Driving Performance and Its
Correlation with Neuropsychological
Tests in Senior Drivers with
Cognitive Impairment in Japan
(日本の認知障害のある高齢
ドライバーにおける運転技能と神経心
理学的検査との相関)

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#### INTRODUCTION

Dementia usually results in the deterioration of a wide range of cognitive functions such as memory, orientation, visual-spatial abilities, attention, judgement, decision-making, etc. [1], which overlap with the multiple cognitive domains involved in driving. Indeed, prior literature [2-4] has revealed that dementia or cognitive decline compromises the complex task of driving at multiple levels [5-7]. Additionally, accumulated evidence [8, 9] shows that drivers with dementia or cognitive impairment are more likely to be involved in accidents. While some patients in the early stages of dementia may be able to drive safely [10-12], the progressive nature of the disease implies that the cognitive functions necessary for safe driving would gradually deteriorate and eventually compel the patients to stop driving.

With the rapid aging of the population, the problem of dementia patients as drivers has increasingly emerged globally, including in Japan [13]. In Japan, automobile accidents caused by drivers aged 65 or above have increased since the 1990s [14]. Additionally, the driving license holding rate of seniors has also been increasing, with over 5.82 million seniors aged 75 years or more holding a driving license as at end-2019 [15], indicating that one of every three seniors aged 75 years or more holds a driver's license. In such a situation, Japanese researchers have been focusing on the driving problem of senior drivers with cognitive impairment [16-18], while the government has amended the Road Traffic Act several times in recent years to address this issue. According to the latest amendment implemented in March 2017, when senior drivers aged 75 or above apply for renewal of their driving licenses or commit some specified traffic violations, it is obligatory for them to undergo the Cognitive Impairment Screening Test for Senior Drivers (CISTSD). The CISTSD consists of temporal orientation tests, cued recall tests, and the clock drawing test (CDT). Based on the total score of the CISTSD, the cognitive function of the examinee is categorized as "impaired (the first category)," "slightly impaired (the second category)," or "unimpaired (the third category) [19]." As per the Road Traffic Act, it is mandatory for senior drivers to undergo a formal evaluation for dementia, if they are placed in the first category. Moreover, "dementia" has been specified legislatively as an independent reason for driving license revocation.

Worldwide, there is a consensus that the evaluation of senior drivers' fitness for driving should not be based solely on the medical diagnosis of dementia, but on the individual's actual driving ability [13, 20]. However, this complicated task has posed considerable challenges to health professionals, policy makers, and researchers. Many researchers have been trying to assess the driving ability of senior drivers with cognitive impairment using varied methods, including

neuropsychological tests [21], on-road tests [22], off-road driving simulation assessments [23], caregivers' interview [24], naturalistic driving [25], investigation of neuroimaging data [26], etc.

Given that neuropsychological tests, as office-based tools, are easy to administer and undergo, they have been proposed as good methods to predict driving ability. Individual neuropsychological tests were broadly categorized into several cognitive domains, such as global cognition, executive function, attention and concentration, visuospatial function, memory and others [27, 28]. In fact, for each cognitive domain, there is a large variety of measures, approximately 10~20 for each, including a large body of subtests and informal tests. As such, different composite cognitive batteries [11, 13, 29] contained considerably varied measures, and so did the driving performance assessment. Typically, driving outcome was a dichotomous variable developed from aggregating the results of multiple driving ability measures. As a result, variability and inconsistencies have persisted regarding the relationship between scores on the individual neuropsychological tests, tests of a single cognitive domain, or the composite batteries and driving performance. In this study, we chose standard neuropsychological tests of global cognitive function, executive function and attention, visuospatial ability, and episodic memory, all of which are used extensively worldwide.

Notably, given that individuals with different dementia etiology or severity may have different difficulties in executing driving maneuvers [30], it is difficult to find a general pattern of cognitive impairment that correlates with driving ability. This may partly explain why there is still no valid, reliable, and widely accepted composite cognitive battery available for the assessment of driving fitness for all senior drivers with cognitive impairment. Therefore, to determine the one-to-one relationship between the specific driving maneuvers and the specific neuropsychological tests may be a key to the current dilemma. There have been a few studies [31, 32] reporting the correlations between certain neuropsychological tests and certain driving maneuvers. Typically, they have not investigated all the domains of driving behaviors, but focused only on certain situations, such as rear-end collision avoidance [31], and route-following and landmark/sign identification [32]. In this study, to obtain a reliable panoramic view of participants' driving performance, we employed driving simulator tests that detect all domains of driving, including Reaction, Starting and stopping, Signaling, Safety check, Positioning, Speeding, and Overall (wayfinding and accidents). We further explored the correlations between each specific driving maneuver and each standard neuropsychological test.

Thus, the first goal of this study was to investigate which domains of driving maneuvers are impaired in senior drivers with cognitive impairment, by conducting driving simulator tests. Thereafter, we aimed to identify which specific neuropsychological test can significantly reflect

a certain driving error. Additionally, we were interested in identifying the difference of cognitive functions and demographic characteristics of senior drivers who continue driving, vis-a-vis those who retired from driving. We hypothesized that the current drivers have better cognitive functions than the retired drivers, but have difficulties in some domains of driving maneuvers, and that different neuropsychological factors serve to predict of different specific driving errors. In conclusion, we aimed to pave the way for more specific guidelines addressing the issue of assessment of driving ability among senior drivers with cognitive impairment in a clinical context.

#### **METHODS**

Ethical approval was granted by the Ethics Committee of Kyoto University Hospital (R1243). Oral and written informed consent was obtained from participants and their caregivers.

