

# 

**Citation:** Hashimoto Y, Honda T, Matsumura K, Nakao M, Soga K, Katano K, et al. (2015) Quantitative Evaluation of Human Cerebellum-Dependent Motor Learning through Prism Adaptation of Hand-Reaching Movement. PLoS ONE 10(3): e0119376. doi:10.1371/journal.pone.0119376

Academic Editor: Lutz Jaencke, University Zurich, SWITZERLAND

Received: September 30, 2014

Accepted: January 30, 2015

Published: March 18, 2015

**Copyright:** © 2015 Hashimoto et al. This is an open access article distributed under the terms of the <u>Creative Commons Attribution License</u>, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: All relevant data are within the paper and its Supporting Information files.

**Funding:** This work was supported by the Strategic Research for the Brain Sciences by the Ministry of Education, Culture Sports, Science and Technology of Japan and research fund from RIKEN. KATANO TOOL SOFTWARE provided support in the form of a salary for author KK, but did not have any additional role in the study design, data collection and analysis, decision to publish, or preparation of the manuscript. The specific roles of the authors are articulated in the 'author contributions' section. **RESEARCH ARTICLE** 

# Quantitative Evaluation of Human Cerebellum-Dependent Motor Learning through Prism Adaptation of Hand-Reaching Movement

Yuji Hashimoto<sup>1</sup>, Takeru Honda<sup>1,2,3</sup>\*, Ken Matsumura<sup>1</sup>, Makoto Nakao<sup>2</sup>, Kazumasa Soga<sup>1</sup>, Kazuhiko Katano<sup>4</sup>, Takanori Yokota<sup>1</sup>, Hidehiro Mizusawa<sup>1¤</sup>, Soichi Nagao<sup>1,2,5</sup>\*, Kinya Ishikawa<sup>1</sup>\*

1 Department of Neurology and Neurological Science, Graduate School, Tokyo Medical and Dental University, Bunkyo, Tokyo, Japan, 2 Laboratory for Motor Learning Control, RIKEN Brain Science Institute, Wako, Saitama, Japan, 3 Japan Society for the Promotion of Science Research Fellow, Chiyoda, Tokyo, Japan, 4 KATANO TOOL SOFTWARE, Ichikawa, Chiba, Japan, 5 Nozomi Higher Brain Function Laboratory, Nozomi Hospital, Ina-machi, Kita-adachi-gun, Saitama, Japan

¤ Current address: National Center Hospital, National Center of Neurology and Psychiatry, Kodaira, Tokyo, Japan

\* takeru@brain.riken.jp (TH); nagaos@brain.riken.jp (SN); pico.nuro@tmd.ac.jp (KI)

# Abstract

The cerebellum plays important roles in motor coordination and learning. However, motor learning has not been quantitatively evaluated clinically. It thus remains unclear how motor learning is influenced by cerebellar diseases or aging, and is related with incoordination. Here, we present a new application for testing human cerebellum-dependent motor learning using prism adaptation. In our paradigm, the participant wearing prism-equipped goggles touches their index finger to the target presented on a touchscreen in every trial. The whole test consisted of three consecutive sessions: (1) 50 trials with normal vision (BASELINE), (2) 100 trials wearing the prism that shifts the visual field 25° rightward (PRISM), and (3) 50 trials without the prism (REMOVAL). In healthy subjects, the prism-induced finger-touch error, i.e., the distance between touch and target positions, was decreased gradually by motor learning through repetition of trials. We found that such motor learning could be guantified using the "adaptability index (AI)", which was calculated by multiplying each probability of [acquisition in the last 10 trials of PRISM], [retention in the initial five trials of REMOVAL], and [extinction in the last 10 trials of REMOVAL]. The AI of cerebellar patients less than 70 years old (mean, 0.227; n = 62) was lower than that of age-matched healthy subjects (0.867, n = 21; p < 0.0001). While Al did not correlate with the magnitude of dysmetria in ataxic patients, it declined in parallel with disease progression, suggesting a close correlation between the impaired cerebellar motor leaning and the dysmetria. Furthermore, AI decreased with aging in the healthy subjects over 70 years old compared with that in the healthy subjects less than 70 years old. We suggest that our paradigm of prism adaptation may allow us to quantitatively assess cerebellar motor learning in both normal and diseased conditions.



**Competing Interests:** KK is an employee of KATANO TOOL SOFTWARE (KTS), and has been involved in developing the software for the equipment used in this study. There are no patents, products in development or marketed products to declare. This does not alter the authors' adherence to all the PLOS ONE policies on sharing data and materials.

#### Introduction

The cerebellum plays an important role in motor control [1]. Experimental studies using adaptation of ocular reflexes and eyeblink conditioning have consistently suggested that the cerebellum controls gain and timing of movements through learning [1–3]. Patients with cerebellar diseases exhibit signs of ataxia that include imbalance and incoordination [4, 5], as well as impaired motor learning, which has been revealed with the paradigms of eyeblink conditioning [6–8], adaptation of ocular reflexes [9, 10], and adaptation of forelimb movements [11–15]. However, these paradigms of motor learning have been used very rarely for the diagnosis and treatment of cerebellar diseases clinically due to technical or practical reasons. Additionally, the accuracy of motor learning assessment using these paradigms largely depends on the competence of each subject, or the time or number of trials needed for evaluation. Thus, it is still unknown how far motor learning and cerebellar ataxia with signs of such as incoordination or equilibrium disturbance correlate with each other.

In this study, we developed a new application of human prism adaptation by referring to the studies of Thach's group [13, 16, 17]. In our paradigm, simple hand-reaching movement is used instead of dart throwing, with the minimum number of cheap instruments that require a relatively small space. By using our paradigm, we were able to quantify motor learning within 30 min. We examined how motor learning capacity is degraded by cerebellar diseases or aging for more than 100 patients with cerebellar ataxia and healthy subjects. We propose that the adaptability index (*AI*), calculated on the basis of the data obtained using our paradigm, as a sensitive marker of human cerebellar motor learning for the practical diagnosis of cerebellar diseases.

