

1 **Evaluation of Vehicle-to-Pedestrian Communication Displays for Autonomous Vehicles**
2
3
4

5 **Michael Clamann, Corresponding Author**

6 Humans and Autonomy Lab, Duke University
7 Box 90300 Hudson Hall, Durham, NC 27708
8 Tel: 909-660-5388 Fax: 919-660-8963; Email: michael.clamann@duke.edu

9
10 **Miles Aubert**

11 Humans and Autonomy Lab, Duke University
12 Box 90300 Hudson Hall, Durham, NC 27708
13 Tel: 909-660-5388 Fax: 919-660-8963; Email: miles.aubert@duke.edu

14
15 **Mary L. Cummings**

16 Humans and Autonomy Lab, Duke University
17 Box 90300 Hudson Hall, Durham, NC 27708
18 Tel: 909-660-5388 Fax: 919-660-8963; Email: mary.cummings@duke.edu

19
20
21
22
23
24 Word count: 4840 words text + 4 x 250 words (each) = 5840 words

25
26
27
28
29
30
31 Submission Date: 7/29/2016

1

2 **ABSTRACT**

3 Previous work in human-centered design includes development of interfaces that improve driver
4 effectiveness; however, interfaces designed to communicate to pedestrians based on a vehicle's
5 perceived intent are limited. For the present work, we investigated intent communication for
6 autonomous vehicles by comparing the effectiveness of various methods of presenting
7 vehicle-to-pedestrian street crossing information. A prototype forward-facing display was
8 developed for vehicle-to-pedestrian communication, and an experiment was conducted in a
9 naturalistic setting to compare signaling designs using a simulated autonomous vehicle. In the
10 experiment, a van representing an autonomous vehicle presented information to pedestrians
11 informing them when to cross a street. Participants made crossing decisions from two locations, a
12 marked crosswalk and an unmarked midblock location. Individual differences, including age,
13 gender, crossing location and conscientiousness were predictive of safe crossing decisions.
14 Participant response times were analyzed to determine which display types resulted in the fastest
15 and safest decisions. The results suggest pedestrians will rely on legacy behaviors rather than
16 leverage the information on an external display. A large number of participants, however, believe
17 additional displays will be needed on autonomous vehicles. The results of the experiment can be
18 used to help inform future designs for vehicle-to-pedestrian communication.

19

20

21

22

23 *Keywords:* Human Factors, Pedestrian Safety, Automated Vehicle Control, Signalization,
24 Driverless Cars, External Displays

25

1 INTRODUCTION

2 The impact of autonomous vehicle technologies on safety is potentially enormous given that
3 human error accounts for an estimated 94% of accidents on the road (1). Unlike human drivers,
4 autonomous vehicles can eventually be expected to perform at high levels of precision without
5 experiencing decreased performance due to distraction or fatigue. However, while advances in
6 algorithms and sensor technologies continue to improve vehicle performance on roadways and
7 safe operations around other vehicles, interactions with high risk groups, such as pedestrians,
8 remain a concern.

9 In contrast to motor vehicles, pedestrian behaviors are not particularly constrained by
10 traffic regulations, which makes them unpredictable much of the time (2). Previous research
11 observing pedestrian crossing behaviors shows the minority complies with signals, while the
12 majority exhibits “gap-seeking” behavior in which the pedestrian crosses the street when a
13 sufficient break between traffic is available, regardless of the state of the signal (3). These
14 behaviors are not without risk, however. Pedestrians who run into the road, fail to yield the right of
15 way and/or otherwise cross improperly account for around 50% of pedestrian fatalities (4). In the
16 ten years from 2005 and 2014, while the number of people injured in motor vehicle crashes
17 decreased by 13%, and the number of fatalities decreased by 25%, the number of pedestrian
18 fatalities has remained flat, and has been increasing since a record low in 2009. Pedestrians
19 currently account for about 15% of traffic fatalities, totaling 4,884 in the US in 2014 (5).

20 When conventional cars and trucks are replaced with autonomous vehicles and the
21 occupants are no longer in control (or paying attention), the responsibility for communicating with
22 pedestrians will be allocated to the vehicle. The occupant may not be available to make eye contact
23 or wave a pedestrian ahead, and signaling techniques like the horn or flashing lights, which
24 communicate limited information, can be confused with other messages and warnings. There is a
25 need, therefore, for new methods of vehicle to pedestrian communication to communicate intent
26 information in the immediate area.