#### Participants:

Subjects who visited the outpatient neurology clinic in Kyoto University Hospital from July 2018 to December 2019 for cognitive complaints or cognitive concerns expressed by their family caregivers were investigated. The eligibility criteria were as follows: aged 60 years or more, having symptoms of cognitive decline objectively or subjectively, and having driving experience, including participants who had already returned their driving licenses and those with a valid driving license. Patients with Alzheimer's disease (AD) or mild cognitive impairment (MCI) were diagnosed by a neurologist, based on the National Institute on Aging-Alzheimer's Association workgroup (NIA-AA) diagnostic criteria, while subjective cognitive decline (SCD) was defined as self-experienced decline in cognitive functions, especially memory, without formal deficits in neuropsychological testing [33]. Participants with comorbidities that might influence driving performance (e.g. history of stroke, Parkinson's disease) and who seldom drove, were excluded from this study.

#### Procedure:

The participants or their caregivers were asked to complete a questionnaire, which included questions on both the demographic and driving-related characteristics of the participants since the onset of their cognitive problems. All the participants were administered neuropsychological tests by a professional clinical psychologist. However, some senior participants refused to take certain neuropsychological tests due to fatigue; therefore, there are some corresponding missing values. None of the retired drivers in the sample expressed a desire to resume driving or willingness to undergo the driving simulator tests. Of the current drivers, 21 participated in the driving simulator

tests. All them completed reaction tests (both simple and complex), but five of them failed to complete the driving test because of simulator sickness.

#### Measures:

#### Neuropsychological tests

The mini-mental state examination (MMSE) is a brief clinical test used for screening dementia patients, with scores ranging from 0 to 30, with lower scores indicating greater cognitive impairment. Although the MMSE alone was perceived to be insufficient for use as an indicator of driving outcomes [10, 28, 34], many studies have provided evidence that it should be used to make the decision to refer senior drivers for a driving evaluation or report them to the respective authorities [20, 35, 36]. The current study included it as a measure of global cognitive functioning and further investigated the correlation between the sub-scores of MMSE and driving parameters.

The trail making test (TMT) [37] is a simple pencil-and-paper task that includes two subtests. Administering the TMT-A requires participants to draw lines to consecutively interconnect 25 numbered circles distributed randomly on a sheet of paper. The TMT-B requires participants to interconnect consecutive numbers and hiragana (a Japanese syllabary) characters, alternating between the two sequences (i.e., number-hiragana-number-hiragana...). Both the subtests measure visual scanning, motor processing speed and attention. The TMT-B additionally tests for divided attention and cognitive flexibility, which play an especially important part in adapting to everchanging traffic situations. The standard administration allows for a maximum time limit of 100 seconds for TMT-A and 300 seconds for TMT-B. However, Russell [38] observed that more than one-third of the patients with neurological disorders exceeded the time limits. Thus, there was no time limit in the study; accordingly, we used the maximum time score obtained from our sample as the score for the participants who failed to complete it. The TMT has been previously reported to be a useful assessment to predict fitness for driving [20, 27]. Moreover, some investigators have proposed the different application strategies of TMT-A and TMT-B [21, 39].

The block design test (BDT) is a subtest of the Wechsler Adult Intelligence Scale (WAIS). It assesses an individual's ability to understand complex visual information. The participants were required to rearrange blocks with various color patterns on different sides to match them to a given pattern. The scores range from 0 to 66 based on accuracy and speed, a higher score indicating a higher level of spatial visualization ability and motor skill. A previous study [4] found that visuospatial construction assessed with the BDT predicted performance for both safety errors and traffic sign identification.

The CDT [40] is a widely used cognitive screening instrument. The participants were instructed to draw the face of a clock and put the numbers of the dial on it, with a long arm and a short arm depicting the time of 10 minutes past 11. To draw the clock, participants must be able to follow directions and visualize the proper orientation of an object. In contrast to the MMSE, this test is unaffected by the participants' level of education [41, 42]. The 10-point Rouleau's scoring system [43] was used in the study, a higher score indicating better cognitive function. CDT has been included in many national medical guidelines for assessing a patient's fitness to drive [13].

The Alzheimer's disease assessment scale–cognitive subscale (ADAS-Cog) [44] assesses the severity of cognitive dysfunction in Alzheimer's disease. It includes 11 tasks, and the scores range from 0 to 70, with higher scores indicating worse cognitive impairment. In most countries, revocation of driving license of senior drivers is based not solely on the diagnosis of dementia, but on its severity [13], which can be evaluated by this test.

Logical memory (LM) I & II [45] are subtests of the revised Wechsler Memory Scale (WMS-R) [46]. It is an episodic memory measure of immediate recall and 30-min delayed recall of two stories A and B. Given that the seniors cannot tolerate prolonged testing, only episode A has been employed in the study. The scores range from 0 to 25 for both LM I and II, a higher score indicating better episodic memory. Episodic memory impairment, one of the earliest and most representative symptoms of AD, may impede driving ability at the strategic level, such as in wayfinding.

#### **Driving Simulator Tests**

For driving simulator tests, we used Honda Safety Navi (Honda Motor Co., Tokyo, Japan; Supplementary Figure 1), a simulator consisting of a steering wheel, a blinker lever, an accelerator pedal, a brake pedal, and three 21.5-inch computer displays that afford the participants a view of the road from the front and sides. However, it is not equipped with a gearbox and clutch, because of the pervasive use of automatic transmission cars in Japan. The speedometer, side mirrors and the rear-view mirror are shown on the screens, and the simulated driving sound is played to mimic a real-world scenario. For the evaluation of driving ability, a special software, the Honda driving ability evaluation supportive software (Honda Motor Co., Tokyo, Japan), was installed. With this software, we administered two types of tests: two reaction tests (simple and complex) and one driving test to reflect real-world driving.

