

# Cooperative decentralized intersection collision avoidance using Extended Kalman Filtering



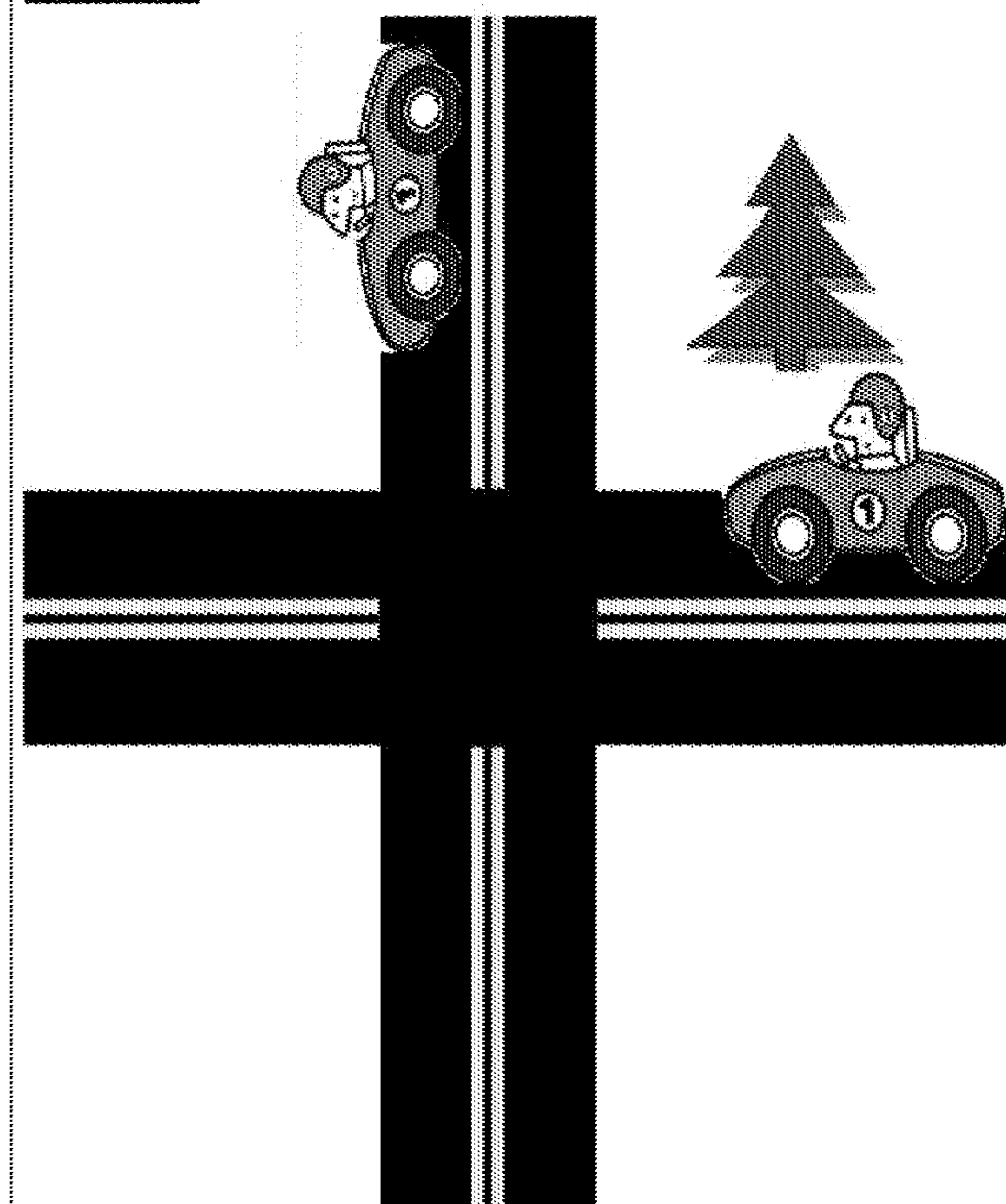
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We propose an adaptive, decentralized, cooperative collision avoidance (CCA) system that optimizes each vehicle's controls subject to the constraint that no collisions occur. The system contributes a nonlinear 5-state variable vehicle model, a set of constrained, coupled EKF's, and a vehicular network based on the new WAVE standard. The system is compared to today's common control devices.

