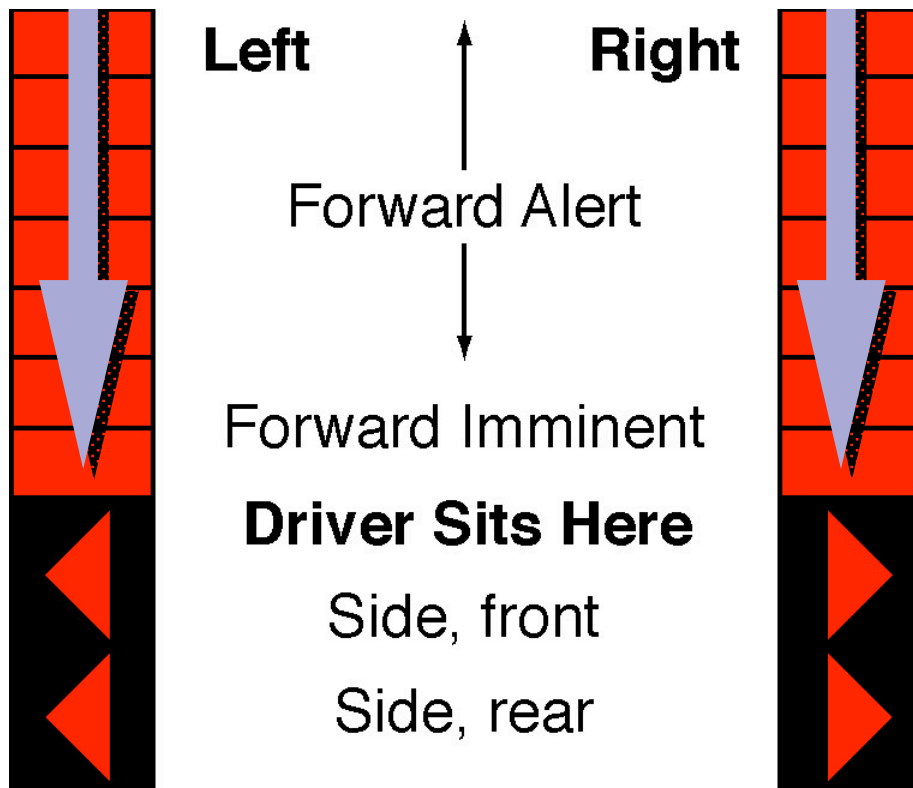


Design Rationale

- Spatial conventions
 - Downward moving tapes (looming effect)
 - Peripheral displays (promote mirror use; help vs. primary)
 - Plan view layout (positions relative to driver)
- Driver conventions – Need driver buy-in
 - Sensitivity control (Paradox 1)
 - Volume and brightness control (Paradoxes 2 & 3)
 - Status lights



Driver-Vehicle Interface

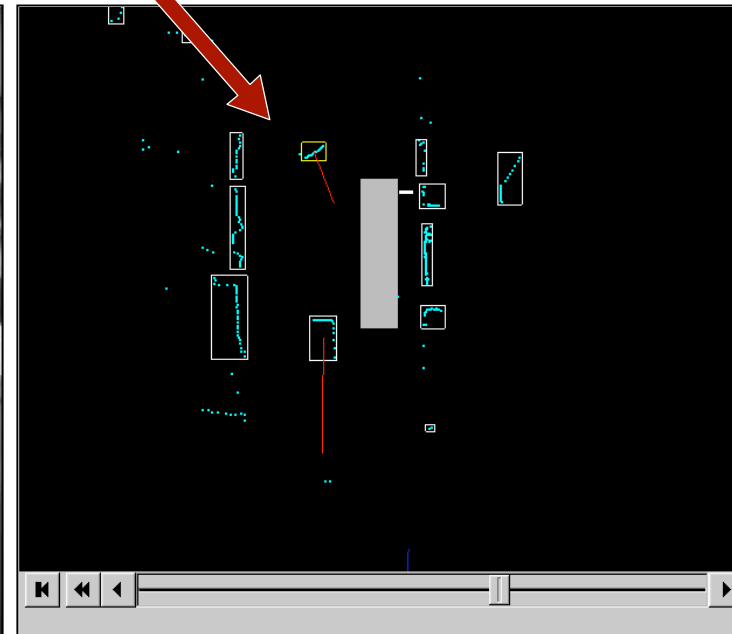


Example Data

Alert warning, Right-rear



DVI LED bars



Roll	Pitch	Yaw
-1.6	2.6	70.9
X:	Y:	Z:
-11079	-315.2	248.8

Speed: 1.2
Radius: 1003.91
Distance: 22986.5

Lock Vehicle Position
 Lock Vehicle Orientation

Mark In:
Mark Out:

Save Selection

Snapshot

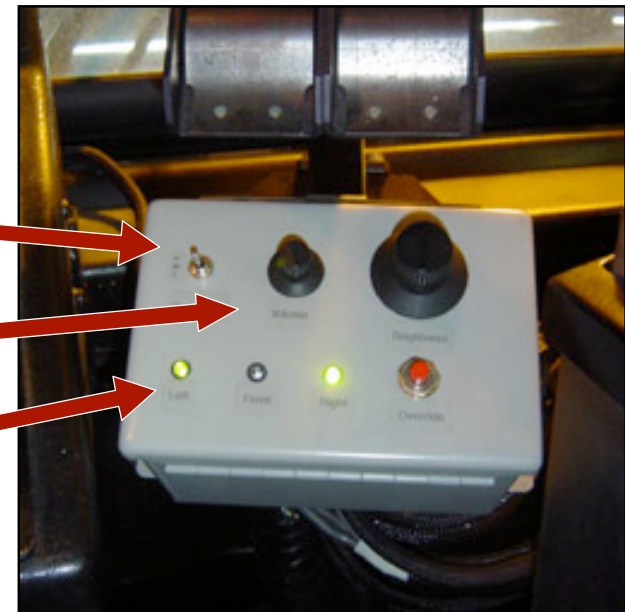
sens level

imminent only



Driver Control Box

- Bounded by space
- Sensitivity
- Volume & Brightness
- Status lights
- Intentionally out of reach while driving



Field Research Hazards

- Auto retraction of side lasers
 - Durable, but also somewhat expensive
 - Bus wash infrastructure



- Harsh environment for all components
 - Hardware failures
 - Electronics failures



Auto Retraction



Data Collection

- To date (10/04): ~ 2 terabytes of data

	PAT	SamTrans
km	7,000	8,100
Hours	213	280
Runs	127	250

- Will continue through the winter



Finally...

- You need a partner in the transit agency
 - Dan DeBone and Robin Rochez, Port Authority Transit (PAT) of Allegheny County
 - Frank Burton, San Mateo County Transit District (SamTrans)

-
- cmertz@andrew.cmu.edu, steinfeld@cmu.edu
 - http://www.ri.cmu.edu/labs/lab_28.html