#### **Materials and Methods**

The experimental procedure was approved by the Ethics Committee of Tokyo Medical and Dental University.

# Participants

After obtaining written informed consent, 38 healthy subjects (S1 Table) and 77 patients with degenerative cerebellar diseases (Table 1) were studied. We defined healthy subjects as those without any obvious neurological disorders and any disturbances in daily living. To determine aging effects on motor learning, we divided healthy subjects into two groups: 21 non-elderly healthy subjects less than 70 years old (HN; mean age, 49.0; range, 28–68) and 17 elderly ones  $\geq$  70 years old (HE; mean age, 78.4; range, 72–88). Likewise, the 77 patients with cerebellar diseases were divided at 70 years old: 62 non-elderly subjects (CN; mean age, 54.7; range, 29–69) and 15 elderly ones (CE; mean age, 74.8; range, 70–83). Among the 77 patients with cerebellar diseases, 44 had spinocerebellar ataxia (SCA) as confirmed by genetic testing [18–20], and 11 had sporadic cortical cerebellar atrophy (CCA) [21, 22]. The remaining 22 patients had multiple system atrophy (MSA) [23], in which three MSA-P and 15 MSA-C patients had clear signs of cerebellar ataxia while the remaining four MSA patients lacked them. Here, we defined these four patients as "pure parkinsonian MSA patients" (Table 1).

The CN group was further classified into the diseases predominantly affecting the cerebellar cortex (CBL group) [SCA6, SCA31, and CCA; n = 24], and the ones that were accompanied by extra-cerebellar degenerations (CBL+ group) [SCA2, Machado-Joseph disease (MJD), SCA8, SCA36, DRPLA, MSA-C and MSA-P; n = 34] [24–29]. The ataxia of all the patients was rated using the Scale for the Assessment and Rating of Ataxia (SARA) [30], and by the 9-Hole Peg Test (9HPT) using a Rolyan 9-hole peg test apparatus and plastic one-piece model. Disease onset age was defined as the age when the patients first noticed the signs of cerebellar ataxia.