The reaction tests were used to measure a participant's reaction time to stimuli while driving and consisted of two subtests: simple and complex reaction tests. The reaction tests are

set on a one-way road in a rural scenario. The researcher elaborately explained the details of each subtest, so that the participants had a clear idea. The participants were required to follow a car in front and rapidly operate the accelerator and brake pedals according to the color of the rear lights of the car in front (details in Supplementary Table 1). Before the formal test, there were five and six practice stimuli for the simple and complex reaction tests, respectively. The mean of reaction time (RT) and deviation of reaction time (dRT) were automatically recorded both for the simple (35 stimuli) and complex (50 stimuli) reaction tests. The number of erroneous reactions (eR) in the complex reaction test was also recorded. The software then compared each evaluation item to that of the existing data of generally healthy people of the same age and reported results with a 5-level evaluation ranking (Poor, Below Average, Average, Good, and Excellent) for each participant.

The driving test was set in an urban environment during daytime, to measure a participant's driving errors in 6 domains: Starting and stopping, Signaling, Safety check, Positioning, Speeding, and Overall. The researcher explained the overall setting of the test and told the participants that they needed to complete 12 tasks and reach the given destination by correctly following the audio navigation (turning left/right, changing lanes, etc.) and signboards. The 12 tasks and corresponding traffic scenarios are described in Supplementary Table 1. The participants were instructed to drive as usual and obey traffic rules (traffic lights and posted speed limitations, etc.). Before the formal test, participants were allowed a practice drive to help them get a general idea of the test and familiarize themselves with operating the simulator. The simulator software automatically recorded and counted 18 objective parameters of driving errors and categorized them into the 6 domains of driving maneuvers (details in Table 4). Similarly, the software compared the result of each domain to that of generally healthy people of the same age and reported evaluation rankings that were displayed in a radar chart (Supplementary Figure 2) to show the participants' driving performance integrally.

The driving simulator tests lasted approximately 30 minutes, each test followed by a short break. Participants were instructed to report at any time if they felt unwell (dizziness or nausea), and could abort the test. After the test, a printed report of their driving performance was provided to them upon request (Supplementary Figure 2).

#### Statistical analyses:

Analyses were performed using IBM® SPSS® Statistics version 23. The chi-square test or Fisher exact test was used to compare all the demographic (except "age") and driving-related characteristics according to the status of the driving licenses. The independent samples t-test or

Mann-Whitney U test was conducted to compare the scores of neuropsychological tests of current/retired groups. Analysis of covariance (ANCOVA) was conducted to adjust for age and gender, as the two groups differed significantly in these variables. In addition, the Cohen's d was computed to indicate the effect size. Negligible effects (d < 0.20), small effects (0.20 < d < 0.50), medium effects (0.50 < d < 0.80) and large effects (d > 0.80) were distinguished. ANOVA tests and Post Hoc tests were used to compare the driving performance of participants with different diagnoses. The Pearson correlation coefficient or the Spearman's  $\rho$  was used to determine the one-to-one relationship between the specific driving parameters and the scores of specific neuropsychological tests. Regrettably, the number of participants who could ultimately be studied using the driving simulator was too small to apply multivariate regression analysis. All statistical significance tests were two-sided, and an  $\alpha$  level of 0.05 was considered statistically significant. It is to be noted that many statistical comparisons were made in this single study simultaneously; hence, it is necessary to consider the fallacy of multiple comparisons when interpreting our results.

## **RESULTS**

#### Demographic and driving-related characteristics

Of the 52 participants investigated, five were excluded: one for being under 60, two because of a lack of actual driving experience, and two with comorbidities that might influence driving performance. Eventually, 47 participants were included in the study, ranging in age from 61 to 92, of whom 27 (57.4%) were male. 24 participants had voluntarily returned their driving licenses, whereas 23 still held a valid driving license at the time of the study. The number of participants diagnosed with SCD, MCI, and AD was 5, 19, and 23, respectively.

Table 1 presents the demographic and driving-related characteristics of retired and current drivers. Apart from self-reported traffic accidents, significant differences were found between the two groups in age, gender, diagnosis, driving patterns, driving frequency, and duration of driving experience. The current drivers were statistically younger than the retired ones (t = 3.105 p = 0.003), and a higher proportion of current drivers was male; the opposite pattern held true for retired drivers ( $\chi^2 = 4.996$ , p = 0.039). Most current drivers had a diagnosis of MCI or SDC, whereas the most frequent diagnosis among the retired drivers was AD. The majority (87.5%) of retired drivers thought that they were unable to drive safely anymore, but three of them had a relatively optimistic assessment of their driving competence and were convinced they could drive safely in certain conditions, such as during the daytime, in favorable weather, around the neighborhood, etc. Of the current drivers, more than half thought they could drive safely unconditionally, whereas only some voluntarily imposed restrictions on their driving behaviors.

Four retired drivers and eight current drivers reported having caused traffic accidents since the onset of cognitive problems, and the accidents were almost all run-off-road collisions without injury.

## Neuropsychological tests

As displayed in Table 2, the differences between the retired and current drivers were statistically significant for the scores of all neuropsychological tests, even after the adjustment for gender. However, the scores of ADAS and WMS-LM II were found to be statistically not different between the two groups after adjustment for age. The overwhelming majority of current drivers (82.6%) had an MMSE score higher than 23, with a minimum of 19 and maximum of 27. The MMSE scores of retired drivers were in a larger range, with a minimum of 2 and maximum of 27.