27 Developers of autonomous vehicle technologies have proposed multiple types of
28 displays, including digital road signs, text, audible chimes and voice instructions to communicate
29 intent to pedestrians (6, 7). However, the effectiveness of these displays on autonomous vehicles
30 has not been tested empirically. With this in mind, we developed a prototype forward-facing
31 display for vehicle-to-pedestrian communication and conducted an experiment in a naturalistic
32 setting to compare various designs on a simulated autonomous vehicle. In the study, a van
33 representing an autonomous vehicle presented information to pedestrians informing them when to
34 cross a street. Participants representing pedestrians made crossing decisions from two locations, a
35 marked crosswalk and an unmarked midblock location. Participant response times were compared
36 to determine which display types resulted in the fastest and safest decisions. The following
37 sections describe the design of the displays and the subsequent experiment.

38 DISPLAY DESIGN

39 The Manual on Uniform Traffic Control Devices (MUTCD) provide guidelines for pedestrian
40 signal indications, including size and shape. For example, the MUTCD indicates that “symbols
41 should be at least 9 inches (23 cm) high” if they need to be understood from 100 feet (30 m) away
42 (8). However, these guidelines were designed for stationary signal indicators installed at
43 crosswalks, not displays on moving vehicles. At 25 mph (40 km/h) a car travels 100 feet (30 m) in
44 the time it takes a pedestrian to cross a lane of traffic. That means the pedestrian needs to have
45 detected and interpreted the signal indication and made a decision before the car is 100 feet (30 m)
46 away. Therefore, signals that include symbols or text may need to be larger than current

1 requirements if they are going to be installed on moving vehicles. Indeed, signs aimed at drivers
 2 are notably larger. For example, the symbol of a pedestrian on a sign identifying a crosswalk to
 3 drivers must be at least 30 inches (76 cm) high when installed on single lane roads and up to 48
 4 inches (122 cm) on highways (8).

5 Human factors guidelines for determining character height on a visual display
 6 recommend a minimum of 16 minutes of visual angle (VA) and a preferred VA of 20 minutes
 7 according to the following formula (9):

$$VA = \frac{3438 \times H}{D}$$

8 Where H is the height of the symbol and D is the distance. For example, the recommended size of
 9 a 20 VA stimulus viewed at 100 feet (30 m) would be 7 inches (18 cm).

10 For a pedestrian making the decision to cross a street in front of a moving vehicle, it was
 11 necessary to increase the size above that of a static display. This means the symbol needed to be
 12 large enough for a pedestrian to see and interpret the symbol while allowing enough time to make
 13 the decision to cross and physically cross the street. At 25 mph (40 km/h), the speed limit for
 14 residential and business locations, a car moves 37 feet (11 meters) every second and requires at
 15 least 32 feet (10 m) of stopping distance on dry pavement. A healthy adult pedestrian crosses the
 16 street at approximately 4.4 feet (1.3 m) per second, which means the pedestrian can cross a single
 17 lane of traffic in approximately 2.7 seconds (8, 10). The perception reaction time (PRT) used for
 18 design standards by the American Association of State Highway and Transportation Officials
 19 (AASHTO) is 2.5 seconds, including 1.5 for perception and decision of the symbol and 1.0 for
 20 making a response (11). At a speed of 37 feet (11 m) per second, a signal should therefore be
 21 readable at 200 feet (61 m). Following these assumptions, a symbol with a height of 20 min of VA
 22 at 200 feet would need to be at least 14 inches (36 cm) tall to account for perception, decision and
 23 crossing time.

24 The display in this study used recognized symbols for “Walk” and “Don’t Walk” and
 25 numeric data as opposed to text. This was done due to the size limitations of a legible text display.
 26 To be visible at 100 feet, a letter would need to be 6 inches tall and approximately 3.6 inches wide.
 27 So a screen designed to display a simple message like “safe to cross” without scrolling horizontally
 28 would require a screen at least 47 inches (119 cm) wide. At 200 feet (61 m) the same message
 29 would need to be over 100 inches (254) wide, which is wider than most cars. Research has also
 30 shown that text needs to be twice as tall as symbols to be recognized; so a text display may need to
 31 be even larger (12).