#### Table 1. Characteristics of patients with cerebellar diseases.

PLOS

| Non-elderly cerebellar ataxia patients (CN) |                                     |           |                                |      |               |       |      |                                     |           |                                |      |               |       |
|---|-------------------------------------|-----------|--------------------------------|------|---------------|-------|------|-------------------------------------|-----------|--------------------------------|------|---------------|-------|
| ID  | Age (year) / Gender /<br>Handedness | Diagnosis | Disease<br>duration<br>(Month) | SARA | 9HPT<br>(sec) | AI    | ID   | Age (year) / Gender /<br>Handedness | Diagnosis | Disease<br>duration<br>(Month) | SARA | 9HPT<br>(sec) | AI    |
| CN1   | 39 / M / R                          | SCA6      | 114                            | 10   | 26.65         | 0.360 | CN32 | 45 / M / R                          | MJD       | 85                             | 6    | 28.13         | 0.420 |
| CN2   | 62 / F / R                          | SCA6      | 147                            | 14   | 30.25         | 0.320 | CN33 | 46 / M / L                          | MJD       | 163                            | 7    | 29.85         | 0.640 |
| CN3   | 62 / M / R                          | SCA6      | 142                            | 14   | 39.16         | 0.000 | CN34 | 46 / F / R                          | MJD       | 36                             | 9    | 24.28         | 0.480 |
| CN4   | 63 / M / R                          | SCA6      | 153                            | 26   | 140.82        | 0.012 | CN35 | 48 / M / R                          | MJD       | 90                             | 14.5 | 40.1          | 0.126 |
| CN5   | 66 / F / R                          | SCA6      | 96                             | 21.5 | 51.91         | 0.080 | CN36 | 48 / M / L                          | MJD       | 159                            | 24   | 72.44         | 0.336 |
| CN6   | 66 / M / R                          | SCA6      | 100                            | 11   | 39.34         | 0.000 | CN37 | 60 / M / R                          | MJD       | 174                            | 13   | 35.75         | 0.000 |
| CN7   | 68 / F / R                          | SCA6      | 36                             | 2.5  | 23.78         | 0.400 | CN38 | 56 / M / R                          | SCA2      | 84                             | 6.5  | 27            | 0.100 |
| CN8   | 53 / M / R                          | SCA31     | 235                            | 6.5  | 23.88         | 0.120 | CN39 | 36 / F / R                          | SCA8      | 147                            | 10   | 37.03         | 0.192 |
| CN9   | 56 / F / R                          | SCA31     | 86                             | 5.5  | 23.78         | 0.324 | CN40 | 41 / F / R                          | SCA8      | 154                            | 13.5 | 35.9          | 0.032 |
| CN10  | 63 / F / R                          | SCA31     | 44                             | 7    | 33.16         | 0.000 | CN41 | 69 / M / R                          | SCA36     | 184                            | 12   | 42.84         | 0.056 |
| CN11  | 64 / F / R                          | SCA31     | 99                             | 19   | 44.78         | 0.000 | CN42 | 69 / F / R                          | DRPLA     | 91                             | 14.5 | 36.16         | 0.270 |
| CN12  | 66 / M / R                          | SCA31     | 99                             | 10.5 | 29.53         | 0.320 | CN43 | 48 / M / R                          | MSA-C     | 68                             | 14.5 | 47.03         | 0.240 |
| CN13  | 66 / F / R                          | SCA31     | 182                            | 13.5 | 46.88         | 0.000 | CN44 | 56 / M / R                          | MSA-C     | 40                             | 15   | 43            | 0.168 |
| CN14  | 68 / M / R                          | SCA31     | 72                             | 15.5 | 50.53         | 0.054 | CN45 | 57 / M / R                          | MSA-C     | 51                             | 6.5  | 24.07         | 0.384 |
| CN15  | 68 / M / L                          | SCA31     | 104                            | 11   | 23.78         | 0.144 | CN46 | 58 / M / R                          | MSA-C     | 19                             | 12   | 46.22         | 0.144 |
| CN16  | 29 / F / R                          | CCA       | 198                            | 5    | 33.81         | 0.000 | CN47 | 58 / M / R                          | MSA-C     | 28                             | 13.5 | 26.28         | 0.504 |
| CN17  | 39 / M / R                          | CCA       | 100                            | 9    | 29.03         | 0.420 | CN48 | 59 / F / R                          | MSA-C     | 20                             | 8    | 26.54         | 0.120 |
| CN18  | 42 / F / R                          | CCA       | 204                            | 10   | 49.5          | 0.080 | CN49 | 61 / M / R                          | MSA-C     | 36                             | 12.5 | 32.41         | 0.300 |
| CN19  | 45 / F / R                          | CCA       | 27                             | 4.5  | 24.91         | 0.280 | CN50 | 62 / M / R                          | MSA-C     | 76                             | 11.5 | 39.68         | 0.096 |
| CN20  | 45 / M / R                          | CCA       | 294                            | 10.5 | 57.84         | 0.064 | CN51 | 63 / F / R                          | MSA-C     | 25                             | 10.5 | 34.81         | 0.064 |
| CN21  | 48 / F / R                          | CCA       | 115                            | 6.5  | 20.87         | 0.280 | CN52 | 64 / M / R                          | MSA-C     | 15                             | 11.5 | 32.57         | 0.096 |
| CN22  | 59 / F / R                          | CCA       | 349                            | 13.5 | 34.94         | 0.000 | CN53 | 64 / M / R                          | MSA-C     | 36                             | 8    | 24.15         | 0.324 |
| CN23  | 63 / F / R                          | CCA       | 281                            | 16   | 40.75         | 0.120 | CN54 | 64 / F / R                          | MSA-C     | 38                             | 10   | 49            | 0.000 |
| CN24  | 65 / M / R                          | CCA       | 206                            | 10.5 | 29.09         | 0.108 | CN55 | 65 / F / R                          | MSA-C     | 40                             | 12.5 | 40.56         | 0.016 |
| CN25  | 31 / F / R                          | MJD       | 51                             | 7.5  | 29.34         | 0.360 | CN56 | 56 / M / R                          | MSA-P     | 27                             | 7    | 37.31         | 0.486 |
| CN26  | 33 / M / R                          | MJD       | 75                             | 11.5 | 23.78         | 0.480 | CN57 | 56 / M / R                          | MSA-P     | 45                             | 12.5 | 27.91         | 0.378 |
| CN27  | 36 / F / R                          | MJD       | 72                             | 16   | 28.44         | 0.324 | CN58 | 60 / M / R                          | MSA-P     | 33                             | 8    | 27.47         | 0.140 |
| CN28  | 37 / F / R                          | MJD       | 14                             | 5.5  | 25.94         | 0.120 | CN59 | 56 / M / R                          | PP-MSA    | 42                             | 1.5  | 26.91         | 0.800 |
| CN29  | 41 / F / R                          | MJD       | 269                            | 14.5 | 55.91         | 0.168 | CN60 | 63 / M / R                          | PP-MSA    | 16                             | 10   | 25.5          | 0.640 |
| CN30  | 43 / F / R                          | MJD       | 124                            | 12.5 | 27.25         | 0.252 | CN61 | 65 / M / R                          | PP-MSA    | 20                             | 7.5  | 32.09         | 0.540 |
| CN31  | 44 / M / R                          | MJD       | 166                            | 9    | 29.22         | 0.196 | CN62 | 65 / M / R                          | PP-MSA    | 30                             | 10   | 33.21         | 0.576 |

#### Elderly cerebellar ataxia patients (CN)

| ID  | Age (year) / Gender /<br>Handedness | Diagnosis | Disease<br>duration<br>(Month) | SARA | 9HPT<br>(sec) | AI    | ID   | Age (year) / Gender /<br>Handedness | Diagnosis | Disease<br>duration<br>(Month) | SARA | 9HPT<br>(sec) | AI    |
|-----|-------------------------------------|-----------|--------------------------------|------|---------------|-------|------|-------------------------------------|-----------|--------------------------------|------|---------------|-------|
| CE1 | 70 / M / R                          | SCA6      | 79                             | 11   | 26.41         | 0.432 | CE9  | 76 / F / R                          | SCA31     | 252                            | 23   | 83.1          | 0.072 |
| CE2 | 71 / M / R                          | SCA6      | 36                             | 16   | 37.41         | 0.042 | CE10 | 79 / F / R                          | SCA31     | 64                             | 12   | 33.93         | 0.270 |
| CE3 | 71 / M / R                          | SCA6      | 225                            | 15   | 54.53         | 0.000 | CE11 | 79 / F / R                          | SCA31     | 237                            | 17   | 37.1          | 0.256 |
| CE4 | 74 / M / R                          | SCA6      | 210                            | 19.5 | 56.28         | 0.060 | CE12 | 77 / M / R                          | CCA       | 84                             | 7    | 27.37         | 0.012 |
| CE5 | 72 / F / R                          | SCA31     | 49                             | 7    | 27.03         | 0.000 | CE13 | 83 / M / R                          | CCA       | 84                             | 18   | 39.9          | 0.008 |
| CE6 | 72 / F / R                          | SCA31     | 276                            | 15.5 | 35.22         | 0.108 | CE14 | 72 / M / L                          | MSA-C     | 37                             | 14.5 | 50.57         | 0.256 |
| CE7 | 74 / F / R                          | SCA31     | 48                             | 13.5 | 35.9          | 0.270 | CE15 | 77 / F / R                          | MSA-C     | 71                             | 10.5 | 34.28         | 0.324 |
| CE8 | 75 / M / R                          | SCA31     | 247                            | 17.5 | 47.53         | 0.000 |      |                                     |           |                                |      |               |       |

