

**Transportation Research Record**  
**CONSIDERING SPATIAL HETEROGENEITY AND TIME OF DAY IN SELF-  
REPORTED SEAT BELT USE**  
--Manuscript Draft--

<b>Full Title:</b>	CONSIDERING SPATIAL HETEROGENEITY AND TIME OF DAY IN SELF-REPORTED SEAT BELT USE
<b>Manuscript Number:</b>	19-02918R1
<b>Article Type:</b>	Presentation Only
<b>Order of Authors:</b>	Amin Mohamadi Hezaveh
	Trond Nordfjærn, PhD
	Jerry Everett, PhD
	Christopher R Cherry

This piece of the submission is being sent via mail.

2019 TRB Annual  
Meeting Paper

This piece of the submission is being sent via mail.

2019 TRB Annual  
Meeting Paper

1 **CONSIDERING SPATIAL HETEROGENEITY AND TIME OF DAY IN SELF-**  
2 **REPORTED SEAT BELT USE**

3  
4  
5  
6 **Amin Mohamadi Hezaveh**

7 University of Tennessee, Knoxville  
8 311 JD Tickle Building, TN 37996  
9 Phone: (385) 259-5148; Email: [amohamad@vols.utk.edu](mailto:amohamad@vols.utk.edu)

10  
11 **Trond Nordfjærn**

12 Norwegian University of Science and Technology, Department of Psychology  
13 [Dragvoll, Building 12, Level 5, N-7491, Norway](#)  
14 [Phone: +47 959 34 766](#)  
15 [Fax: +47 735 91 960; Email: trond.nordfjarn@ntnu.no](#)

16  
17 **Jerry Everett**

18 Center for Transportation Research, University of Tennessee, Knoxville  
19 309 Conference Center Bldg., Knoxville, TN 37996-4133  
20 Phone: (865) 974-8275  
21 Fax: (865) 974-3889; Email: [jeverett@utk.edu](mailto:jeverett@utk.edu)

22  
23 **Christopher R. Cherry**

24 University of Tennessee, Knoxville  
25 321 JD Tickle Building, TN 37996  
26 Phone: (865) 974-7710  
27 Fax: (865) 974-2669; Email: [cherry@utk.edu](mailto:cherry@utk.edu)

28  
29  
30 Word count: 1,674 words text + 0 tables x 250 words (each) = 1,674 words

31  
32  
33  
34 Submission Date July 31  
35

1 There are approximately 1,000 fatalities on the roads in Tennessee every year. One known  
2 solution that reduces the fatality rate of the vehicle occupants is proper use of seat belts. Several  
3 studies have reported the importance of wearing a seat belt in reducing crash fatalities and injury  
4 rates. Despite the proven effectiveness of these protective devices, some high-risk populations  
5 still neglect using them. A ten-year trend of the crashes in Tennessee shows that 30% of  
6 Tennesseans who died in traffic crashes failed to wear their seat belt properly at the time of the  
7 crash (1; 2). National Highway Traffic Administration (NHTSA) reported on average that  
8 Tennesseans have lower seat belt use compared to the average in the United States (3). Despite a  
9 few studies that aim to understand lower seat belt use rate in South and specifically Tennessee,  
10 little is known about the factors correlating with low seat belt use rate in this area. As a result, it  
11 is challenging to deploy effective countermeasures.

12 Not using safety equipment could be attributed to human factors such as forgetfulness,  
13 laziness, perceiving a low risk of injury, and discomfort (4); attitudes, beliefs, and intentions (5;  
14 6); and habits (7; 8). Roadside observations also indicated that driving context and time of the  
15 day impact seat belt use. Researchers reported that those who drive in urban areas or  
16 expressways have a higher compliance rate (9; 10). A naturalistic driving study also showed that  
17 people are more likely to use seat belts while driving on high-speed roads (11). Regarding seat  
18 belt use by time of the day, Gkritza and Mannering (12) found that single-vehicle occupants are  
19 less likely to be restrained in the morning, while multi-vehicle occupants are less likely to be  
20 restrained in the afternoon. A number of studies have also shown that nighttime seat belt use  
21 rates are significantly lower compared to daytime rates (13). However, most studies to date  
22 tended to not stratify the analyses across driving during daytime and nighttime.

