

1 **LATENT CLASS CLUSTER ANALYSIS OF DRIVER ATTITUDES TOWARDS**
2 **RISKY DRIVING IN NORTHERN NEW ENGLAND: IS THERE A RURAL**
3 **CULTURE OF UNSAFE DRIVING ATTITUDES AND BEHAVIOR?**
4

5 Matthew A. Coogan
6 Director
7 New England Transportation Institute
8 100 Railroad Row
9 White River Junction, VT 05001
10 802.295.7499
11 cooganmatt@gmail.com
12

13 Margaret Campbell
14 Senior Associate
15 Resource Systems Group, Inc.
16 55 Railroad Row
17 White River Junction, VT 05001
18 802.295.4999
19 mcampbell@rsginc.com
20

21 Thomas J. Adler
22 President
23 Resource Systems Group, Inc.
24 55 Railroad Row
25 White River Junction, VT 05001
26 802.295.4999
27 tadler@rsginc.com
28

29 Sonja Forward
30 Swedish Road and Transport Research Institute
31 SE-581 95
32 Linköping, Sweden
33 sonja.forward@vti.se,
34

35 Jean Pascal Assailly
36 INRETS,
37 Bâtiment Le Descartes
38 2, rue de la Butte Verte
39 F-93166 Noisy le Grand Cedex
40 assailly@inrets.fr
41

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44 **ABSTRACT**

45 The vastly higher rate of highway death experienced by rural residents, compared to urban and suburban
46 residents, could be at least partially explained by the presence of a “rural culture” characterized by bad
47 attitudes towards dangerous driving behaviors. This paper describes the application of a method of
48 behavioral analysis borrowed from the field of market research, designed to apply a statistically-based
49 model to the task of segmenting the driving population based on the similarities of drivers’ attitude and
50 beliefs structures.

51 A survey of over 1,000 residents of Maine, New Hampshire, Vermont, New York and
52 Massachusetts was conducted to study the driving behaviors and attitudes of New England residents. The
53 study explored the frequencies of risky driving behaviors and attitudes to better understand the driving
54 culture of the targeted areas.

55 The work described in this paper used latent class cluster analysis to identify segments of the
56 driving population which exhibit distinct patterns of attitudes and behavior. The analysis identified four
57 distinct segments, two of which correspond with extremes of attitudes, behaviors and outcomes and two
58 of which are more nuanced. However, rural residents tend to fall more predominantly in the segments that
59 exhibit the attitudes, behaviors and outcomes associated with safe driving. Thus, the analysis decidedly
60 does not find evidence of a rural culture of unsafe driving. If anything, this study finds the reverse; that is,
61 rural residents tend toward segments that exhibit attitudes and behaviors that support safer driving and
62 have better self-reported outcomes.

63

64 INTRODUCTION

65 Background

66 The question of why people speed, and more generally undertake risky driving behaviors, is a major
67 concern both for those who set public policy, and for those whose lives have been damaged by the harm
68 inflicted by bad driving behaviors. Throughout the world, interventions are being undertaken to lower the
69 rate of mortality on the highways and roadways. In order to create an effective public policy or
70 intervention designed to change behavior, it is critical to first develop a better understanding of why
71 people behave the way they do (1, 2, 3). This paper describes the application of a method of behavioral
72 analysis borrowed from the field of market research, designed to apply a statistically-based model to the
73 task of segmenting the driving population based on the similarities of drivers' attitude and beliefs
74 structures.

75 Latent class cluster analysis allows the analyst to create market segments based on the similarities
76 of their attitudes, beliefs and behaviors revealed *post hoc* from the analysis of those variables, rather than
77 segments based on such easily definable *a priori* categories as age, income, education or place of
78 residence (4). The method is in commonly used in a wide variety of market research applications such as
79 developing advertising campaigns targeted to specific market subgroups within the population. Logically,
80 latent class analysis could help to reveal those variables which interact to define the key segments, which
81 in turn can be rank ordered in terms of their propensity to undertake risky driving behavior. Based on
82 established marketing procedures, specific messages could be targeted to the specific market segments
83 revealed.

84 A specific concern addressed by the authors of this paper is the tenable hypothesis that the vastly
85 higher rate of highway death experienced by rural residents, compared to the rate for urban and suburban
86 residents, could be at least partially explained by the presence of a "rural culture" characterized by bad
87 attitudes towards dangerous driving behaviors. The most recent data from the US DOT reports a national
88 death rate for rural areas as 2.4 times that of the rate for urban areas (5). Other research on the death rate
89 of young males only shows a ratio of 4:1 when the least dense quintile of residence (rural) is compared
90 with most dense quintile (urban) (6).

91 Previous Research

92 Extensive research has been carried out over the past decades concerning the relationship between
93 attitudes/beliefs and actual bad driving behavior. Fortunately, the published literature benefits from
94 several comprehensive reviews in the field: highly recommended is "Traffic Psychology Theories:
95 towards understanding Driving Behaviour and Safety Efforts", by the Finish researcher Heikki Summala
96 (7). Another comprehensive review widely cited is "Behavioral Correlates of Individual Differences in
97 Road-Traffic Crash Risk," by Elander, West and French (8) which places the present concern with
98 attitudinal variables into a wider context of roadway safety research (see pages 288 to 290 for review of
99 personality- based theories).