#### Driving performance

Twenty-one current drivers participated in the reaction tests, aged between 61 and 90 (mean [SD], 76.38 [7.11]), 15 of whom were male. As displayed in Fig.1, more than half of the 21 participants had a below average or poor ranking on the evaluation items both of the simple and complex reaction tests. Table 3 shows the results of the reaction tests of the participants with different diagnoses. There were 4, 14, and 3 participants in the SCD, MCI, and AD groups respectively and the age and gender of the three groups were not significantly different. According to the results of ANOVA, the sim-RT (p < 0.001), the sim-dRT (p = 0.001), the com-dRT (p = 0.001), and the eR (p = 0.027) were significantly related to the diagnosis. According to the results of Post Hoc tests, the mean of sim-RT and sim-dRT of the AD group was significantly larger than that of the SCD and MCI groups, but no significant difference was found between the latter two groups. The mean of com-dRT of the 3 groups was significantly different, that of the SCD group being the smallest. The eR of the SCD group was significantly less often than that of the MCI group, but no significant difference was found in other comparisons.

Sixteen current drivers completed the driving test, aged between 64 and 90 (mean [SD], 77.75 [6.77]), 14 of whom were male. Table 4 shows the median of the frequency of 18 driving errors and the evaluation ranking of the 6 domains of driving maneuvers of the 16 participants. Among all the 6 domains of driving maneuvers, Safety check, Positioning, and Speeding of all the 16 participants were evaluated to be above the average level. However, there were 4, 3, and 8 participants with a ranking below the average level on Starting and stopping, Signaling, and Overall, respectively. Pairwise comparisons yielded significant differences between the SCD and MCI groups for "overlooking dangerous vehicles ahead" (p = 0.039) and between the AD and

MCI groups for "centerline crossings" (p = 0.008), with no significant differences between the three groups for all other driving errors, which may at least partly be due to the small sample size, especially in the SCD (2 participants) and AD groups (3 participants).

#### Correlative Analyses

As shown in Table 5, many neuropsychological factors were found to have significantly moderate to high correlations with the parameters of different domains of driving performance. In general, the parameters of the reaction tests were found to be associated with the scores of MMSE, TMT-A, and TMT-B. With respect to the parameters of driving errors, Spearman's  $\rho$  revealed that "sudden braking" had quite a high correlation coefficient with the scores of MMSE ( $\rho$  = -0.707, p< 0.01), BDT ( $\rho$  = -0.560, p < 0.05) and ADAS ( $\rho$  = 0.758, p < 0.01); "Forgetting to use turn signals" was associated with the TMT-B score ( $\rho$  = 0.608, p < 0.05); "Centerline crossings" was moderately correlated with the scores of MMSE ( $\rho$  = -0.582, p < 0.05) and ADAS ( $\rho$  = 0.538, p < 0.05); "Going the wrong way" was moderately correlated with the score of CDT ( $\rho$  = -0.624, p < 0.01). All specific data are listed in Table 5.

#### **DISCUSSION**

Our study found that many senior drivers regulate their driving patterns in a proactive way upon the onset of cognitive problems. In this study population, a little over 50 % of the participants had stopped driving. According to the results of a survey[47] conducted by the National Police Agency (Japan), the top three reasons why senior drivers stopped driving were frailty, families' recommendation, and having read the news of traffic accidents caused by senior divers. Further, a proportion of current drivers had voluntarily restricted their driving behaviors, such as driving only in familiar residential areas and for short distances, driving during the hours of low traffic, etc. The phenomenon of self-imposed restriction on driving behavior was also reported by Kurzthaler et al. [48], who interpreted it as a compensatory strategy. In our sample, younger people, males, and those with longer driving experience were more likely to be current drivers, in the light of demographic and driving-related characteristics. A similar pattern emerged in several previous studies [49-51]. As expected, current drivers performed better in neuropsychological testing than retired ones, which is in agreement with the findings of Vaughan et al. [52].

With respect to driving performance, the participants showed driving errors in the 4 domains in general: Reaction, Starting and Stopping, Signaling, and Overall (wayfinding and accidents), which was detected by the driving simulator tests. Approximately half of the 21

participants displayed slow response to sudden events while driving (see sim-RT and com-RT in Fig. 1). More precisely, the responses of AD patients were slower than the SCD and MCI groups in simple reaction tests; but in the complex situation, there was no difference among the RT of the three groups (Table 3), which is in line with a recent study [53] reporting that drivers with AD showed significantly greater RT than control drivers in simulated driving. In addition, more than half the participants lacked stability of driving operations (see sim-dRT and com-dRT in Fig. 1). Pairwise comparisons indicated that the operation stability of AD patients was significantly the worst in the simple reaction test (see sim-dRT in Table 3). However, in more complex situations, no significant difference was found between the operation stability of the AD and MCI groups, with participants with SCD showing the best operation stability. Moreover, based on the eR results, participants with SCD had misjudgments or incorrect manipulations in complex situations, less often than the MCI group (Table 3).

Based on the results of the 16 subjects who completed the driving test, the most frequent driving errors included traffic lights or stop sign violations, inappropriate use of the indicator, stepping on the accelerator or brakes suddenly, stopping inappropriately, and causing crashes or collisions. Although most of them did not commit speeding violations, the crawling problem might have been hidden, because it was observed that some participants drove at excessively slow speeds in the simulated driving. However, the simulator software used in our study did not measure the average speed of the participants. Economou et al. [53] also pointed out the crawling problem of senior drivers, and interpreted it as a compensatory behavior to cope with the complex simulated traffic. Piersma et al. [11] found that patients with AD drove significantly more slowly than healthy participants, when they were in a hurry or at the intersections. In contrast, Yamin et al. [34] concluded that drivers with AD exceeded the posted speed limit significantly more often in comparison to the controls. These discrepant results may be due to the difficulty of driving tests used in different studies varying a lot, which may have an effect on the speed control. In terms of Positioning and Safety check, all the 16 participants received a ranking equal to or greater than the average (Table 4). However, "Safety check" might be worse than the current result, because the driving error, "inappropriate side safety check," was not involved in our study.