CN = non-elderly (< 70 years old) patients. CE = elderly ( $\geq$  70 years old) patients. SCA2, 6, 8, 31, 36 = spinocerebellar ataxia type 2, 6, 8, 31, 36. MJD = Machado-Joseph disease. DRPLA = dentatorubral-pallidoluysian atrophy. CCA = cortical cerebellar atrophy. MSA-C = multiple system atrophy with predominant cerebellar ataxia. MSA-P = multiple system atrophy with predominant parkinsonism. PP-MSA = pure parkinsonian MSA without cerebellar ataxia. M = male. F = female. R = right. L = left. SARA = Scale for the assessment and rating of ataxia. 9HPT = nine-hole peg test. AI = adaptability index.

doi:10.1371/journal.pone.0119376.t001

All the participants were naive to the experiments for their first test, except for five MSA patients who were tested every 3 to 6 months to track their disease progressions, and their visual acuity was normal or corrected by spectacles.

# Experimental apparatus

The apparatus consisted of two Windows 7 personal computers (HP Compaq 8200 Elite, CT, USA), one server for task control and one client for data sampling and analysis, a 23-inch touchscreen (HP 2310t, Hewlett-Packard Japan, Tokyo, Japan), custom-made goggles, and a sensor on the participant's right earlobe (Fig. 1A). The touchscreen display resolution was 1920 (w)  $\times$  1080 (h) pixels (95.78 dpi; dot pitch, 0.265 mm). The goggles contained either a transparent plastic plate (16  $\times$  4.3 cm<sup>2</sup>) or a Fresnel prism plate of the same size (LP25, Nihon Tokushu Kogaku Jushi, Tokyo, Japan), which shifted the visual field 25° rightward. The goggles were also fitted with an electrically controlled shutter (NSG UMU PRODUCTS, Chiba, Japan), opened by the command voltage pulse-on (100 V) and closed 10 ms after pulse-off. Software (Visual Reaching Task software, KATANO TOOL SOFTWARE, Chiba, Japan) based on Lab-VIEW2011 (National Instruments Japan, Tokyo, Japan) was used for controlling the touchscreen and shutter and for sampling and analyzing data.

# Hand-reaching task

The participants sat on a chair wearing the goggles, with their head loosely restrained by a chin rest. The touchscreen was set 320–530 mm in front of them depending on the length of their individual reach. Until a start signal was given, the participants touched the earlobe sensor with their right index finger (Fig. 1B). While touching the sensor, a target (white circle, 8 mm in diameter) appeared randomly at one of the  $3 \times 3$  grid cells (width and height of each grid, 10 and 6.7 cm, respectively) except at the center of the touchscreen. Then, the participants were requested to reach their index finger to the target. Immediately after the participants released their index finger from the sensor, the electrically controlled shutter was changed from transparent to translucent by the computer, and their vision was blocked until 10 ms after the index finger touched the screen (Fig. 1B). This was intended to prevent visual online correction through detecting the error by viewing the trajectory of finger, just to mimic the dart throwing experiments in which no corrections could occur once after the dart was thrown. Subsequently, the shutter was reopened, which allowed the participants to see their finger and the target for 100 ms through the goggles. Then, the target on the touchscreen disappeared with a beep sound of short duration, and the participants were requested to return their index finger from the touchscreen to the sensor. After an interval of more than 200 ms, the next trial was started. When the participant failed to touch a touchscreen within 5 s after releasing their index finger from the sensor, such a trial was counted as a failure. Failure trial was not counted as a trial, and skipped to a new trial.

# Prism adaptation task

Before testing prism adaptation, all the participants familiarized themselves with the experimental setup by performing 100 trials without the prism. The test consisted of three consecutive sessions: (1) 50 trials with normal vision wearing the transparent plastic plate (BASELINE), (2) 100 trials wearing the prism, shifting the visual field 25° rightward (PRISM), and (3) 50 trials wearing the transparent plastic plate without the prism (REMOVAL). A short break of 0.5 min was made between sessions, during which examiners replaced the transparent plastic plate with the prism plate, or vice versa. The test was undertaken in a quiet dark room, and it took 20–30 minutes for each participant to complete the entire test.



**Fig 1. Scheme for prism adaptation of hand-reaching.** (A) The experimental apparatus consists of a sensor on the participant's right earlobe, goggles equipped with an electrically controlled shutter with a plastic or Fresnel prism plate, a touchscreen, and two computers. (B) Time sequence of a single trial shown from left to right. Every trial starts from the touch of a participant's index finger at the sensor on the right earlobe. As soon as the participant releases their index finger from the sensor, vision is blocked by the shutter (MOVEMENT TIME). Immediately after reaching the touchscreen (TOUCH), the goggles become transparent, and the participant recognizes how their index finger deviated/hit the target for 100 ms (EXPOSURE). Subsequently, the target disappears (TARGET OFF) and the participant returns their index finger to the original position in preparation for the next trial.

#### Data analysis

The finger-touch error, i.e., the distance between the touch position and the target on the touchscreen, was automatically measured and stored in the client computer for each trial. As the prism shifted the visual field horizontally, only the deviation in the horizontal plane was analyzed. The mean and standard deviation (SD) of the finger-touch error were calculated in each trial for each group of participants. The change in the variability of the finger-touch error during PRISM was evaluated for each participant as e/d, where d is the SD of the finger-touch error to the initial 20 trials of PRISM, and e is that for the last 20 trials of PRISM. The correct touch was determined when the finger-touch error was  $\leq 25$  mm, by referring to the mean + twice the SD of the finger-touch error of 21 HN subjects in the last 10 trials of BASELINE.