100 By comparison with the more generic relationship between attitudes and dangerous driving, the
101 analysis of differences between the driving behavior of rural vs. non-rural populations has received a
102 relatively small amount of attention until recently in the published literature, given the vast differences in
103 the mortality rates between the two groups (9,10,11,12,13,14). The literature establishes that the residents
104 of rural areas have fewer accidents than non-rural residents, but with higher rates of mortality per
105 accident. It follows then, that a set of interventions might be designed to lower the rate of risky driving

106 behaviors, resulting in fewer rural accidents with the intention to lower the overall fatality level associated
107 with those accidents. This research is focused on the relationship between attitudes and risky driving
108 behaviors, as part of a longer terms research effort to deal with unique characteristics of rural driving
109 behaviors.

110 **Project Approach and Design**

111 The New England Transportation Institute has commenced a multifaceted study of rural transportation
112 issues focusing initially on the three northernmost states in New England. A major concern is the
113 differences in attitudes towards driving behavior for rural, compared against more urban, population
114 segments. In an early stage of the program, research summaries were commissioned with both the VTI,
115 based in Sweden, and INRETS, based in France (Assailly, 2007 (15), and Forward, 2006 (16) for
116 examples of the work that was reviewed). Representatives of both institutions came together with NETI
117 researchers, and participated in the creation of a survey instrument which could be used to gain early
118 insights concerning the possible role of a wide variety of theories current in the field of attitudes affecting
119 driving safety. The set of theories to be explored was designed to be inclusive, rather than exhaustive for
120 any one given theory. Particular emphasis was given to indicators for theories in applied social
121 psychology.

122 *Approach*

123 In the spring of 2009, NETI worked with Resource Systems Group, Inc. to conduct the NETI Rural
124 Safety Study of residents of Maine, New Hampshire, Vermont, New York and Massachusetts. The
125 purpose of the survey was to study the driving behaviors and attitudes of New England residents. The
126 study explored the frequencies of risky driving behaviors and attitudes to better understand the driving
127 culture of the targeted areas.

128 Particular importance was placed on understanding the culture of rural, young male drivers, as
129 they are far more likely to be involved in fatal car crashes than their more urban counterparts.

130 *Sampling Plan*

131 The sampling plan was designed to obtain a representative sample of residents less than 30 years old and
132 those 30 years old or older residing in rural, suburban and urban areas within each of the three states. The
133 use of 30 years of age to define the category was designed to capture a sharp peak of accidents at around
134 25 years, with a sharp decline over the next years (4). The survey targeted a sample of 1,000 residents
135 across Maine, Vermont and New Hampshire; due to difficulty in filling certain low-incidence sub-quota
136 cells within this geographic area, some residents from Massachusetts and New York were also surveyed.

137 The 2007 American Community Survey (ACS) data for the states of Maine, New Hampshire, and
138 Vermont provided by the U.S. Census Bureau was used to develop the sampling plan. For each state, the
139 proportion of the population residing in rural, suburban, and urban areas was determined using the
140 “percent rural” statistic provided in the ACS data set. For the sampling plan purposes, zip codes
141 identified as being 90 to 100 percent rural were classified as “rural”, zip codes identified as 20 to 89
142 percent rural were classified as “suburban”, and zip codes falling within 0 to 19 percent rural range were
143 classified as “urban.” The ACS data set also provided the proportion of the population less than 30 years
144 old and 30 years old or older and the proportion of men/women in the population.

145 Using these sets of proportions (rural/suburban/urban, under 30/30 plus, and gender), target
146 sample numbers were developed, and matched to the sets of zip codes representing rural, suburban and
147 urban for each of the three states.

148 *Survey Administration*

149 The survey approach employed an online survey using an internet-based computer-assisted self-interview
 150 (CASI) technique developed by Resource Systems Group, Inc. Potential respondents received an email
 151 invitation with a link to the survey and in total, 1,033 online surveys were completed.

152 *Survey Questionnaire*

153 A questionnaire was developed to collect data in order to better understand the driving and health habits
 154 of rural New Englanders. The questionnaire included five sections preceded by a screening section:

- 155 ▪ Screening: A series of demographic questions to determine if the respondent qualified for the
 156 survey;
- 157 ▪ About you and where you live: Questions regarding household characteristics, daily activities and
 158 distances to living necessities;
- 159 ▪ An imaginary situation: Participants were presented with a common driving situation in a rural
 160 town setting and rated the extent to which they agreed with statements regarding the situation;
- 161 ▪ Where you live and how you travel: Questions regarding exercise and types of transportation
 162 used;
- 163 ▪ Another imaginary situation: Participants were presented with a second common driving situation
 164 in a rural highway setting and rated the extent to which they agreed to statements regarding the
 165 situation; and
- 166 ▪ Thoughts about driving: Participants shared the frequency they engaged in certain driving
 167 behaviors and how they viewed themselves as drivers.