32 The symbols used in the experiment appear in Figure 1. The “Walk” and “Don’t Walk”
 33 symbols appeared on the advisory display. The advisory display indicated when it was safe or not
 34 safe to cross in front of the vehicle (Figure 2, left and middle). “Don’t walk” advice was always
 35 provided when the vehicle was in motion. “Walk” was presented only when the vehicle came to a
 36 stop. These two symbols were selected because previous work in human factors shows them as
 37 recognizable to 95% of the population (13). The second display type was the information display
 38 (Figure 1, right). The information display presented the vehicle’s speed dynamically.



FIGURE 1 Intent displays including (from left to right) cross advisory, don't cross advisory and information

The two designs provided for a comparison of two types of information. The advisory display made decision recommendations for the pedestrians. In contrast, the information display reported information about the vehicle's behavior to inform the pedestrian's decision. Instead of requiring the pedestrian to use environmental cues to determine whether the vehicle was slowing, the display could indicate to the pedestrian whether the vehicle was maintaining its current speed or slowing down. The symbols on the display were 16.75 inches (42 cm) tall, and viewable at 250 feet (76 meters). The symbols were presented in white on a black background for maximum contrast. The display's backlight, brightness and contrast were also adjusted to their maximum levels (100 on a 0-100 scale) using the setup menu to improve visibility. During pilot testing, a prototype "don't walk" symbol presented in red and a green "walk" symbol did not provide sufficient contrast on the black background in direct sunlight. Once the design was finalized and pilot testing determined the symbols were readable at 250 feet, an experiment was conducted to compare the effectiveness of the two displays against a control condition.

METHODS

Apparatus

The vehicle used for the experiment was a Dodge Sprinter van (Figure 2) reported to participants as an autonomous vehicle. In practice, however, the vehicle was manned by a dedicated driver, as mandated by law, and an observer. Participants were told the vehicle was staffed only for data collection and as a backup to the autonomous control. The driver was responsible for driving the vehicle according to experiment protocols. The observer controlled the display mounted on the front of the van, according to the experiment condition, and communicated via radio headset with two researchers assigned to observe the two participants in each test session.



FIGURE 2 Experiment vehicle in motion, displaying advisory information

A 32-inch (81 cm) LCD was mounted to the front of the van for vehicle-to-pedestrian communication. The forward-facing display presented one of three indicators to participants (Figure 1), including:

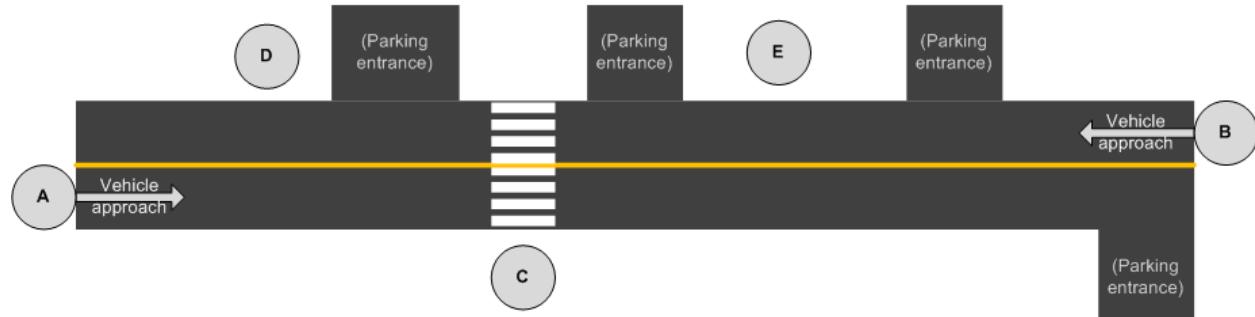
1. Advice – A dynamic display indicating when it was safe or not safe to cross in front of the vehicle
2. Information – A dynamic display presenting the speed of the vehicle
3. Off - A blank screen with no additional information.
4. Control – The display hidden beneath a shroud.

