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

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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 <u>differs</u> from one driver to another.

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

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:

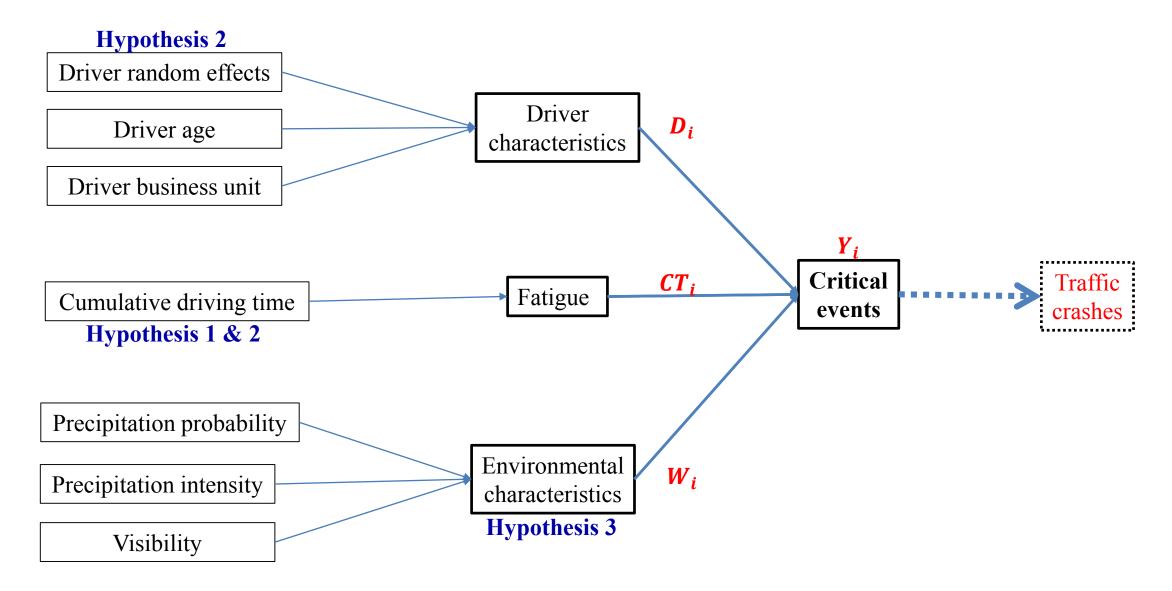
$$Y_i \sim \text{Bernoulli}(P_i)$$

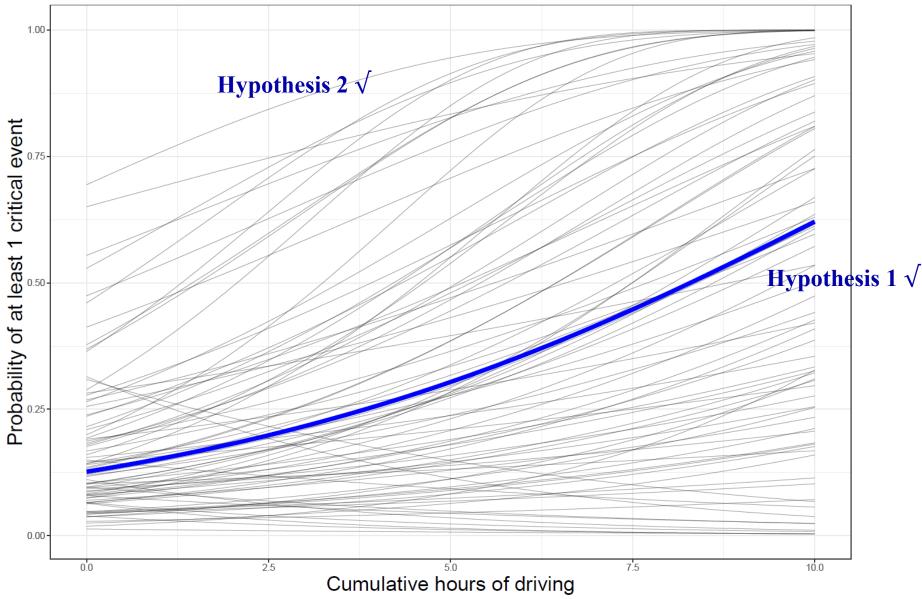
$$g(P_i) = \beta_{0,d(i)} + \beta_{0,d(i)} \cdot CT_i + \xi \cdot W_i + \nu \cdot D_i + \log(t_i)$$

- \circ Y_i : Whether critical event occurred or not in a trip
- o 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







The mean of slope hyperparameter: **0.197**; 95% credible interval: [**0.014**, **0.281**]

4. Results and conclusion

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 3×10^{-1}
- <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