168 *Themes explored in the survey*

169 The survey instrument was designed to allow for a wide variety of concepts to be explored, both
 170 individually and in combination. Individual questions were designed to explore the possible roles of:

- 171 ▪ Objective norm (The people I like would speed)
- 172 ▪ Injunctive norm (The people I like would approve of me speeding)
- 173 ▪ Attitude –Instrumental (Speeding would get me home sooner)
- 174 ▪ Attitude – Affective (I would be annoyed to be behind the slow car)
- 175 ▪ Denial of risk-general (There is no danger is driving close)
- 176 ▪ Denial of risk- personal (I am a better driver, so there is no danger in my driving close)
- 177 ▪ Sensation seeking – intensity (How often do you do dangerous things, just for fun?)
- 178 ▪ Sensation seeking – novelty (I prefer friends who are exciting and unpredictable)
- 179 ▪ Social capital (I go to public meetings)
- 180 ▪ Antisocial behavior (Take time off from work to have fun)
- 181 ▪ Self efficacy (I can usually manage whatever I need to manage)
- 182 ▪ Personal norm (I would be ashamed to be pulled over for speeding)
- 183 ▪ Self Efficacy/control (I am confident I could speed less if I wanted to)
- 184 ▪ Other rural issues (there is nothing to do here at night)

185 Importantly, individual variables were analyzed separately so they could be clustered with other variables
 186 initially assumed to be part of different attitudinal categories.

187 To better define dangerous driving behavior, several questions were taken directly from the
 188 Driver Behaviour Questionnaire (DBQ) (14), and subjected to confirmatory factor analysis. Six variables
 189 (known in the literature as ‘violations’) were used in the analysis of behavior which is overtly dangerous

190 to others. For example, not wearing a seat belt is a negative behavior, but does not form a threat to others.
 191 In addition, the format of the DBQ was used as often as possible, while recognizing that our set of attitude
 192 variables was different from those of the original authors of the DBQ. The format for creating a scenario
 193 for the respondent to react to “It is a clear summer day, and the road is dry....” (Figure 1) was used to the
 194 maximum extent possible for possible later comparison with other studies utilizing the DBQ (17).

195 **FIGURE 1: SCREENSHOT OF DBQ SCENARIO QUESTION IN WEB SURVEY**

Imagine that...

You are driving home, alone, on a long two-lane road going through the countryside. It is a sunny, dry afternoon. You have to go through several towns where the speed limit drops to 30 mph. Since you are trying to get home in time for an important dinner with your family and friends, you drive over 45 mph through these towns.

Thinking about the situation above, please respond to each statement below.

	Strongly agree 7	6	5	Neutral 4	3	2	Strongly disagree 1
Going faster through the towns makes me feel nervous.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Speeding through the towns would allow me to arrive home much sooner.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
It would be easier for me to follow the speed laws if I wasn't so impatient.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Always restricting myself to the speed limits would be very difficult to do.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Driving over 45 mph through the towns would help to get me home in time for dinner.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Going over 45 mph through the towns would make my driving better adjusted to the traffic flow.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
People who are important to me will drive over 45 mph through such towns in the next two months.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
I would feel ashamed to be pulled over by the police for speeding through these towns.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
These rules make no sense for me, as I am a very precise driver who brakes quickly.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Speeding through the towns increases the chance of me hitting a pedestrian.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
I intend to go through similar towns at the higher speed in the next two months.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
The people I like to be around would never obey these town speed limits.	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

Next Question

196

197 *Early projects in the NETI Rural Safety program*

198 The early analyses from these survey data applied a basic descriptive analysis based on the statistically
 199 significant comparison of means, which suggest that; 1) there is no significant culture of bad driving on
 200 the part of the rural segment of our sample: and 2) their set of attitudes are far more pro-safety than either
 201 their urban or suburban counterparts (18). The study team was not entirely satisfied by the results from
 202 these standard descriptive analyses comparing rural and urban drivers, thus the team decided to

203 investigate alternate approaches to analyzing the data that would allow them to explore more nuanced and
204 latent differences between groups that could not be easily parsed via standard analysis methods.

205 In order to better understand attitudes which are associated with dangerous driving behavior, the
206 Rural Safety research program decided to apply two separate approaches. Under the first approach, not
207 covered by this paper, all potential theories were reviewed for inclusion in a structural equation model
208 (SEM) involving the creation of ‘latent factors’ to explore the interaction of several factors concerning
209 attitudes, and their relationship with the factor representing risky driving behavior (19). The application of
210 the SEM revealed, as expected, that only a small number of attitude-based latent factors were needed to
211 predict risky driving behavior in a model with a satisfactory level of “goodness of fit.” The resulting
212 model was then run simultaneously for one urban sample, and one non-urban sample to allow the direct
213 comparison of model parameters. That research method suggested that sensation seeking may be far more
214 relevant for the non-rural group, with a comparatively larger role for denial of risk in the rural group.

215 Concerning the second approach, the study team desired to go beyond the “urban vs. rural”
216 dichotomy, and apply a modeling process which would reveal as accurately as possible how the
217 population might be segmented into the most meaningful and usable market segments. This paper
218 discusses this segmentation approach and the results of this analysis.

219 **LATENT CLASS ANALYSIS OF DRIVING ATTITUDES AND BEHAVIORS**

220 **Latent Class Technique**

221 Previous analyses of the NETI rural safety survey focused on the development of methods which linked
222 attitudes and behavior. Those models were tested for different population segments that were identified *a-*
223 *priori* based on characteristics such as age, gender or residence location (rural vs. urban). And, while
224 significant differences were found in the models for each of these population segments, differences in
225 attitudes and behavior are likely more complex and must instead be explained by multiple factors.