In the control condition, participants were told the van was operated by the human driver. In the other three conditions the participants were told the van was operating autonomously. The external display was controlled by the observer inside the van using an Android tablet wired to the display. A custom application installed on the tablet updated the display dynamically based on GPS coordinates.

Procedure

Experiment trials included pedestrian crossing scenarios in which participants initiated crossing in front of an autonomous vehicle at a crosswalk or midblock. The goal of each trial was for the participants to briefly observe the approaching vehicle and indicate when it was safe to cross. Two participants performed each experiment trial, each at different distances from the vehicle's start location. One participant represented a pedestrian crossing at a crosswalk (P1), and the other represented a jaywalker crossing midblock without a crosswalk (P2). Participants were instructed to wait at two separate crossing positions on opposite sides of a street. Figure 3 shows a diagram of the experiment location, including vehicle approach and pedestrian crossing positions.

24



25

FIGURE 3 Vehicle and crossing positions. Experiment vehicle approaches from positions A and B. Participant 1 crosses at position C using a crosswalk. Participant 2 jaywalks at positions D and E.

Figure 3 shows an approximate layout of the positions. Points A and B identify vehicle approach locations. C identifies the position for P1, and D and E identify the two positions for P2. During each trial, the vehicle approached from points A or B (depending on direction of travel) and slowed to a stop at point C to allow P1 to cross safely at the marked crossing. As Figure 3 shows, the direction of travel also determined whether the vehicle would be approaching from the near or opposite side of the street. After coming to a complete stop, the vehicle continued driving to complete the route. P2 waited at position D or E, whichever was closer to the approaching vehicle. This was done to require the jaywalker to make a decision to cross or not cross in front of a moving vehicle (positioning P2 at or beyond the crosswalk would allow the participant the option to cross when the vehicle was stopped). P2 was directed to change positions after each crossing to maintain a consistent distance from the vehicle.

1 A researcher was assigned to each participant to start each trial, record the crossing data
2 and prevent participants from walking in front of the vehicle. Both participants were presented
3 with the scenario that they were late for a job interview and getting directions from the
4 experimenter. With the vehicle approaching and the participant's back to the street (facing the
5 experimenter), the experimenter started the trial by pointing to the participant's destination and
6 providing a vocal cue to cross (i.e., "it's there"). The participant would then turn to face the
7 approaching vehicle and indicate when it was safe to cross by walking forward from the start
8 position. The experimenter recorded the time between starting the trial and turning to face the
9 vehicle (the *acquisition* phase) and the time between turning to face the vehicle and beginning to
10 cross (the *decision* phase). The two distinct crossing phases were identified during pilot testing and
11 observed consistently throughout the experiment. A custom Android application was used to
12 record the crossing data. An outward-facing dashboard camera recorded the crossing behaviors of
13 all participants from the vehicle.

14 The experiment vehicle traveled at one of two predefined speeds, 25 mph (40 km/h) and
15 15 mph (24 km/h). Each trial began with the vehicle out of view of the participants, driving on the
16 road toward the participants' locations. The distance the experimenter gave the instruction to cross
17 was dependent on the vehicle's speed. At 15 mph (24 km/h), the instruction was given when the
18 van was 150 feet (46 meters) from the crossing position. At 25 mph (40 km/h), the instruction was
19 given at 250 feet (76 meters). This allowed the participant approximately seven (7) seconds
20 between the experimenters' instruction and the vehicle arriving at the participants' position.
21 Following the assumption that a healthy adult pedestrian crosses a single lane of traffic in
22 approximately 2.7 seconds (8, 10), participants had approximately four (4) seconds to make the
23 decision to cross safely.

24 Participants completed a demographic questionnaire prior to participating in the
25 experiment. The questionnaire included questions about street crossing behaviors and perceptions
26 about autonomous vehicles. They also signed an informed consent and completed the NEO™
27 Five-Factor Inventory-3 (NEO-FFI-3; 14). The NEO-FFI-3 is brief but comprehensive assessment
28 of five personality domains, including neuroticism, extraversion, openness to experience,
29 agreeableness, and conscientiousness.