Three probabilities were calculated to evaluate adaptation: (1) the acquisition of adaptation ("*a*") defined as the probability of correct touches in the last 10 trials of PRISM; (2) the retention of adaptation ("*b*") defined as the probability of incorrect touches in the initial five trials of REMOVAL, and (3) the extinction of adaptation ("*c*") designated as the probability of correct touches in the last 10 trials of REMOVAL. It should be noted that "*a*" and "*c*" are for correct touches, whereas "*b*" is for incorrect touch as the number of incorrect touch reflect retention of

adaptation. Healthy individuals usually show high scores in *a*, *b*, and *c*. The adaptability index (*AI*) was calculated as  $AI = a \times b \times c$ . In addition, the time constant ( $\tau$ ) in the initial part of PRISM was also analyzed by referring to Martin *et al.* [13]. The adaptation curve in PRISM was drawn using the GraphPad Prism software (ver. 6.02, GraphPad Software, SDG, USA) and fitted as  $y = \alpha \cdot \exp(-t/\tau) + \beta$ , where *y* is the finger-touch error,  $\beta$  is the final value that the exponential decay function approaches,  $\alpha$  is the distance from the finger-touch error at the initial trial of PRISM to the plateau  $\beta$ , *t* is the number of trials; and  $\tau$  is the number of trials when the finger-touch error approached the (1- exp (-1)) = 63.2% of  $\alpha$ . We then assessed which of the five parameters (*a*, *b*, *c*, *AI* and  $\tau$ ) best reflects cerebellar function using the cumulative frequency distribution receiver operating characteristic (ROC) curves by referring to Swets [31]. The sensitivity and specificity of these five parameters were determined by referring to Lalkhen and McCluskey [32]. We calculated the area under the ROC curve (AUC) to quantify the overall ability of the parameters to discriminate between patients with cerebellar disease and healthy subjects.

# Statistical analysis

The Mann-Whitney U-test or Kruskal-Wallis test for multiple comparisons was used to assess the differences in *AI* between healthy subjects and patients with cerebellar diseases, and among HN, HE, CN and CE groups. Post hoc comparisons using the Steel-Dwass test following the Kruskal-Wallis test were performed to determine which groups differed from each other. Cumulative frequency distributions of HN, HE, CN and CE groups were compared using the Kolmogorov-Smirnov test [33]. The distribution of *AI* in HE and HN groups were compared by the Ansari-Bradley test [34]. The AUCs of the five parameters were compared by DeLong's test [35]. Spearman's rank order correlation was used to examine the relationship between the *AI* for individual patients and the SD of finger-touch error, between *AI* and SARA score, between *AI* and 9HPT, and between *AI* and disease durations. Spearman's rank order correlation coefficients ( $r_s$ ) were calculated to determine the strength of the association between two variables. p < 0.05 was regarded as statistically significant. For these statistical analyses, GraphPad Prism software, Matlab software (Matlab2013a, MathWorks, MA, USA) and R software (version 3.1.0, The R Foundation for Statistical Computing, Vienna, Austria) were used. Unless otherwise stated, data were described as mean  $\pm$  standard error of the mean (SEM).

# Results

# Prism adaptation of hand-reaching movement

Prism adaptation occurred quickly in healthy subjects, as shown in Fig. 2A [51-year-old healthy subject (HN13, <u>S1 Table</u>)]. Before wearing the prism (BASELINE), she touched the target correctly in most of the trials. At the initial few trials of PRISM, she touched rightward as the prism shifted her visual field rightward. After 30–40 trials, she was able to touch the target correctly following the acquisition of prim adaptation. When the prism was removed (RE-MOVAL), she touched leftward from the target owing to the retention of adaptation. By the time she finished 20 subsequent trials with normal vision, she was able to touch the target correctly due to the extinction of adaptation.

On the other hand, adaptation was impaired in patients with cerebellar diseases. A patient with SCA6 (CN4, 63 years old, SARA = 26; <u>Table 1</u>), irregularly missed the targets in BASE-LINE (<u>Fig. 2B</u>). He touched consistently the targets with a large rightward deviation showing no acquisition of adaptation in PRISM, and missed the targets similarly in REMOVAL as in BASELINE. However, not all patients showed such typical alterations. In some patients, the retention of adaptation was absent, which was noticed by the lack of leftward deviation at the



**Fig 2.** Adaptation curves in different subjects and in healthy and patient groups. (A)–(D) Adaptation curves in HN13 (A), CN4 (B), CN3 (C), and CN15 (D). The ordinate shows the finger-touch error represented by the distance (mm) from the target to the touch point. Positive values indicate rightward shifts and negative values indicate leftward shifts. The abscissa shows the trial numbers. Best-fitted exponential curves (for details, see <u>Materials and Methods</u>) are overlaid on the raw data. Whereas a normal subject (HN13) shows typical adaptation (A), patients with cerebellar diseases show three different patterns of impaired adaptation (B)–(D). (E) and (F) Average adaptation curves for 21 HN subjects (E) and 62 CN patients (F). Thick and thin curves show mean and mean ± 2SD, respectively.

initial trials of REMOVAL (CN3, 62 years old, SARA = 14; <u>Fig. 2C</u>), or the acquisition of adaptation was slow and extinction in REMOVAL was absent in a patient with SCA31 (CN15, 68 years old, SARA = 11; <u>Fig. 2D</u>).