Our findings suggest that certain individual neuropsychological tests may be good predictors of certain driving maneuvers. Many of the existing studies have elucidated the relationships between neuropsychological tests and integral driving outcome, to predict driving fitness. In contrast, we divided the driving abilities into several domains, and then tried to find the appropriate neuropsychological test which significantly reflects a certain domain of driving

abilities. In this respect, the present study is one of the few[54, 55] to examine the correlation between each specific driving behavior and each single neuropsychological test.

Our study provides evidence that the reactivity in driving could be predicted by cognitive tests that contain or emphasize the attention function, such as MMSE, TMT-A, and TMT-B (Table 5). A prior study[55] has drawn a similar conclusion that responses to road hazards were significantly predicted solely by attention in a sample with cognitively healthy senior drivers. Both the scores of MMSE and the subtest of "attention and calculation" exhibited strong negative correlations with the parameters of Reaction, indicating that MMSE would be useful to assess senior drivers' reactivity, and the subtest, "attention and calculation," may be a good alternative, demanding less time. Similarly, the scores of "orientation to time" and "recall" showed significant correlations with dRT or eR, which suggests these as simple and easy ways to evaluate the stability and adaptability of driving operations. In addition, prolongation in TMT-A and TMT-B scores were also proved to be predictors of reacting tardily and unstably. Interestingly, the TMT-B score was also predictive of the operation of giving turn signals (see FUTS in Table 5), which is important for avoiding accidents when making turns or changing lanes. Senior drivers with worse performance in TMT-B test were more likely to fail to indicate turn signals in time or to forget to giving turn signals at all.

The importance of the visuospatial function in explaining operational driving mistakes has been emphasized in many studies. A meta-analysis [27] reported that visuospatial function emerged as one of the significant predictors of driving performance, with relatively high effect size. Yamin et al. [34] proved the association between visual processing and number of crashes, illustrating visual processing being an initial step in crash avoidance. Yi et al. [23] found that impairment in visual attention contributed to an increased risk of crashes. Ergun et al. [31] reported that Rey-Osterreith complex figure test and other visual tests were predictive of premature stopping and abrupt slowing. Similarly, our study found that the frequent and sudden slamming of the brakes was associated with a decrease in visuospatial ability, as detected by BDT (see SB in Table 5). Besides, we found that both the measures of global cognitive functioning (MMSE and ADAS) also serve to predict the driving maneuvers of sudden braking.

Prior studies have provided evidence that the global cognitive status is correlated with the driving behavior of lane control both in on-road driving test[56] and simulated driving tests [11, 34]. In our study, this correlation was further confirmed (see CC in Table 5). Specifically, both the measures of global cognitive functioning used in our study, MMSE and ADAS, revealed similar validity in predicting the driving maneuvers of lane control.

The CDT is included in many studies [57-59] that aimed to identify the best predictive set of tests for pass/fail driving outcome. Nevertheless, there is little evidence linking the CDT to specific driving behaviors. In the study, way-finding, a driving behavior at the strategic level, was found to be predicted by the CDT score (see GWW in Table 5). Although the CDT is included in many national medical guidelines to assess the driving ability of senior drivers, one study [60] demonstrated the limited utility of CDT as a single screening measure in predicting driving performance. Our study confirmed the usefulness of CDT in assessing some specific driving behaviors, especially those at the strategic level.

Unexpectedly, the subtest of MMSE "orientation to time" had a significantly positive correlation with the behavior of driving over the speed limit (see R-DOSL, OS-SL in Table 5). It is plausible that participants with greater temporal orientation skill may have excessive confidence in their driving, resulting in their driving much faster. In addition, it is to be noted that in our sample, no parameter of driving performance was found to be significantly correlated with memory detected by LM. This is compatible with the results of a previous study [48], which found that memory itself did not significantly contribute to the prediction of driving behaviors. Likewise, after adjusting for age, we found that there was no significant difference between the delayed recall of current drivers and retired drivers. In Japan, memory tests (cued recall tests) are used in the CISTSD mentioned in the introduction. This finding questions the validity of employing memory tests to screen the driving ability of senior drivers.

The major limitation of this study is the small sample size that may affect the reliability of our findings. It is important to be cautious when interpreting our results. Consequently, the small sample size limited the statistical analysis. Just 16 participants completing the driving test is insufficient to develop a sophisticated statistical model. The limited sample size was partly due to simulator sickness, which is a common problem reported by many studies. Various countermeasures were adopted to mitigate this effect, including individualizing the accommodation phase [34] and simplifying the simulator scenarios [11, 57]. A further limitation is that the present study used only parameters put out by the software automatically, to assess driving performance. It may be helpful to incorporate an observational assessment [57] in addition to the objective parameters, for a more comprehensive evaluation. Further, the missing values of the neuropsychological tests comprise a shortcoming of the study. In future, a larger sample is warranted to confirm the validity of our findings.

Our results concerning the driving errors of senior drivers with cognitive impairment constitute a useful addition to the literature. We have also updated the current literature on this topic by linking classical office-based neuropsychological tests to specific driving maneuvers. In

sum, the unique neuropsychological domain of attention can reflect the reaction in driving; the visuospatial function serves the prediction of the braking operation, the global cognitive function is good at predicting the driving maneuver of positioning, and CDT is correlated with strategic difficulties. To protect the driving privilege of senior drivers and, at the same time, ensure that traffic accidents attributable to them do not increase, an integrant neuropsychological tool that can accurately reflect individuals' driving abilities needs to be developed. This newly gained information provides assistance to the design of assessment batteries specifically tailored to different etiologies. In addition, we can optimize the battery by adjusting it flexibly, depending on personalized driving problems reported by caregivers in clinical practice.