30 Following a brief orientation explaining the procedures and crossing scenarios, the
31 participants were told they would be crossing in front of a prototype autonomous vehicle and to
32 attend to the display on the front of the vehicle. Participants were assigned to one of the two
33 positions (crosswalk or midblock) for the duration of the experiment (i.e., individuals completed
34 all experiment trials at crosswalk or midblock). Each participant completed 16 trials to include all
35 combinations of display (4 types), speed (2 levels) and direction of vehicle travel (2 directions).
36 Presentation order of the 16 speed and display combinations was randomized for each experiment
37 session. At the end of the experiment, each participant completed a structured interview in which
38 they described their crossing strategies and provided opinions about the displays.

39 The independent variables included the two levels of vehicle speed (25 or 15 mph) and
40 four displays (advice, information, off, control). The dependent variable was the response time.
41 We hypothesized that the symbolic presentations would reduce the time needed to make a decision
42 to cross in front of the vehicle and would therefore improve response times compared to no
43 display.

44

RESULTS

Participants

Fifty participants between the ages of 19 and 60 ($M=25.7$, median = 22) were recruited for the study, including 17 male and 33 female participants. All participants had experience crossing streets and 96% reported that they cross the street several times a day. Participants were paid \$30 for completing the experiment. All participants were required to have 20/20 or corrected to normal vision and no mobility impairments. The Duke University Institutional Review Board (IRB) for Non-Medical Research approved the study.

Response Time

Figure 4 presents the average decision times for participants at the two crossing positions (crosswalk and midblock) for each of the four display conditions. Decision time represented the time between turning to face the vehicle and beginning to cross; therefore, this measure included the earliest point participants were aware of the state of the display.

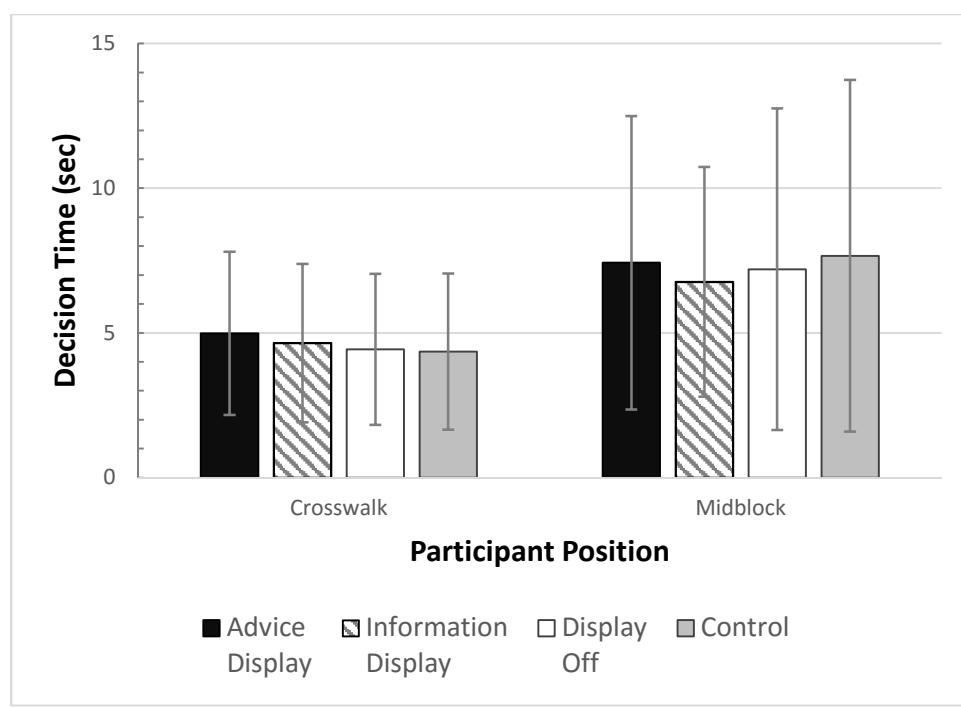


FIGURE 4 Average decision times for the four display conditions for crosswalk and midblock positions. Error bars represent one standard deviation.