## Problem



## Introduction

- Stop signs and traffic signals are:
- Unsafe – fail during disasters, power outages
- Inefficient – cause excessive delays, waste fuel
- Costly – installation, maintenance, electricity
- Researchers have primarily focused on radar, optical [2], [3], or cooperative systems [4], [5] but these have limitations

## Solution

- A cooperative, decentralized intersection collision avoidance system comprising:
- nonlinear 5-state variable vehicle model
- set of coupled, constrained EKF's
- wireless network for vehicular control

## Vehicle Model

- We expand the model developed in [1]
- Mass of air in the intake manifold  $m_a$
- Engine angular velocity  $\omega_e$
- Brake torque  $T_b$
- Throttle angle  $\alpha$
- Brake angle  $\beta$

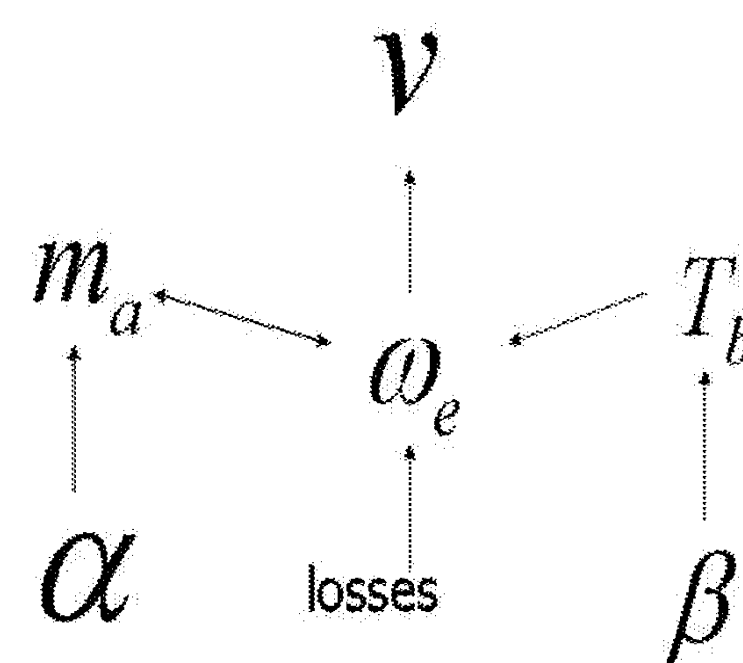
## Coupled, Constrained EKF's

- State equation

$$\dot{\underline{x}}(t) = \underline{f}(\underline{x}(t), \underline{u}(t), t) + \underline{w}(t)$$

- Observation equation

$$\underline{z}(t) = \underline{h}(\underline{x}(t), \underline{u}(t), t) + \underline{e}(t) \quad t = t_i \quad i = 1, 2, \dots$$



Interdependencies of vehicular dynamics

## Vehicular Network

- uses WAVE/DSRC (IEEE 1609 and 802.11p)
- Low latency (50 ms), low interference
- High range (1 km) and high rate (6-27 Mbps)

## How Does System Work?

- Observe vehicle states using GPS and sensors
- Share control information among vehicles
- Estimate states using coupled, constrained EKF's
- Optimize vehicular controls
- Automate controls according to optimization

