Factors Affecting Trucking Safety: A Hierarchical Bayes Model for Critical Events

Miao Cai, MS, Mohammad Ali Alamdar Yazdi PhD, Qiong Hu ME, Amir Mehdizadeh ME, Alexander Vinel PhD, Karen Davis PhD, Fadel Megahed PhD, Steven E. Rigdon, PhD



1. Introduction

Background:

- Transportation accidents 1st
 cause of fatal occupational injury
 (over 40%), leading to over
 2,000 deaths in the US in 2016.
- Trucks → catastrophic accidents:
 - 1. Long routes,
 - 2. Huge weight
 - 3. Potentially hazardous cargo
- Critical events → crashes.
 - 1. Hard brakes
 - 2. Rolling stability
 - 3. Headways

Hypotheses:

H1: The probability of at least a critical event increases as drivers get more cumulative driving time.

H2: The probability of at least a critical event differs from one driver to another.

H3: The probability of at least a critical event differs with different <u>weather</u> conditions.

Nature of the problem:

To understand the risk factors associated with truck drivers' unsafety driving behavior.



2. Methods

- Data: 235 drivers, 22,633 short trips, 642 critical events by J.B.Hunt in May 2015
- Statistical models:

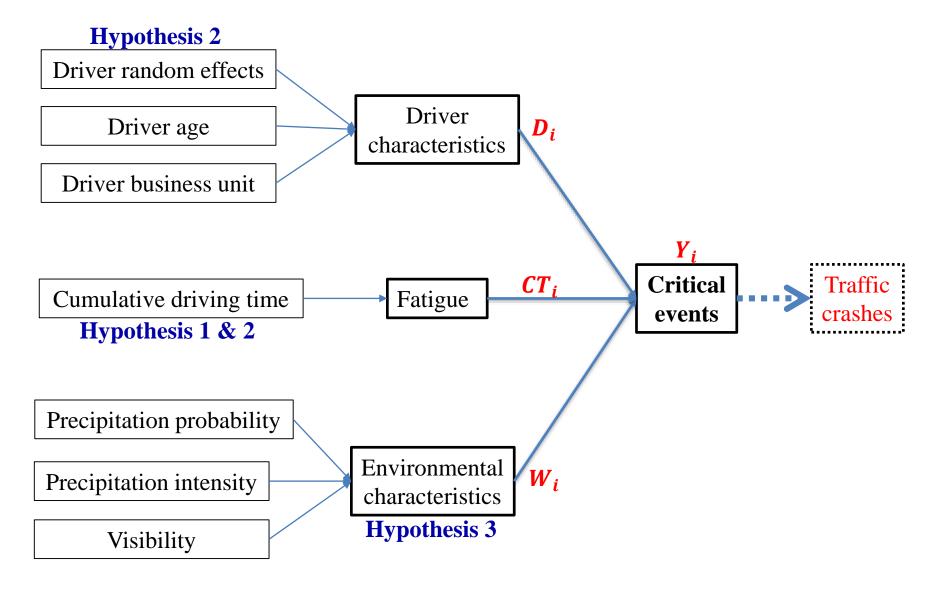
$$Y_i \sim \text{Bernoulli}(P_i)$$

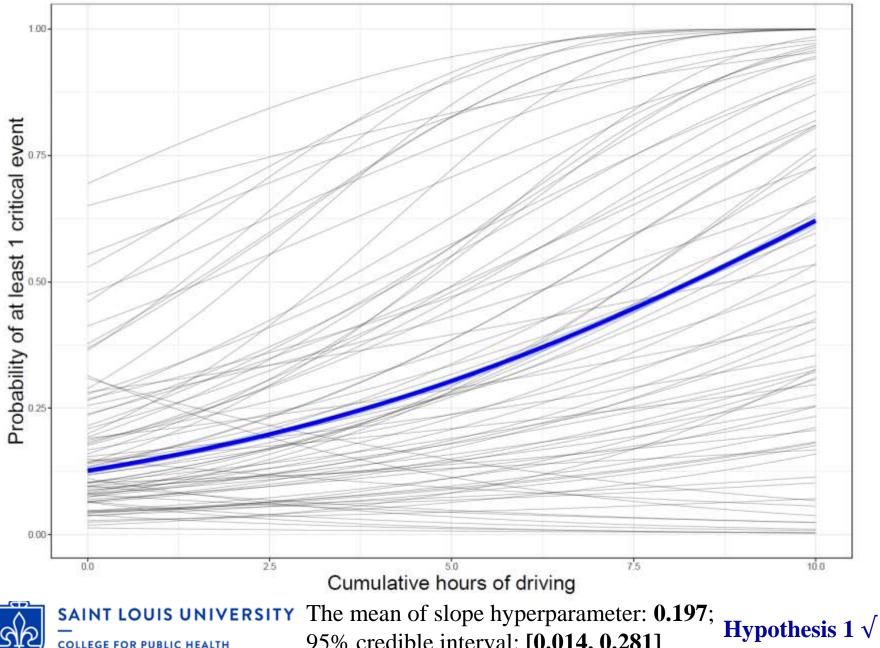
$$g(P_i) = \beta_{0,d(i)} + \beta_{0,d(i)} \cdot CT_i + \xi \cdot W_i + \nu \cdot D_i + \log(t_i)$$

- \circ Y_i : Whether critical event occurred or not in a trip
- \circ CT_i : cumulative driving time
- \circ W_i : road visibility, precipitation probability, and precipitation intensity
- \circ D_i : driver's age and business unit
- \circ t_i : length of time for each trip
- **Priors**: flat priors \rightarrow Normal $(0, 10^2)$ or Gamma (1, 1)
- Algorithm: Hamiltonian Monte Carlo, No-U-Turn Sampler
- **Software package**: R and Stan



3. Roadmap







95% credible interval: [0.014, 0.281]

4. Results, conclusion, & implications

Results:

- Truck driver's cumulative driving time was associated with higher probability of having critical events (posterior mean of slope hyperparameter: 0.197; 95% credible interval: [0.014, 0.281]). **Hypothesis 1** $\sqrt{}$
- These drivers demonstrated different patterns of fatigue, σ =0.073, 95% credible interval: [0.032, 0.114]. **Hypothesis 2** $\sqrt{}$
- The 95% credible intervals of these weather variables cover zero. **Hypothesis 3** \times
- <u>Driver's age</u> was associated with <u>lower probability</u> of having critical events (posterior mean: -0.229, 95% credible interval: [-0.374, -0.084]).

Conclusion: Truck drivers demonstrate significantly higher risk of having critical events when they have been working in a long shift. This fatigue pattern varies substantially by drivers.



Q & A