Figure 4 shows the lowest average decision time was 4.35 seconds for participants at the crosswalk under the control condition, and the highest was 7.66 seconds for jaywalkers also under the control condition. It is important to note that many participants at the midblock position waited for the vehicle to pass their position before crossing. Participants at midblock positions made the decision to cross after the vehicle passed 56% of the time, while participants at the crosswalk waited until after the vehicle came to a complete stop 28% of the time. This may have extended decision times at the midblock position as participants checked the road a second time to determine if it was clear of other traffic.

Because participants could elect to wait until the vehicle passed to cross, a nested analysis of variance (ANOVA) model was used to both identify significant differences among the display

1 conditions and to identify additional factors affecting decision times. The model included main
2 effects for display, speed, and position, while gender, age and the conscientiousness measure from
3 the NEO-FFI were covariates. These variables were nested in the participants' decision to cross in
4 front of or behind the vehicle.

5 The ANOVA model failed to reveal any effect due to display ($F(3,27)=0.56, p=0.641$);
6 however, other factors were significant. Crossing position had a significant effect on decision
7 times with participants at the crosswalk making faster decisions than the jaywalkers
8 ($F(1,27)=31.86, p<0.0001$). On average, crosswalk participants required 4.60 seconds ($SD=2.72$)
9 to make a crossing decision, while midblock participants required 7.26 seconds ($SD=5.22$). This
10 difference is evident in Figure 4. Decision times were significantly faster for participants at the
11 crosswalk, even when accounting for individuals who waited until the vehicle passed
12 ($F(2,27)=633.10, p<0.0001$). In other words, even when observing only those trials in which
13 participants crossed in front of the vehicle, crosswalk participants still made faster decisions than
14 midblock participants. This difference could be attributed to participants' expectation that the
15 vehicle would stop at the crosswalk. Participant conscientiousness was a significant covariate on
16 decision time ($F(1,27)=20.00, p<0.0001$) with participants with higher conscientiousness scores
17 deciding to cross faster than those with lower scores. Neither age ($F(1,27)=0.063, p=0.802$) nor
18 gender ($F(1,27)=2.50, p=0.114$) had a significant effect on decision time.

19 An additional ANOVA was run comparing average acquisition times at the two crossing
20 positions. Acquisition represented the time between receiving the instruction to cross and turning
21 to face the oncoming vehicle and therefore did not include awareness of the display condition. The
22 results showed significant differences due to crossing position ($F(1,10)=20.78, p<0.0001$), with
23 jaywalkers ($M=1.23, SD=0.49$) turning to face the experiment vehicle faster than participants at the
24 crosswalk ($M=1.49, SD=0.67$). This is an expected result since the jaywalking participants were
25 crossing in an unprotected space. Age ($F(1,10)=7.24, p=0.007$) and conscientiousness
26 ($F(1,10)=24.17, p<0.0001$) were also significant. Gender was significant to acquisition time
27 ($F(1,10)=29.88, p<0.0001$), which was in contrast to the decision time results. On average, men
28 had shorter acquisition times ($M=1.25, SD=0.51$) compared to women ($M=1.46, SD=0.64$).

29 A logistic regression model was run to identify factors affecting "safe" or "unsafe"
30 crossing behaviors, including the display, position, speed, gender and age. Per the experimental
31 setup, decisions to cross between 4 and 7 seconds after receiving the command to cross were
32 considered unsafe, as crossing during this three-second window would place the participant in the
33 path of the vehicle. The results of the test failed to show any significant differences in the number
34 of unsafe crossings based on display ($\chi^2(3,N=849)=1.08, p=0.782$) or gender ($\chi^2(1,N=849)=0.19,$
35 $p=0.665$). Vehicle speed was significant ($\chi^2(1,N=849)=21.87, p <0.0001$), with the slower speed
36 condition leading to more unsafe crossing decisions. Age was also significant ($\chi^2(1,N=849)=9.79,$
37 $p=0.002$). Older participants tended to make more safe crossing decisions than younger
38 participants. Finally, position was also significant to the decision to cross safely
39 ($\chi^2(1,N=849)=9.09, p=0.003$), in that participants made significantly more *unsafe* crossing
40 decisions when the vehicle was on the opposite side of the street.