226 The analysis described in this paper complements the previous work by identifying segments of
227 the population that emerge post-hoc from patterns of attitudes that are shared by those different groups.
228 Latent class modeling assumes that the population can be segmented into a finite number groups, or
229 classes, according to some combination of characteristics. The individuals within each of the groups share
230 similar characteristics and are dissimilar from those in other groups according to those same
231 characteristics. Latent class cluster methods use a statistical model-based approach to determine the
232 nature of those groups and the membership of individuals in them based on patterns of the characteristics
233 observed in the data, rather than *a priori* as in simpler segmentation approaches. Class membership is
234 assumed to be probabilistic so each individual can, in theory, possess characteristics of each class, to
235 varying degrees according to their class membership probabilities. Standard statistical tests can be used to
236 determine the most appropriate number of segments (clusters) that should be used to classify the
237 population according to the characteristics selected for the segmentation. Once the classes are defined, the
238 members of those classes can be profiled along with the characteristics used to define the classes as well
239 as any other variables that are not used to define the classes.

240 In this study, the latent class modeling was conducted using the set of drivers’ attitudes and
241 hypothetical behavioral situations as the basis for defining the classes. Since attitudes affect behavior in
242 some way, understanding the sets of attitudes that correspond to certain patterns of behavior can provide
243 indications of which attitudes must be affected to, in turn, affect behavior.

244 The latent class cluster model described in this paper was estimated using Latent GOLD 4.5. The
 245 technical documentation for Latent GOLD describes in detail the specification and estimation of latent
 246 class cluster models (4).

247 **Latent Class Results**

248 The latent class modeling effort is an iterative process, which starts with a large number of variables
 249 (called “indicators”) used in the specification. The large set of variables is narrowed down throughout the
 250 process and results in a core set of variables that each have significant effects on cluster classification;
 251 this is determined based on the computed R^2 of each variable. This value represents the explanatory
 252 strength of the variable in determining cluster membership. TABLE 1 shows the indicator variables used
 253 in the final model developed for this analysis, sorted by their associated R^2 values.

254 **TABLE 1: LATENT CLASS MODEL INDICATOR VARIABLES**

Indicator Variables	R^2
Tailgating the car in front of me would increase the chance of having a bad accident	0.42
Disregard the speed limit on a two-lane highway	0.38
I am confident that if I wanted to, I could drive within the town speed limits	0.36
I am confident that I could resist the temptation to tailgate if I wanted to	0.36
Go more than 75 mph on an interstate	0.34
I would feel ashamed to be pulled over by the police for tailgating the slow car	0.32
Hurting someone else with my car would scar me for life	0.32
Disregard the speed limit on a residential road	0.31
Go more than 80 mph on an interstate	0.30
I think it's okay to speed if the traffic conditions allow you	0.29
Speeding through the towns increases the chance of me hitting a pedestrian	0.29
Driving close to the car in front of me would make me nervous	0.27
Race away from traffic lights with the intention of beating the driver next to you	0.26
I like new and exciting experiences, even if I have to break the rules	0.25
I usually go through towns at the higher speed (over 45 mph)	0.25
I would feel ashamed to be pulled over by the police for speeding through these towns	0.24
There is a good chance the police will pull me over for going over 45 mph in these towns	0.23
It is dangerous to drink and drive	0.23
Always restricting myself to the speed limits would be very difficult to do	0.22
I intend to go through similar towns at the higher speed in the next two months	0.22
It is mostly up to me whether or not I drive close to the car in front of me	0.21
How often do you do exciting things, even if they are dangerous?	0.18
I would feel really annoyed if I had to drive behind such a slow vehicle	0.18
How often do you do dangerous things for fun?	0.17
How often have you taken sick time off work when you have something more interesting to do?	0.17
The people I like to be around will tailgate a slow car in the next two months	0.17

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 256 Additionally, other statistics are used to determine the model fit and the optimal number of
 257 classes or clusters. This modeling effort resulted in a four-class model which was developed to understand
 258 driving attitudes and behaviors.

259 Once the clusters are determined, they can be examined in terms of various demographics and
 260 other data in order to better understand the make-up of each cluster. TABLE 2 includes a summary of
 261 demographic variables and more tangible measures of driving behavior (i.e., the percentage of
 262 respondents who have received traffic tickets and/or been in a car crash).