Figs. 2E and 2F respectively show plots of the mean ± 2SD of finger-touch error for each trial in the HN and CN groups. In PRISM, the HN group quickly adapted, whereas the CN group very slowly and incompletely adapted, indicating the impaired acquisition of adaptation. In REMOVAL, the retention of adaptation was large in the HN group, but small in the CN group, showing little retention in the CN group. These results consistently suggest that the prism adaptation was impaired markedly in the CN group.

We analyzed the variability of the finger-touch error in every trial by measuring its SD, and compared the variability between the HN and CN groups (Figs. 3A and 3B). In BASELINE of the HN group, the variability of the finger-touch error was distributed at 11.9–15.9 mm, and uniformly decreased as the trial number increased. At the start of PRISM, the variability of the finger-touch error increased owing to a shift of the visual field, but soon decreased to the level equivalent to the plateau of BASELINE. In contrast, the variability of the finger-touch error in



**Fig 3. Variability of the finger-touch error in HN and CN groups.** (A) Variability of the finger-touch error in 21 HN subjects. Each dot shows SD of the finger-touch error for every trial throughout BASELINE, PRISM, and REMOVAL. An interpolated curve was drawn by fitting with nonlinear regression. (B) Same analysis as (A) in patients with cerebellar diseases below 70 years old (CN). (C) Comparison of intertrial variability of the finger-touch error shown in A and B between the initial 20 and the last 20 trials. The ordinate shows the ratio (*e*/*d*) of the mean SD for the last 20 trials (*e*) in PRISM to that for the initial 20 trials (*d*) of PRISM. Note that the intertrial variability markedly decreased following adaptation in the HN group, but not in the CN group. \*\*\*\* p < 0.0001 by Mann-Whitney U-test. Error bar represents SEM.

BASELINE of the CN group (18.6–23.4 mm) was larger than that of the HN group. Nevertheless, the SDs tended to decrease gradually in both BASELINE and PRISM. When such a decrease in the variability of the finger-touch error during PRISM was compared between the CN and HN groups, it markedly decreased following the acquisition of adaptation in the HN group ( $e/d = 0.42 \pm 0.04$ ), but not in the CN group ( $e/d = 0.91 \pm 0.05$ , p < 0.0001, Mann-Whitney Utest; Fig. 3C). Thus, the adaptation was impaired not only in the magnitude of the finger-touch error but also in its variability in the CN patients.

#### Adaptability index (AI) as a quantitative marker for motor learning

We determined a quantitative marker that reflects motor learning for every participant tested. Because the mean + 2SD of the finger-touch error for the last 10 trials was 20.5 mm in BASE-LINE of the HN group, we set the normal deviation of the finger-touch error at this value. Then, we defined a trial as correct if the finger-touch error was within  $\pm$  25 mm for all the participants.

We analyzed whether the following three probabilities [acquisition ("*a*"), retention ("*b*"), and extinction ("*c*")] of adaptation could be quantitative markers for adaptation. Figs. 4A and 4B respectively show the three probabilities in a healthy subject (HN13 in Fig. 2A) and a SCA6 patient (CN4 in Fig. 2B). When we analyzed the HN and CN groups in terms of each of the three probabilities, the two groups showed statistically significant differences in all the three probabilities (inset of Figs. 4C-E, p < 0.0001, Kolmogorov-Smirnov test). However, a significant overlap was recognized at the range of 0.7–1 in their frequency distributions (Figs. 4C-E), suggesting that any of these three is insufficient to discriminate between normal and impaired motor learning. In contrast, the frequency distributions of *AI*, calculated as  $a \times b \times c$ , completely separated the HN and CN groups around the *AI* of 0.7 (Fig. 4F, p < 0.0001, Kolmogorov-Smirnov test), except for one patient with a pure parkinsonian MSA whose *AI* was 0.8 (CN59, Table 1). However, the patient was exceptional because the cerebellar dysfunction was not observed in this patient, and the magnetic resonance imaging (MRI) did not show any cerebellar or pontine atrophy.





**Fig 4. Quantitative evaluation of prism adaptation.** (A) An example of adaptation in a healthy subject (HN13) shown in Fig. 2A. The finger-touch error of the last 10 trials of PRISM, and that of the initial five and last 10 trials of REMOVAL are extracted from Fig. 2A. Acquisition, retention, and extinction of adaptation were estimated from the probability of success (a) in the last 10 trials of PRISM (10/10), the probability of failure (b) in the initial five trials of REMOVAL (5/5), and the probability of success (c) in the last 10 trials of REMOVAL (10/10), respectively. *AI* was calculated as  $a \times b \times c$  and 1 in this case. (B) Similar analysis in CN4 shown in Fig. 2B. a = 1/10, b = 1/5, c = 6/10.  $AI = (1/10) \times (1/5) \times (6/10) = 0.012$ . Horizontally shaded areas in (A) and (B) represent the zone of "correct" touch (within ± 25mm). (C)–(F) Frequency distributions of a (C), b (D), c (E), and AI (F). Insets represent cumulative frequency curves. *F* (*x*) represents normal cumulative distribution function. (G) Frequency distribution of the time constant  $\tau$  (for details, see <u>Materials and Methods</u>). Insets represent cumulative frequency curves of  $\tau$ . Red columns and lines in (C)–(G) show data for 21 HN subjects. Blue columns and lines in (C)–(G) show data for 22 HN subjects. Blue columns and lines in (C)–(G) show data for 22 HN subjects. Blue columns and lines in (C)–(G) show data for 22 HN subjects. Blue columns and lines in (C)–(G) show data for 22 HN subjects. Blue columns and lines in (C)–(G) show data for 24 HN subjects. Blue columns and lines in (C)–(G) show data for 24 HN subjects. Blue columns and lines in (C)–(G) show data for 25 HN subjects. Blue columns and lines in (C)–(G) show data for 26 CN patients. (H) Receiver operating characteristic (ROC) curve analysis in the HN and CN groups. A purple line shows ROC curve for *AI*, a red line for the probability of acquisition, a blue line for the probability of retention, a green line for the probability of extinction, and a black line f

doi:10.1371/journal.pone.0119376.g004

We also calculated the time constant ( $\tau$ ) for the decay of the finger-touch error in PRISM for all the HN subjects and CN patients (Fig. 4G). Again, the frequency distributions of  $\tau$  largely overlapped in the range of 1–30 trials between the HN and CN groups (median, 5.0 trials for HN and 11.3 trials for CN, p = 0.10, Mann-Whitney U-test), and thus no significant difference was recognized between these two groups in the cumulative frequency distribution (inset of Fig. 4G, p = 0.08, Kolmogorov-Smirnov test).