41
42 **Subjective Interviews**
43 At the end of each experiment session, participants were asked to identify the most important piece
44 of information needed to cross safely in front of the vehicle and whether the vehicle-to-pedestrian
45 display influenced their crossing decisions. Seventy-six percent of participants reported seeing the
46 display on the front of the vehicle during experiment trials. However, only 12% reported that it
47 influenced their decision to cross, which agrees with the ANOVA results. Distance to the vehicle

1 was reported to be most important in the decision to cross, with 56% of participants noting it as a
2 factor. This is consistent with previous findings that gap distance is the main determinant of a
3 pedestrian's decision to cross (3). Speed was reported second in importance (46%), and traffic
4 density in third (24%). Just two participants identified the display as the most important source of
5 information. Despite these results, nearly half of the participants (46%) also reported that having
6 displays like the ones used in the experiment would be helpful when autonomous vehicles become
7 available.

8 **DISCUSSION**

9 Uniform standards for traffic signals have existed in the US for over 90 years (8). During that time,
10 regulatory agencies have refined signal designs based on traditional models of surface
11 transportation in which human drivers are expected to attend to a multitude of stimuli. With the
12 development of autonomous vehicles, many of these legacy systems will need to be revisited. For
13 the current work, we developed a preliminary prototype of a vehicle-to-pedestrian communication
14 signal inspired by similar designs (6, 7). The design process included many challenges, most
15 importantly the design of a familiar signal that could be interpreted at a substantial distance.

16 Current guidelines for traffic signals apply to stationary print or illuminated signs. New
17 guidelines will need to be developed if signals are going to be placed on moving vehicles,
18 particularly if they include crucial safety information. The limited time pedestrians have to detect
19 and interpret a signal is going to be an important consideration for the symbol, size and
20 photometric aspects. Messages will need to be simple, salient and familiar. Text messages other
21 than the most recognizable instructions (e.g., STOP) are potentially problematic solutions in
22 situations where decisions need to be made in a few brief seconds. Moreover, signals on moving
23 vehicles will need to account for numerous combinations of vehicles and pedestrians. A vehicle
24 that indicates its intent to stop by announcing "walk" to a pedestrian should not inadvertently
25 instruct the pedestrian to cross in front of another vehicle. A vehicle should be able to give a
26 pedestrian a recommendation to "walk" without giving bad advice to another pedestrian seeing the
27 same information from another intersection. In general, the designs need to scale from the single
28 car and single pedestrian to crowded urban intersections during rush hour, and they need to be
29 consistent across manufacturers.

30 For this research two types of vehicle-to-pedestrian communication displays were
31 designed and evaluated, including an advice and an information display. The advice display used a
32 familiar design, and the information used a more novel display to communicate vehicle's changing
33 speed. The results of the experiment failed to show any significant differences between the
34 displays, which means they were as effective as the current status quo of having no display at all.
35 Although this result is likely counter to expectations of those companies filing patents for such
36 displays, it still provides practical implications.

37 The results of the experiment were consistent with previous studies of crossing behavior
38 that indicate gap distance is the main determinant of a pedestrian's decision to cross. The
39 pedestrians recruited for this study all had experience crossing streets, and therefore all of them
40 have developed some sort of crossing strategies. It is likely that these existing strategies were a
41 stronger influence than the novel displays mounted on the front of the experiment vehicle.
42 Furthermore, individual differences including crossing position, personality, age and gender are
43 likely important contributors to an individual's decision to safely cross a road.

44 Current data on pedestrian injuries and fatalities also show differences among most of
45 these factors (15). In 2013, 69% of pedestrian fatalities occurred at midblock positions and 20%
46 occurred at crosswalks. Age groups from 10 to 29 years of age account for the highest pedestrian

1 injury rates, and male pedestrians are more than twice as likely to be killed as female pedestrians.
2 Our results showed that younger participants made more unsafe crossing decisions, and males had
3 shorter acquisition times than females at midblock locations. The results suggest that it may be
4 more important to understand individual differences affecting behaviors than on developing
5 information displays. These will be important design considerations as autonomous vehicles
6 become available.

7 As research in human factors engineering has shown, all displays (particularly displays
8 presenting safety information) must be tested comprehensively in context to make sure they work
9 as intended. When manufacturers of vehicles and electronic accessories propose
10 vehicle-to-pedestrian displays, it is crucial that they consider the broader implications of the
11 design, and that they incorporate user-centered engineering design and test practices to ensure that
12 autonomous vehicles meet intended safety expectations without introducing a new set of
13 unforeseen hazards.