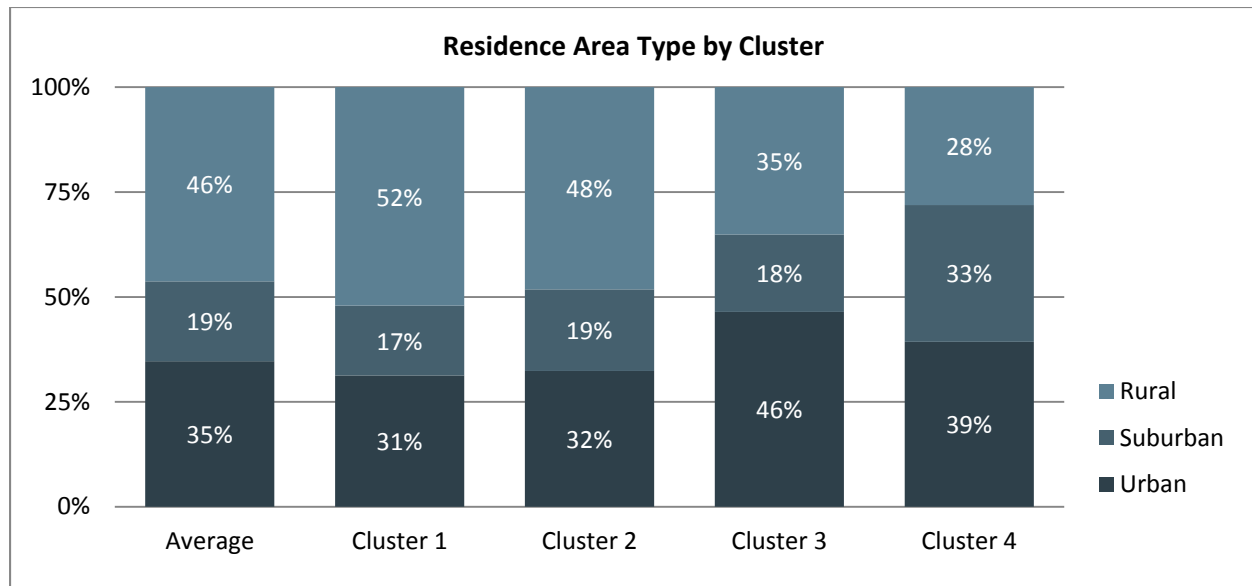
263 **TABLE 2: SUMMARY OF DEMOGRAPHICS BY CLUSTER**

Cluster	% of sample	Geography	Age	% with one or more tickets	% with one or more crashes
Cluster 1	48%	More rural	Older	39%	20%
Cluster 2	28%	More rural	Mix	47%	27%
Cluster 3	16%	More urban	Younger	42%	23%
Cluster 4	9%	More suburban	Younger	60%	37%

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 265 Cluster 1 is the least likely to have received a traffic ticket (39%) or be in a crash (20%) and
 266 Cluster 4 is the most likely (60% and 37%, respectively), suggesting that attitudes about driving manifest
 267 in measurable driving outcomes (tickets and crashes). If risky attitudes about driving could be altered,
 268 perhaps this would lead to safer driving.

269 Clear differences can be seen between the clusters when examining the density of the area where
 270 they live (FIGURE 1 1). Roughly half of those in Cluster 1 and 2 live in a rural area, while nearly half of
 271 Cluster 3 lives in an urban environment. Cluster 4 is *least rural* of the four clusters, and the most
 272 suburban, with a third of those in this cluster living in the suburbs. Importantly, the more rural clusters are
 273 *less* likely to participate in risky driving behaviors, which reinforces the conclusions of earlier work
 274 utilizing this dataset, as well as the reported work of others (see AAA Safety Foundation, (20) and
 275 Rackauskus (11)). Comparing the clusters in the present analysis, some of this may be due, in part, to the
 276 fact that they tend to be older than the Cluster 3 and 4.

277 **FIGURE 1: RESIDENCE AREA TYPE BY CLUSTER**

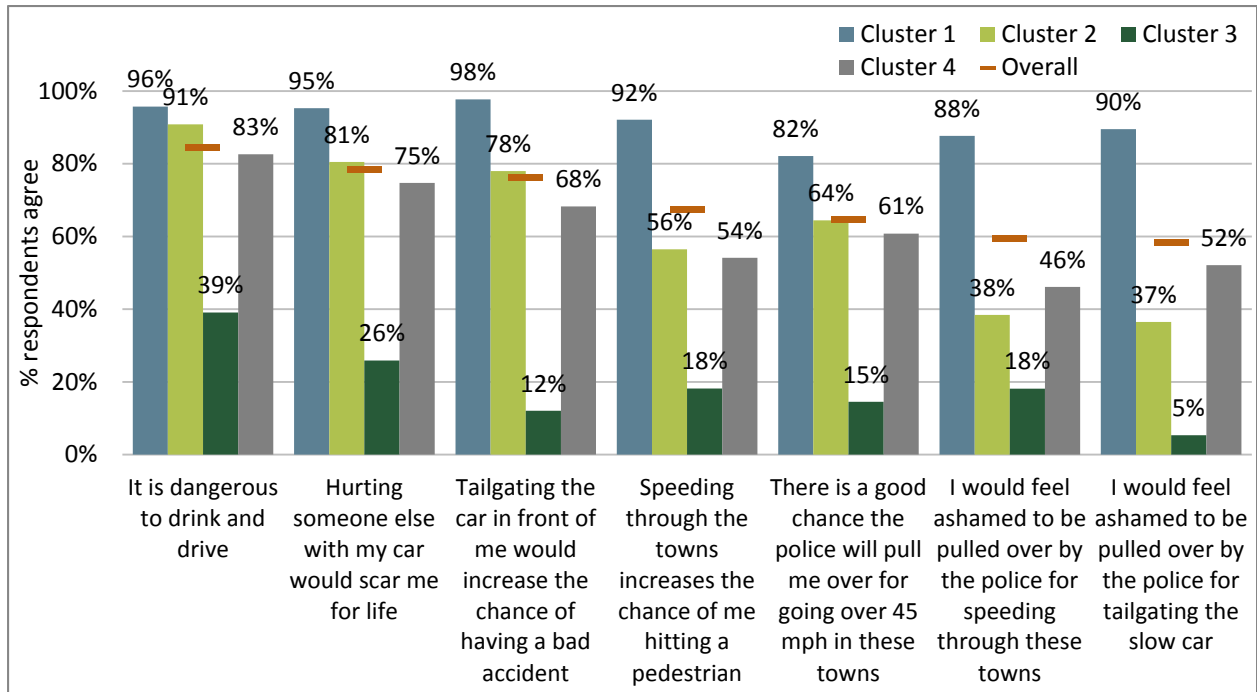


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280 *Observations by groups of key variables*