#### **ACKNOWLEDGMENTS**

This study was supported by two research grants from the Takata Foundation (Project No. 203170600011 and 203190600065). The funding sources did not have any specific involvement in this study. We would like to thank Ms. Momoyo Shimosaka, Dr. Masakazu Miyamoto, Ms. Atsuko Kokuryu, and Ms. Noriko Uchida, for their administrative support of collecting the data used in the study.

### **CONFLICT OF INTEREST**

The authors have no conflict of interest to report.

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# **Datasets**

Table 1

Demographic and driving-related characteristics of the participants

Variables		Retired drivers (n)	Current drivers (n)	$\chi^2/t$	p	Cramer's V
Age, y	Total Mean (SD)	24 82.04(5.513)	23 76.39(6.913)	3.105 <sup>a</sup>	0.003	-
Gender	Female Male	14 10	6 17	4.996 <sup>b</sup>	0.039	0.326*
Diagnosis	SCD MCI AD	0 5 19	5 14 4	19.181°	<0.001	0.636**
Driving patterns	unable to drive restricted unconditionally	21 3 0	0 8 15	38.269 <sup>b</sup>	<0.001	0.902**
Traffic accidents, n	0 1~4	18 4	15 8	1.585 <sup>b</sup>	0.314	0.188
Driving frequency	never sometimes everyday	23 1 0	1 10 12	39.527 <sup>b</sup>	<0.001	0.917**
Duration of driving experience, y	3~20 21~50 51~70	4 13 3	1 10 12	7.237°	0.020	0.415*

<sup>\*</sup>p < 0.05, \*\*p < 0.001, a. Independent Samples t Test., b. Pearson Chi-Square, c. Fisher's Exact Test; SCD: subjective cognitive decline; MCI: mild cognitive impairment; AD: Alzheimer's disease

Table 2

The scores of the neuropsychological tests of the participants

Variables		Retired	Current		cohen's		
		drivers	drivers	unadjusted	age adjusted	gender adjusted	d
MMSE <sup>a</sup>	n Mean (SD)	24 18.67 (6.26)	23 26.13(2.89)	< 0.001	<0.001	<0.001	1.520
TMT-A <sup>b</sup>	$n \\ Median \left(Q_L,Q_U\right)$	23 94 (70, 295)	21 57 (46.5, 64)	< 0.001	0.002	< 0.001	1.208
TMT-B <sup>b</sup>	$n \\ Median (Q_L, Q_U)$	23 312 (312, 312)	21 154 (95.5, 274)	< 0.001	0.002	< 0.001	1.289
$\mathbf{BDT}^{\mathrm{b}}$	$\begin{array}{l} n \\ Median \left(Q_L,Q_U\right) \end{array}$	12 19.17 (5.80)	18 29.40 (7.90)	0.001	0.011	0.001	1.226
ADAS- Cog <sup>a</sup>	n Mean (SD)	13 13.7 (4.97)	21 10.18 (3.95)	0.03	0.076	0.021	0.800
LM I <sup>b</sup>	$n \\ Median (Q_L, Q_U)$	18 1 (0, 3)	21 4 (3, 7.5)	< 0.001	0.014	< 0.001	1.213
<b>LM II</b> <sup>b</sup>	$\begin{array}{l} n \\ Median \left(Q_L,Q_U\right) \end{array}$	18 0 (0, 0)	21 1 (0.5, 3.5)	< 0.001	0.114	0.015	0.890
<b>CDT</b> <sup>b</sup>	$n\\ Median\left(Q_L,Q_U\right)$	22 8 (3.5, 10)	22 10 (9, 10)	0.002	0.007	0.002	1.079

<sup>&</sup>lt;sup>a</sup>. Independent Samples *t* Test, <sup>b</sup>. Mann-Whitney *U* Test. MMSE: mini-mental state examination; TMT: trail making test; BDT: block design test; ADAS-Cog: Alzheimer's disease assessment scale–cognitive subscale; LM: Logical memory; CDT: clock drawing test.

Table 3

The results of the reaction tests of the participants with SCD, MCI, and AD

Diagnosis	sim-RT (s)	sim-dRT (s)	com-RT (s)	com-dRT (s)	eR (n)
SCD (n=4)	0.515 (0.031)	0.149 (0.081)	0.976 (0.102)	0.128 (0.025)	1.50 (1.732)
MCI (n=14)	0.477 (0.085)	0.161 (0.081)	0.970 (0.192)	0.225 (0.053)	12.43 (6.161)
AD (n=3)	0.829 (0.092)	0.380 (0.042)	1.137 (0.287)	0.301 (0.048)	15.33 (14.189)
$\boldsymbol{\mathit{F}}$	24.315	10.477	0.943	11.227	4.422
p	< 0.001	0.001	0.408	0.001	0.027
1- $\beta$ (post hoc)	0.9998	0.9276	-	0.9453	0.4998
Pairwise	SCD <ad**< th=""><th>SCD<ad*< th=""><th>-</th><th>SCD<mci*< th=""><th>SCD<mci*< th=""></mci*<></th></mci*<></th></ad*<></th></ad**<>	SCD <ad*< th=""><th>-</th><th>SCD<mci*< th=""><th>SCD<mci*< th=""></mci*<></th></mci*<></th></ad*<>	-	SCD <mci*< th=""><th>SCD<mci*< th=""></mci*<></th></mci*<>	SCD <mci*< th=""></mci*<>
comparison <sup>a</sup>	MCI <ad**< th=""><th>MCI<ad*< th=""><th>-</th><th>SCD<ad*< th=""><th></th></ad*<></th></ad*<></th></ad**<>	MCI <ad*< th=""><th>-</th><th>SCD<ad*< th=""><th></th></ad*<></th></ad*<>	-	SCD <ad*< th=""><th></th></ad*<>	