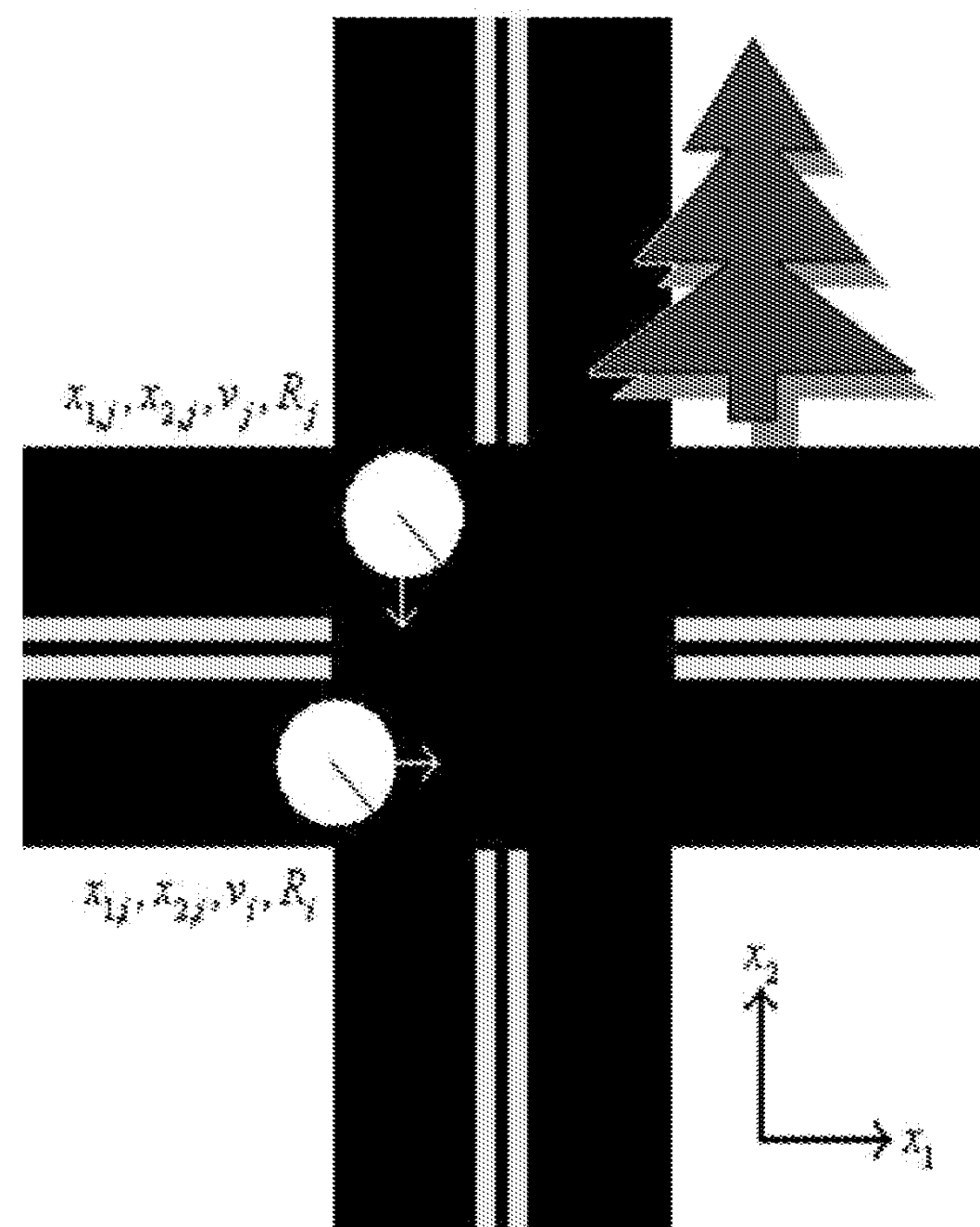
## Sparse Traffic Optimization Algorithm

- Objective function:

$$\arg \min \tau = \frac{1}{n} \sum_{k=1}^n (t_{o,k} - t_{a,k})$$

- Constraints:

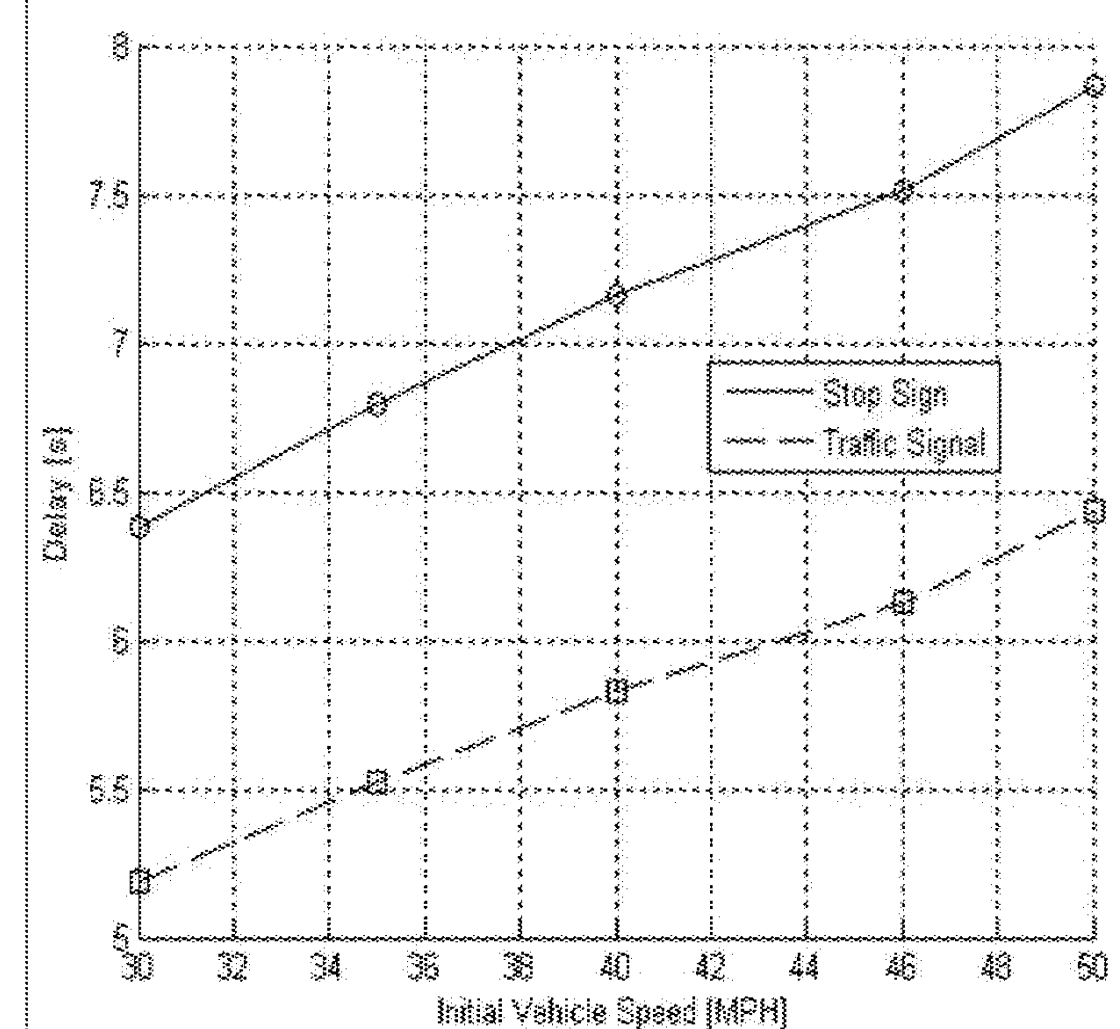
$$(x_{1,j} - x_{1,i})^2 + (x_{2,j} - x_{2,i})^2 > (R_i + R_j + m_s)^2$$



## Simulation Results

- We determine the average additional delay caused by stop signs and traffic signals under sparse traffic conditions in comparison to the Sparse Traffic Optimization Algorithm at various velocities

Velocity	Delay for Stop Sign	Delay for Traffic Signal
30 MPH	6.38 s	5.19 s
35 MPH	6.79 s	5.52 s
40 MPH	7.16 s	5.83 s
46 MPH	7.51 s	6.13 s
50 MPH	7.86 s	6.43 s



## Conclusions

- The system is superior at minimizing average delay in comparison to current collision avoidance technologies
- The system is more safe, efficient, and inexpensive than current devices

## References

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- [4] L. Li and F.Y. Wang, "Cooperative driving at blind crossings using intervehicle communication". *IEEE Transactions on Vehicular Technology*, Vol. 55, No. 6, pp. 1712-1724, November 2006.
- [5] K. Sung, J. Yoo, and D. Kim, "Collision warning system on a curved road using wireless sensor networks". *IEEE Vehicular Technology Conference*, pp. 1942-1946, September 2007.