Analysis of the ROC curve further demonstrated a significantly high accuracy of discrimination between the HN and CN groups when using AI (AUC: 0.99). DeLong's test proved that AI powerfully discriminated the two groups compared with *a* (AUC: 0.93, p < 0.01), *b* (AUC: 0.89, p < 0.001), *c* (AUC: 0.82, p < 0.0001) and  $\tau$  (AUC: 0.63, p < 0.0001) (Fig. 4H). Participants with AI < 0.68 belonged to the CN group with a sensitivity of 98.4% and a specificity of 100%, when the cutoff value determined from the ROC curve was applied as previously described [36]. These results led us to conclude that AI is the most reliable quantitative marker for the cerebellum-dependent motor learning in humans, and helps to discriminate the HN group from the CN group.

# Motor learning (AI) and incoordination

The variability of the finger-touch error represents dysmetria, a sign of incoordination. We examined the relationship between *AI* and incoordination on the basis of the dysmetria represented by the variability of the finger-touch error in the 50 trials of BASELINE for individual subjects. As shown in Fig. 5A, *AI* appeared independent of the magnitude of dysmetria in the hand-reaching task in the HN or CN group, because no correlation was demonstrated between *AI* and SD of the hand-reaching error (HN,  $r_s = -0.30$ , p = 0.19; CN,  $r_s = -0.13$ , p = 0.33). However, when we tracked *AI* in five MSA patients (CN56, CN57, CN59, CN60, and CN61) for follow-up testing, *AI* decreased significantly within two years ( $r_s = -0.76$ , p < 0.0001, Fig. 5B). These patients were selected because disease progression is known to be much faster in MSA patients than in those with any other hereditary cerebellar ataxia [37,38]. By clinical inspection, ataxia apparently became exacerbated over time in these patients. Actually, the SARA score increased in all five patients during the follow-up period (Fig. 5C). Thus, *AI* did not correlate with the magnitude of incoordination for individual patients, but it correlated with the progression of incoordination when tracked longitudinally for each patient.

# Al distribution in healthy subjects and cerebellar patients

By comparing the *AI* of the healthy subjects among decade-wide age groups from 20s to 80s, we found a significant decrease in *AI* in the HE group (p < 0.05, Kruskal-Wallis test). *AI* in the HE group showed a wider distribution compared to those in the HN group (Fig. 6A, p < 0.05, Ansari-Bradley test). Moreover, as shown in Fig. 6B, clear differences in *AI* (p < 0.0001, Kruskal-Wallis test) were observed among healthy subjects (HN and HE) and patients with cerebellar diseases (CN and CE): *AI* of the HN group ( $0.867 \pm 0.026$ , n = 21) was higher than those of the HE group ( $0.623 \pm 0.052$ , n = 17; p < 0.01, Steel-Dwass test), CN ( $0.227 \pm 0.024$ , n = 62; p < 0.0001, Steel-Dwass test), and CE ( $0.141 \pm 0.037$ , n = 15; p < 0.0001, Steel-Dwass test) groups. There was no significant difference in *AI* between the CN and CE groups (p = 0.35, Steel-Dwass test).

# Comparison of AI with other clinical indices of cerebellar ataxia

In the CN and CE groups, a negative correlation was observed between AI and SARA score ( $r_s = -0.34$ , p < 0.01, Fig. 7A), and between AI and 9HPT ( $r_s = -0.53$ , p < 0.0001, Fig. 7B).



**Fig 5. Relationship between** *AI* **and incoordination.** (A) *AI* and the magnitude of dysmetria represented by the SD of the finger-touch error in BASELINE. Data were obtained from 62 CN patients (blue dots) and HN subjects (red dots). Each point represents data obtained from one subject. (B) and (C) Tracking *AI* (B) and SARA (C) data of each MSA patient (CN56, CN57, CN59, CN60, and CN61; n = 5).

Consistent with the observation that degenerative diseases progress over time [37-40], a negative correlation was observed between *AI* and the duration of disease ( $r_s = -0.37$ , p < 0.001, Fig. 7C).

A comparison between the CBL and CBL+ groups showed that *AI* of the CBL group (0.145  $\pm$  0.030) was smaller than that of the CBL+ group (0.236  $\pm$  0.029, *p* < 0.05, Mann-Whitney U-test; Fig. 7D). Meanwhile, no significant difference in SARA score (11.6  $\pm$  1.2 for CBL vs 11.2  $\pm$  0.6 for CBL+, *p* = 0.98, Mann-Whitney U-test) or 9HPT (39.5  $\pm$  4.9 s vs 34.4  $\pm$  1.7 s, *p* = 0.71, Mann-Whitney U-test) was found between them. *AI* varied significantly among the pure cerebellar SCA patients with relatively mild ataxia showing SARA scores between 10 and 14 (S1 Fig.). These results suggest that *AI* is more sensitive for detecting changes in cerebellar functions than SARA score and 9HPT. Moreover, *AI* was significantly higher in pure parkinsonian MSA patients than in SCA6, SCA31, CCA, and MSA (MSA-C and MSA-P) patients (*p* < 0.05, Steel-Dwass test; Fig. 7E), which is consistent with this suggestion.