 $<sup>^*</sup>p < 0.05$ .  $^{**}p < 0.001$ .  $^a$ . Bonferroni-adjusted significance tests. SCD: subjective cognitive decline; MCI: mild cognitive impairment; AD: Alzheimer's disease; sim-RT: the mean of reaction time of the simple reaction test; sim-dRT: the deviation of reaction time of the simple reaction test; com-dRT: the deviation of reaction time of the complex reaction test; eR: the number of erroneous reactions in the complex reaction test

Table 4

The results of the driving test of the 16 participants

		Frequency	Evaluatio	n Ranking
	Variables	Median (Q <sub>L</sub> , Q <sub>U</sub> )	< average (person)	≥ average (person)
Starting & Stopping	sudden starting traffic lights or stop sign violations sudden braking	1.5 (0, 4) 2 (1, 2.75) 0 (0, 0.75)	4	12
Signaling	forgetting to use turn signals using turn signals incorrectly	2 (1, 2.5) 0.5 (0, 1)	3	13
Safety check	inappropriate rear safety check overlooking dangerous vehicles ahead overlooking signboards or traffic lights	0 (0, 0) 0 (0, 1) 1 (0, 1)	0	16
Positioning	stopping inappropriately out of lane inappropriate inter-vehicle distance and lateral spacing centerline crossings	1.5 (1, 2) 0 (0, 0) 0 (0, 0) 0 (0, 0)	0	16
Speeding	range of driving over the speed limit (%) overspeed - the speed limit (km/h) intersection speed(km/h)	0 (0, 0.4) 0 (0, 5.30) 10.31(8.11, 13.15)	0	16
Overall	going the wrong way near-miss accidents crashes and collisions	0 (0, 0) 0 (0, 1) 0.5 (0, 1)	8	8

Table 5

Correlative analyses of driving parameters and the scores of neuropsychological tests

Driving P	Performance			MMSE				Other No	europsych	nological Tes	ts
Domains	Parameters	Total score	Orientation to time	Orientation to place	Attention & Calculation	Recall	TMT-A	ТМТ-В	BDT	ADAS-Cog	CDT
	sim-RT (s)	-0.685*	-0.185	0.052	-0.724**	-0.479	0.492	0.694**	-0.487	0.460	-0.293
	sim-dRT (s)	-0.685*	-0.228	0.122	-0.693**	-0.589*	$0.531^{*}$	$0.595^{*}$	-0.229	0.433	-0.389
Reaction	com-RT (s)	-0.368	-0.256	0.191	-0.368	0.065	$0.562^{*}$	$0.634^{*}$	-0.369	0.455	-0.158
	com-dRT (s)	-0.753**	-0.584*	0.017	-0.625**	-0.485	0.370	$0.814^{**}$	-0.200	0.493	-0.283
	eR (n)	-0.430	-0.685**	< 0.001	-0.319	-0.391	-0.106	0.427	-0.203	0.392	-0.090
Stopping	SB (n)	-0.707**	-0.461	-0.505*	-0.426	-0.541*	0.023	0.312	-0.560*	0.758**	-0.244
Signaling	FUTS (n)	-0.255	-0.460	0.089	-0.250	0.045	0.452	$0.608^{*}$	-0.159	-0.002	0.185
Safety	IRSC(n)	-0.425	-0.444	-0.537*	-0.376	-0.237	-0.062	0.343	-0.208	0.310	-0.153
check	OSTL(n)	-0.105	-0.511*	-0.076	0.006	-0.045	0.296	0.247	0.232	0.052	-0.044
Positioning	CC (n)	-0.582*	-0.607*	-0.332	-0.550*	-0.447	0.163	0.503	-0.423	0.538*	-0.392
a 1:	R-DOSL (%)	0.174	0.625**	0.359	-0.182	0.085	-0.237	-0.260	0.232	-0.215	-0.470
Speeding	OS-SL (km/h)	0.182	$0.586^{*}$	0.359	-0.154	0.090	-0.262	-0.260	0.235	-0.194	-0.444
Overall	GWW (n)	-0.189	-0.055	0.181	-0.391	-0.278	0.310	0.343	-0.381	0.434	-0.624**

 $^*p < 0.05$ .  $^{**p} < 0.01$ . Sim-RT: the mean of reaction time of simple reaction test; sim-dRT: the deviation of reaction time of simple reaction test; com-RT: the mean of reaction time of complex reaction test; com-dRT: the deviation of reaction time of complex reaction test; eR: the number of erroneous reactions of complex reaction test; SB: sudden braking; FUTS: forgetting to use turn signals; IRSC: inappropriate rear safety check; OSTL: overlooking signboards or traffic lights; CC: centerline crossings; R-DOSL: range of driving over the speed limit; OS-SL: overspeed - the speed limit; GWW: going the wrong way; MMSE: mini-mental state examination; TMT: trail making test; BDT: block design test; ADAS-Cog: Alzheimer's disease assessment scale-cognitive subscale; CDT: clock drawing test.