281 Each of the four clusters was reviewed in terms of the percent of members of each cluster that
 282 agreed with key attitude statements in several areas, three of which are reported here: a) Acceptance of
 283 Danger /Feeling of Shame, b) Self control/Self efficacy; and, c) Sensation Seeking. Each cluster was then
 284 reviewed in terms of bad driving habits, number of tickets received, and number of crashes experienced.
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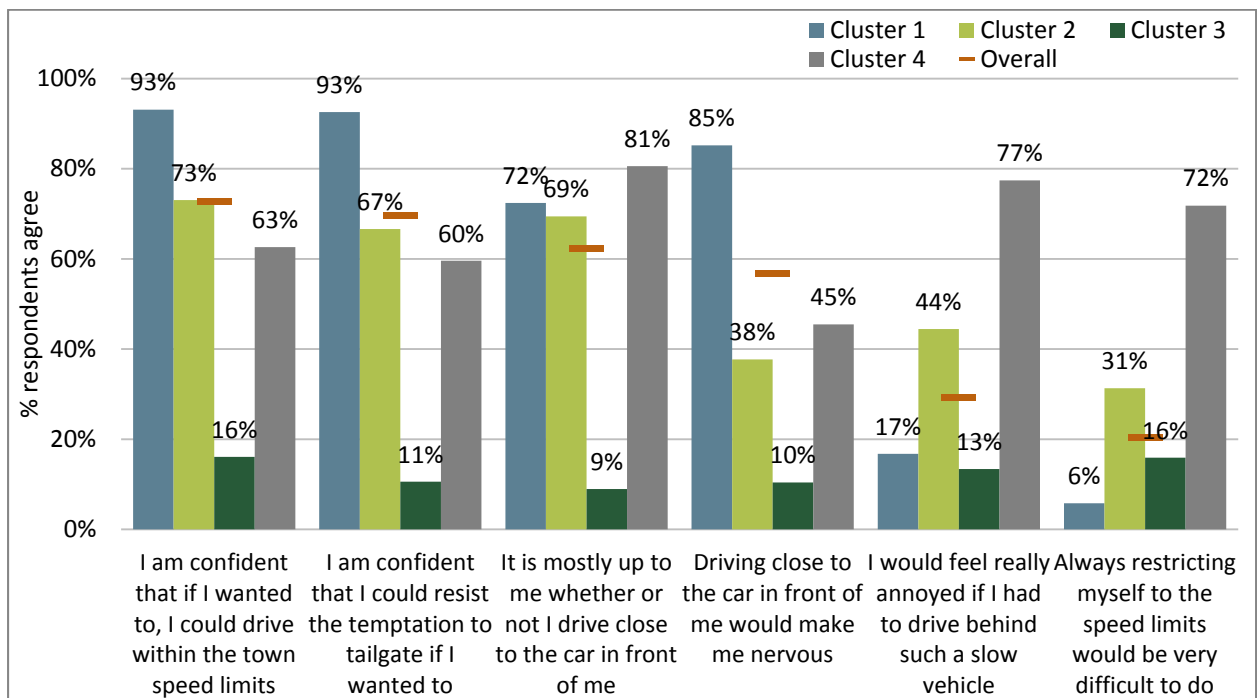
286 **FIGURE 2: ACCEPTANCE OF DANGER/FEELING OF SHAME**



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Cluster 1 strongly identifies with the attitude statements involving acceptance of dangers and responsibilities for their actions. Cluster 2 and 4 are also concerned when there is a chance they could hurt someone else; however they are not as concerned about what others think. Cluster 3 does not recognize that their driving could hurt others and does not accept the concept of shame for these behaviors.