23 In this study, we developed a questionnaire that considers the role of Education,  
24 Engineering, and Enforcement as well as sociodemographic variables and seat belt use.  
25 Nighttime seat belt use is usually lower than daytime use (13-15). As a result, we focused on seat  
26 belt use during nighttime and daytime by using separate questionnaires that consider self-  
27 reported behavior for daytime and nighttime. Moreover, another contribution of this study is that  
28 it explicitly includes spatial heterogeneity in the model for self-reported seat belt use. We  
29 hypothesize that there will be spatial heterogeneity in different areas of the Knoxville region,  
30 given the diversity in land use, transportation systems, demographics, and culture. We  
31 considered the issue of spatial heterogeneity in the modeling process by recording respondents  
32 residential zip codes.

33 Spatial heterogeneity exists when exogenous variables do not vary identically across  
34 space (16). A large portion of road safety literature in the area of macroscopic crash prediction  
35 models and safety performance function estimation is dedicated to the role of spatial  
36 heterogeneity and addressing it in count data modeling. However, this issue has received less  
37 attention in self-reported studies concerning the use of safety equipment. One reason for the  
38 presence of unobserved heterogeneity in the data is the presence of factors that are not likely to  
39 be available for the analysis (17). This phenomenon impacts the relationship between exogenous  
40 variables and dependent variables; therefore, this relationship may not be constant across the  
41 observation. Failing to address unobserved heterogeneity in the modeling process would lead to  
42 biased estimation and drawing incorrect inferences (17). There are different methods for  
43 addressing heterogeneity in modeling. Mixed Logit Models (e.g., random parameters) and  
44 geographically weighted regression (GWR) are two common methods to address this issue.  
45 Random parameters models are drawn from some random distribution and are assumed to vary  
46 randomly over observations (18). One of the shortcomings of the random parameter model is that

1 it usually fails to consider the location of observation. On the other hand, spatial models such as  
2 GWR consider the location of the observations to capture spatially structured variability in the  
3 effect of contributing factors (16; 18). Several studies in other fields in road safety showed the  
4 advantage of GWR models with regards to improvement in model goodness of fit and capability  
5 to explore the spatially varying association among dependent variables and exogenous variables  
6 (16; 19).

7 In this study, we developed a questionnaire that considers the role of Education,  
8 Engineering, and Enforcement as well as sociodemographic variables and seat belt use.  
9 Nighttime seat belt use is usually lower than daytime use (13-15). As a result, we will focus on  
10 seat belt use during nighttime and daytime by using separate questionnaires that consider self-  
11 reported behavior for daytime and nighttime. Moreover, another contribution of this study is that  
12 it explicitly includes spatial heterogeneity in the model for self-reported seat belt use. We  
13 hypothesize that there will be spatial heterogeneity in different areas of the Knoxville region,  
14 given the diversity in land use, transportation systems, demographics, and culture. We used a  
15 global binary logit model and a geographically weighted regression logit model to examine the  
16 factors influencing seat belt use in the daytime and nighttime. Results of self-reported seat belt  
17 use in this study closely resemble findings in roadside observations conducted in the study area  
18 (2). Comparison of self-reported seat belt use across demographics indicates that male  
19 respondents have lower seat belt use rates both in daytime and nighttime. Moreover, respondents  
20 with a higher education degree and driving exposure at nights have higher self-reported  
21 nighttime seat belt use rates. The result of the non-stationary test indicates that the estimated  
22 coefficients in the GWR model have no substantial local effect, which yields the conclusion that  
23 the estimated parameters in the model are independent of respondents' locations. Accordingly,  
24 using the global effect for the testing hypothesis in this study is appropriate, and the findings of  
25 the global model are not affected by spatial heterogeneity.

26 Findings of the models indicate that self-reported seat belt use rate for both daytime and  
27 nighttime have a significant association with perception of enforcement, driving exposure,  
28 attitude toward seat belt use, and individuals' reasons for seat belt non-use. Whereas, for the  
29 nighttime seat belt use, exposure to educational materials has a significant effect on self-reported  
30 seat belt use. The designed framework for self-reported seat belt use for daytime and nighttime  
31 have a similar performance in terms of the relationship between significant variables and their  
32 association with self-reported seat belt use for daytime and nighttime. Findings of this study  
33 could be used by policymakers and road safety practitioners to design better educational,  
34 enforcement, and engineering countermeasures and interventions by prioritizing groups that have  
35 lower seat belt use.