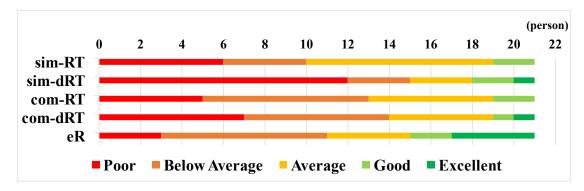
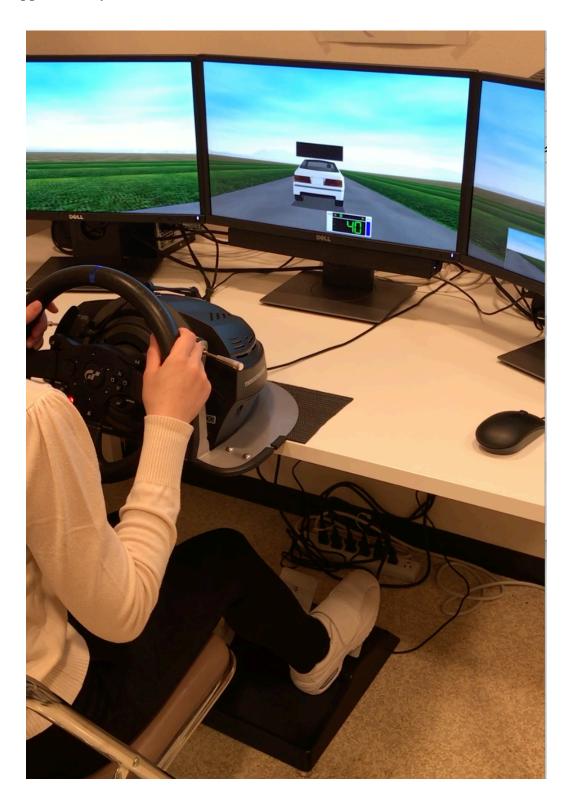


Figure. 1

# The evaluation ranking of the reaction tests of the 21 participants

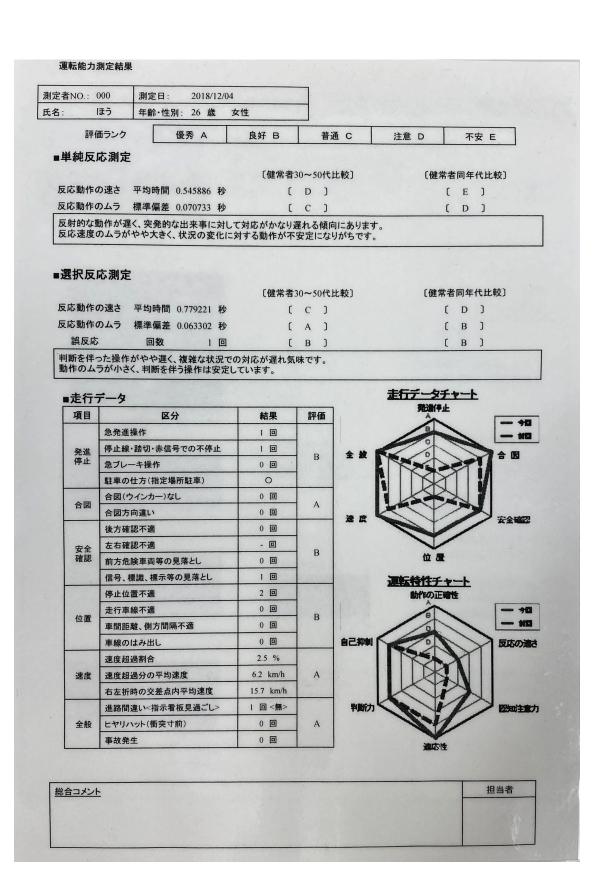
sim-RT: the mean of reaction time of the simple reaction test; sim-dRT: the deviation of reaction time of the simple reaction test; com-RT: the mean of reaction time of the complex reaction test; com-dRT: the deviation of reaction time of the complex reaction test; eR: the number of erroneous reactions in the complex reaction test

# **Supplementary Material**



Supplementary Figure 1. The driving simulator: Honda Safety Navi (Honda Motor Co., Tokyo,

Japan)



# Supplementary Table 1

# The driving simulator test overview

Тє	ests	Details						
Reaction Tests Complex reaction test		<ol> <li>Step on the accelerator pedal to start the car and increase to its maximum speed of 40 km/h and then retain it.</li> <li>Release the accelerator pedal as soon as the rear lights of the car ahead turn green, and then step on the pedal right away.</li> </ol>						
		<ol> <li>Step on the accelerator pedal to start the car and increase to its maximum speed of 40 km/h and then retain it.</li> <li>Release the accelerator pedal and step on the brake with your right foot once the rear lights of the car ahead turn red, and then step on the accelerator pedal right away.</li> <li>only release the accelerator pedal once the rear lights of the car ahead turn yellow, then step on the accelerator pedal to the maximum right away.</li> <li>Continue to step on the accelerator pedal to its maximum, once the rear lights of the car ahead turn navy.</li> </ol>						
		Traffic scenarios and tasks	Environment					
		1. Safety check before entering the road.	Straight road with good visibility from the parking lot; speed limit: 50 km/h					
		2. Changing lanes.	Branch road with good visibility in a busy street; speed limit: 50 km/h					
		3. Proper sequence when turning right and a bicycle abruptly crosses the intersection.	Intersection in a lane street; speed limit: 50 km/h					
		4. The priority of vehicles coming from the right when merging.	Merging area with good visibility in a coastal road; speed limit: 40 km/h					
		5. The oncoming traffic on the opposite lane when turning right.	Intersection in a residential street; speed limit: $40 \rightarrow 30 \text{km/h}$					
Drivir	ng Test	6. Moving at an intersection without traffic lights.	T-junction with poor visibility in narrow residential street without a roadivision; speed limit: 30 km/h					
	8	7. Predicting signal changes.	Intersection at a cross of a busy street and a residential street; speed limit: 30→50km/h					
		8. An unexpected motorcycle approaching from the oncoming vehicle when turning right.	Intersection in a busy street; speed limit: 50 km/h					
		9. Overtaking the work vehicle which is parked alongside the road.	Straight road with good visibility in a busy street; speed limit: 50→40km/h					
		10. Unexpected motorcycle approaching when turning left.	Intersection in a busy street; speed limit: 50 km/h					
		11. A child suddenly runs across the road when approaching the pedestrian crossing.	Straight road with good visibility in school area (road sign) without traffilights; speed limit: 40 km/h					
		12. Consecutive curve on a ramp.	Mountain road (an 8% uphill slope) with continuous curve; speed limit: 40 km/h					