294 **FIGURE 3: SELF CONTROL/SELF EFFICACY**

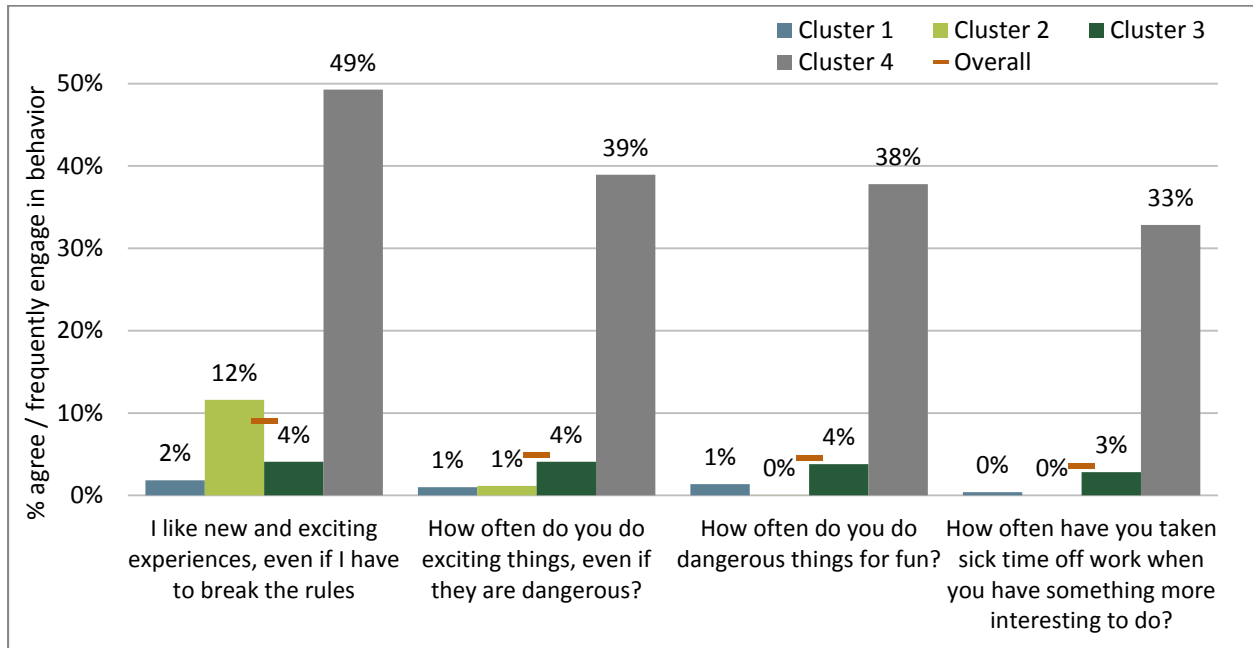


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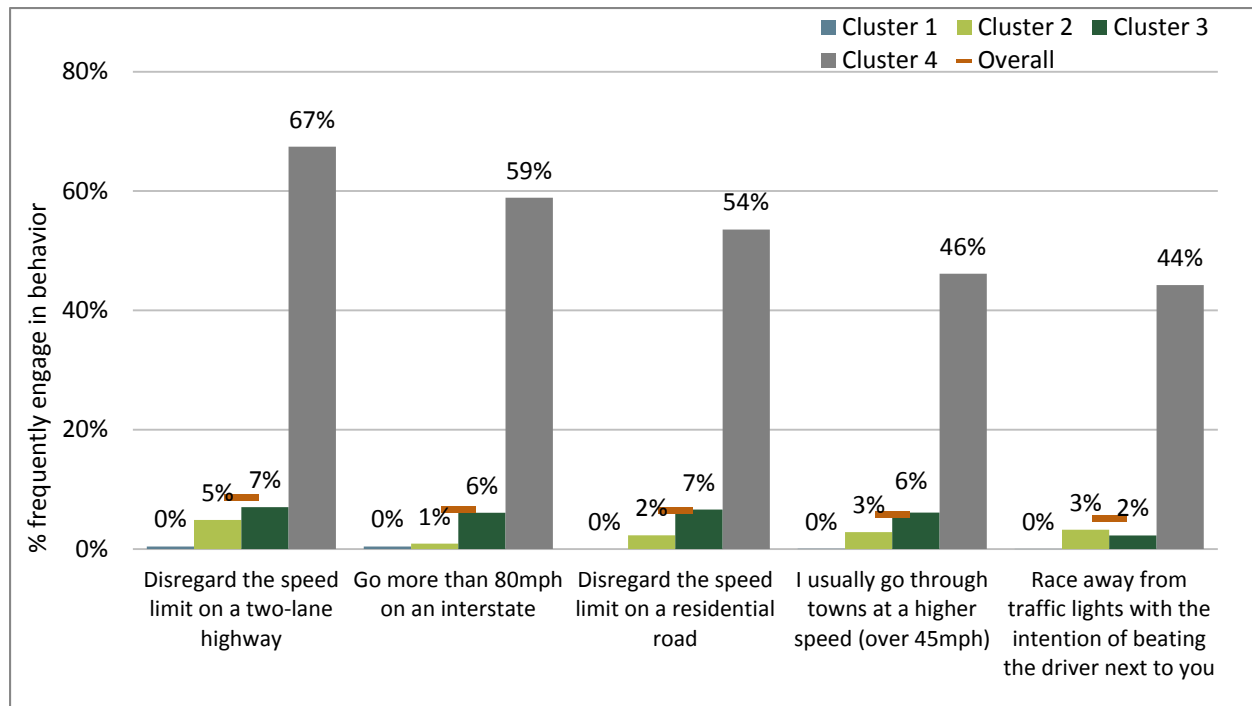
Cluster 1 members believe they can control their actions and resist temptation. Cluster 2 believes they can control their behavior, though to a lesser extent; but they are more likely to feel annoyed by slow drivers. Cluster 4 is less likely to believe they can control their actions and resist temptation—despite realizing their driving could hurt others. Cluster 3 is the least likely to feel they have control over a potential change in their behavior, consistent with their lack of belief that there really is a problem.

FIGURE 4: SENSATION SEEKING



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From the four indicators we utilized, it is clear that membership in Cluster 4 is very much influenced by propensity towards sensation seeking. From the point of view of attitudes and personality, sensation seekers appear in Cluster 4. The importance of this becomes more clear in the next graph which shows the relationship of Cluster 4 membership to risky driving behavior (the questions used in the survey instrument concerning Sensation Seeking were influenced by a key paper on how to collect this information on a cost effective basis, *Stevenson, et al. (21)*).