## 36 REFERENCES

- 37 1. TITAN. Tennessee Integrated Traffic Analysis Network. In, Tennessee Highway Patrol  
38 2017.
- 39 2. Hezaveh, A. M., and C. R. Cherry. Neighborhood-level factors affecting seat belt use.  
40 *Accident Analysis and Prevention*, Vol. 122, 2019, pp. 153-161.
- 41 3. NHTSA. Seat Belt Use in 2017—Use Rates in the States and Territories. In, *No. DOT HS*  
42 *812 274*, 2017.
- 43 4. Begg, D. J., and J. D. Langley. Seat-belt use and related behaviors among young adults.  
44 *Journal of Safety Research*, Vol. 31, No. 4, 2001, pp. 211-220.
- 45 5. Şimşekoğlu, Ö., and T. Lajunen. Social psychology of seat belt use: A comparison of  
46 theory of planned behavior and health belief model. *Transportation Research Part F:*

- 1           *Traffic Psychology and Behaviour*, Vol. 11, No. 3, 2008, pp. 181-191.
- 2 6.       Zavareh, M. F., A. M. Hezaveh, and T. Nordfjærn. Intention to use bicycle helmet as  
3 explained by the Health Belief Model, comparative optimism and risk perception in an  
4 Iranian sample. *Transportation Research Part F: Traffic Psychology and Behaviour*, Vol.  
5 54, 2018, pp. 248-263.
- 6 7.       Chliaoutakis, J. E., C. Gnardellis, I. Drakou, C. Darviri, and V. Sboukis. Modelling the  
7 factors related to the seatbelt use by the young drivers of Athens. *Accident Analysis &*  
8 *Prevention*, Vol. 32, No. 6, 2000, pp. 815-825.
- 9 8.       Calisir, F., and M. R. Lehto. Young drivers' decision making and safety belt use.  
10 *Accident Analysis & Prevention*, Vol. 34, No. 6, 2002, pp. 793-805.
- 11 9.       Glassbrenner, D., and J. Ye. Seat belt use in 2006—Overall results. In, *No. Report No.*  
12 *DOT HS 810 677*, Washington, DC., 2007.
- 13 10.      Nichols, J. L., J. Tison, M. G. Solomon, K. A. Ledingham, and D. F. Preusser. Evaluation  
14 of a rural demonstration program to increase seat belt use in the Great Lakes Region. In,  
15 2009.
- 16 11.      Reagan, I. J., J. A. McClafferty, S. P. Berlin, and J. M. Hankey. Using naturalistic driving  
17 data to identify variables associated with infrequent, occasional, and consistent seat belt  
18 use. *Accident Analysis & Prevention*, Vol. 50, 2013, pp. 600-607.
- 19 12.      Gkritza, K., and F. L. Mannering. Mixed logit analysis of safety-belt use in single- and  
20 multi-occupant vehicles. *Accident Analysis and Prevention*, Vol. 40, No. 2, 2008, pp.  
21 443-451.
- 22 13.      Chaudhary, N. K., and D. F. Preusser. Connecticut nighttime safety belt use. *Journal of*  
23 *Safety Research*, Vol. 37, No. 4, 2006, pp. 353-358.
- 24 14.      Chaudhary, N. K., M. Alonge, and D. F. Preusser. Evaluation of the Reading, PA  
25 nighttime safety belt enforcement campaign: September 2004. *Journal of Safety*  
26 *Research*, Vol. 36, No. 4, 2005, pp. 321-326.
- 27 15.      Solomon, M. G., N. K. Chaudhary, and D. F. Preusser. *Daytime and Nighttime Seat Belt*  
28 *Use at Selected Sites in New Mexico*. Publication DOT HS 810 705, U.S. Department of  
29 Transportation National Highway Traffic Safety Administration, 2007.
- 30 16.      Xu, P., H. Huang, N. Dong, and S. Wong. Revisiting crash spatial heterogeneity: a  
31 Bayesian spatially varying coefficients approach. *Accident Analysis & Prevention*, Vol.  
32 98, 2017, pp. 330-337.
- 33 17.      Mannering, F. L., V. Shankar, and C. R. Bhat. Unobserved heterogeneity and the  
34 statistical analysis of highway accident data. *Analytic methods in accident research*, Vol.  
35 11, 2016, pp. 1-16.
- 36 18.      Xu, P., and H. Huang. Modeling crash spatial heterogeneity: random parameter versus  
37 geographically weighting. *Accident Analysis & Prevention*, Vol. 75, 2015, pp. 16-25.
- 38 19.      Pirdavani, A., T. Bellemans, T. Brijs, B. Kochan, and G. Wets. Assessing the road safety  
39 impacts of a teleworking policy by means of geographically weighted regression method.  
40 *Journal of Transport Geography*, Vol. 39, 2014, pp. 96-110.
- 41  
42