14

15 **ACKNOWLEDGMENT**

16 This research was supported by a grant from the National Science Foundation (NSF) (No.
17 1548417) to Duke University. The technical monitor was Jordan Berg. The views and opinions
18 expressed are those of the authors and do not necessarily reflect the views of the NSF.

19

20

1 REFERENCES

- 2 1. Singh, S. *Critical Reasons for Crashes Investigated in the National Motor Vehicle Crash*
3 *Causation Survey*. Traffic Safety Facts Crash Stats. Report No. DOT HS 812 115. National
4 Highway Traffic Safety Administration. 2015.
- 5 2. Cambon de Lavalette, B., et al. Pedestrian Crossing Decision-Making: A Situational and
6 Behavioral Approach. *Safety Science* Vol. 47, No. 9, 2009, pp. 1248-1253.
- 7 3. Suh, W., D. Henclewood, A. Greenwood, A. Guin, R. Guensler, M. Hunter, M., and R.
8 Fujimoto. (2013). Modeling Pedestrian Crossing Activities in an Urban Environment Using
9 Microscopic Traffic Simulation. *Simulation: Transactions of the Society for Modeling and*
10 *Simulation International*, Vol. 89, No. 2, 2013, pp. 213–224
- 11 4. NHTSA. *Traffic Safety Facts 2004*. National Highway Traffic Safety Administration. Report
12 DOT HS 809 919. US Department of Transportation. 2005.
- 13 5. NHTSA. *Traffic Safety Facts 2014: Pedestrians*. National Highway Traffic Safety
14 Administration. Report DOT HS 812 270. US Department of Transportation. 2016.
- 15 6. Urmson, C, I. Mahon, D. Dolgov, and J. Zhu. *Pedestrian Notifications*. Google, Inc., assignee.
16 Patent US 9196164 B1. 24, 2015.
- 17 7. *Nissan IDS Concept: Nissan's Vision for the Future of EVs and Autonomous Driving* [Press
18 Release]. 2015.
19 <http://nissannews.com/en-US/nissan/usa/releases/nissan-ids-concept-nissan-s-vision-for-the-future-of-evs-and-autonomous-driving?la=1>
- 20 8. U.S. Department of Transportation, Federal Highway Administration. *Manual on Uniform
Traffic Control Devices for Streets and Highways* (Revision 2). 2012. Retrieved from Federal
21 Highway Administration website:
22 <http://mutcd.fhwa.dot.gov/pdfs/2009r1r2/mutcd2009r1r2edition.pdf>.
- 23 9. Sanders, M. S. and E. J. McCormick, *Human Factors in Engineering and Design* (Seventh
24 Edition). McGraw-Hill Education, New York, 1993.
- 25 10. Shinar,D. *Traffic Safety and Human Behavior*. Elsevier, Oxford, UK, 2007
- 26 11. Scott, A. C. et al. Perception of Pedestrian Signals by Pedestrians with Varying Levels of
27 Vision. *Transportation research record* 2299.2012 (2012): 10.3141/2299-07. PMC. 2016. pp.
28 2299-2012.
- 29 12. Kline, T., L. Ghali, D. Kline, and S. Brown. Visibility Distance of Highway Signs Among
30 Young, Middle-Aged and Older Observers: Icons Are Better than Text. *Human Factors*, Vol.
31 32, 1990, pp. 609-619.
- 32 13. Ben-Bassat, T. and D. Shinar. Ergonomic Guidelines for Traffic Sign Design Increase Sign
33 Comprehension. *Human Factors*, Vol. 48, 2006, 182-195.
- 34 14. Costa, P. T., Jr. and R. R. McCrae. (1992). Revised NEO Personality Inventory (NEO-PI-R)
35 and the NEO Five-Factor Inventory (NEO-FFI) professional manual. Odessa, FL:
36 Psychological Assessment Resources.
- 37 15. NHTSA. *Traffic Safety Facts 2013: Pedestrians*. National Highway Traffic Safety
38 Administration. Report DOT HS 812 124. US Department of Transportation. 2015.