312 **FIGURE 5: RISKY DRIVING BEHAVIOR**313
314315 *Risky Driving Behaviors, Number of Tickets and Crashes*

316 As expected based on the attitudinal variables, Cluster 1 is the most law abiding group, with only 30% of
 317 the members report receiving traffic tickets, with almost no member reporting a risky behavior. It is
 318 perhaps surprising that Cluster 3, with their denial of risk and refusal to report shame, emerges as slightly
 319 better in terms of the number of tickets received than does Cluster 2. Cluster 4 emerges as expected as the
 320 least law abiding group, with 47% reporting having received at least one ticket while fully two thirds
 321 reported at least one act of risky behavior.

322 This group ranking remains unchanged when observing the number of crashes, with only 20% of
 323 Cluster 1 reporting any crashes and 23% of Cluster 3. With 27% of Cluster 2, and 37% of Cluster 4
 324 reporting crashes, the position of Cluster 4 as the most dangerous group on the road is reinforced.

325 *Summary of Clusters*

326 Cluster 1 tends to identify with the statements regarding acceptance of danger, self control and being
 327 safety conscious; they are not sensation seekers and do not engage in risky driving behaviors. This cluster
 328 is more rural than the other clusters. Members tend to be older than the other clusters, with a mean age of
 329 46 years old, which may also contribute to this group being safer drivers. As one would expect from the
 330 attitudes held by this group, they have much safer driving behavior—receiving the lowest number of
 331 traffic tickets and being less likely to be in a car crash.

332 Cluster 2 is aware of the risks associated with driving, but less likely to be ashamed if they are
 333 caught participating in risky behavior. They feel they can control their behavior at times, though to a
 334 lesser extent than Cluster 1. This group generally does not engage in risky driving behaviors as a default,
 335 though they can be driven to when outside factors (e.g., slow drivers) incite them to. Similarly, while they
 336 are less likely to report that “people they like” will tailgate a car than the problematic Cluster 4, they

337 report doing so at a rate twice that of Cluster 1 or 3. Cluster 2 is younger than Cluster 1, with a mean age
338 of 37 years old, and contains people from a mix of urban, suburban, and rural areas.

339 Cluster 3 simply denies the existence of risk and danger in driving, and seems to have no interest
340 in forming feelings of confidence that they *could* change their behavior. But, in evident contradiction to
341 this pattern, they don't feel inclined to participate in risky driving habits. The mean age for this cluster is
342 31 years old, making these respondents younger than the previous clusters. This group is the most urban
343 of the clusters, with 46% living in an urban environment.

344 Respondents in Cluster 4 tend to be sensation seekers and are the most likely group to participate
345 in risky driving behaviors. They seem to acknowledge the dangers associated with risky driving, though
346 sensation seeking appears to be a stronger driver of behavior. This problematic group is the least rural,
347 and the most suburban. Like Cluster 3, this cluster tends to be younger, with a mean age of 30 years old;
348 they are also the most likely to have received a ticket or been in a crash, which is consistent with their
349 attitudes about driving and safety.

350 CONCLUSIONS

351 Latent class cluster analysis, along with other methodologies, such as Structural Equations Modeling, can
352 be used to better understand drivers' attitudes that affect their driving behaviors. Results can be used to
353 better target safety messaging to the various groups of risky drivers—appealing to their sense of self
354 control, redirecting sensation seeking, or informing them of the risks of their driving behaviors.

355 The work described in this paper used latent class cluster analysis to identify segments of the
356 driving population which exhibit distinct patterns of attitudes and behavior. As might be expected, the
357 two extremes are represented in distinct segments: one which has attitudes and behavior supporting safe
358 driving and the other whose attitudes and behavior suggest unsafe driving with correspondingly
359 unfavorable outcomes (number of speeding tickets and number of crashes). And, as expected, the former
360 is a much larger fraction of the population (almost half of the total), while the later is a much smaller
361 portion (less than 10%). There are, however, two intermediate and more nuanced segments whose
362 attitudes and behaviors could potentially be affected positively by campaigns focused on the elements that
363 drive their behavior – for example, for Cluster 2, focusing on the specific events that incite them to react
364 unsafely in certain circumstances and for Cluster 3, providing evidence of the dangers of unsafe driving
365 habits.

366 The primary purpose of this work was to determine whether there are significant differences in
367 attitudes and behavior among rural residents that could contribute to the higher crash and fatality rates on
368 rural roads. Any conclusions should be couched within the context of the study that was conducted here,
369 including the fact that it covers only residents of northern New England and that the behaviors and
370 outcomes are self-reported. Clearly, an intervention that is based on a solid understanding of the attitudes
371 and beliefs of the rural driver could logically have the effect of lowering the accident rate, resulting with
372 fewer overall rural accidents, with their concomitant high propensity to result in fatalities.

373 However, the analysis has not found consistent evidence of an overall rural culture of unsafe
374 driving attitudes and behavior. If anything, this study finds the reverse; that is, rural residents in northern
375 New England tend toward the segments that exhibit attitudes and behaviors that support safer driving and
376 have better self-reported outcomes. This suggests that the overall worse outcomes on rural roads could
377 come from the characteristics of those roads (e.g., predominance of 2-lane roads without access control)

378 and from use of those roads by residents of other areas but is unlikely to be due to a culture among these
379 rural residents of unsafe driving behavior.

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