**Fig 6.** *Al* **of healthy subjects (HN and HE) and cerebellar patients (CN and CE).** (A) Distribution of *Als* and ages for all the participants analyzed. *Al* tended to decrease and showed a widespread distribution in the HE group. Cerebellar patients (CN and CE) showed lower *Als* than the age-matched healthy subjects (HN and HE).  $\dagger$  indicates four pure parkinsonian MSA patients without clinical cerebellar signs. (B) Comparison of *Al* among the HN, HE, CN and CE groups. In all panels, red circles and columns represent HN; magenta, HE; blue, CN; and green, CE. \*\*p < 0.01, \*\*\*\*p < 0.0001, Kruskal-Wallis test or Steel-Dwass test. Error bar represents SEM.

#### Discussion

Taking advantage of the fact that the hand-reaching task is very simple, we succeeded in developing a paradigm for quantitatively assessing the cerebellum-dependent motor learning in almost any individual by performing 200 trials within only 20–30 minutes with a relatively cheap and compact system (<u>S2 Table</u>). A novel neurological biomarker (*AI*), which reflects acquisition, retention, and extinction of the prism adaptation of hand-reaching movement, was lower and its variability was larger in patients with cerebellar diseases than those in the age-matched healthy subjects. Moreover, *AI* decreased with aging even in healthy subjects over 70 years old. On the basis of these findings, we suggest *AI* as a new clinical index for the quantification of cerebellar motor learning.

#### Characteristics of AI

The magnitude of motor errors at the initial portion of REMOVAL, the retention (*b*) in the present study, has been focused on for evaluating prism adaptation in previous studies [13, 41–43]. The present ROC analysis (Fig. 4H) proved that probabilities of the acquisition (*a*), retention (*b*) and extinction (*c*) of adaptation are all helpful for differentiating the healthy (HN) group from the ataxic (CN) group, but insufficient as a standalone single clinical maker for discriminating between the HN and CN groups. However, *AI* was a nearly perfect parameter with a cutoff value of 0.68 for the subjects below the age of 70 for detecting patients with cerebellar diseases. Taken together, we propose that *AI* is a reliable quantitative parameter of cerebellar function based on motor learning.

#### Neural mechanisms involved in prism adaptation

Previous studies suggest that prism adaptation process can be divided into two phases: the early phase in which the subjects strategically, consciously and rapidly achieve error correction



**Fig 7.** *Al* and other clinical indexes in various cerebellar diseases. (A)–(C) Scatter plots comparing *Al* with SARA score (A), 9-Hole Peg Test (B), and disease duration (C) in CN and CE patients. Linear regression lines are overlaid. (D) Comparison of *Al* between the CBL (n = 24) and CBL+ (n = 32) groups. \*p < 0.05 by Mann-Whitney U-test. Error bar represents SEM. (E) *Al* was significantly higher in pure parkinsonian MSA patients than in SCA6, SCA31, CCA, or MSA (MSA-C and MSA-P) patients. \*p < 0.05, post hoc Steel-Dwass test.

of hand movement within few trials in the early prism exposure, and the late phase in which they autonomously, unconsciously and slowly recalibrate spatial misalignments among distorted visual and incoming sensorimotor information, which requires a prolonged prism exposure [44, 45]. These two phases overlap during the process of prism adaptation. In PRISM of the present study, the early phase and the late phase may correspond to the decay of fingertouch error ( $\tau$ ) and the acquisition (*a*), respectively. The decay of finger-touch errors in the early phase ( $\tau$ ) was slow, and the acquisition (*a*) in the late phase was gradual and incomplete in patients with cerebellar diseases, implying that the cerebellum is involved in both phases. However, the acquisition (a) was more severely depressed than the decay of finger-touch errors ( $\tau$ ) (Figs. 2E, 2F, 4C and 4G). This implies that the contribution of the cerebellum may be larger in the late phase than in the early phase. It is assumed that the cerebellum is not the sole responsible brain area for prism adaptation. Several functional MRI (fMRI) and positron emission tomography (PET) studies [46-49], as well as a model study [50], have suggested that the cerebral cortex may be involved in the prism adaptation in addition to the cerebellum. Particularly, the fMRI studies consistently suggest that both the parietal cortex and cerebellar cortex are activated in the early phase of prism adaptation [47-49]. Taken together these previous studies, the result of the present study may suggest that both the cerebellum and parietal cortex contributes in the early phase of adaption, while only the cerebellum contributes in the late phase of adaptation. However, since most of the patients used in the present study have long history of movement disorders induced by cerebellar diseases, a possibility remains that some compensatory mechanisms, probably through the cerebral cortex, operated in prism

adaptation. Hence, to determine the relative contributions of the cerebellum and parietal cortex in the early phase of prism adaptation, further studies of fMRI and patients of acute focal lesions are necessary.

The responsible areas of prism adaptation are not identified well in the cerebellum. Monkey lesion [51] and pharmacological reversible inactivation [17] studies consistently suggested that cerebellar hemispheric lobules VII (crus I and crus II), VIII (paramedian lobule and dorsal par-aflocculus), vermal IX (uvula), and the dentate nucleus are involved in prism adaptation of the hand-reaching. A monkey unit-recoding study suggested that Purkinje cells in the cerebellar hemispheric lobules IV–VI encode hand-reaching error signals [52]. Clinical studies of cerebellar lesions suggest that the hemispheric lobules IV, V and VI are involved in adaptation of hand-reaching [53, 54]. A recent fMRI study has suggested that the hemispheric lobules III, IV, V, VI, VII, VIII and IX are activated in the early or late phases of the prism adaptation [55]. To determine the responsible cerebellar areas of prism adaptation, further studies of patients of acute focal cerebellar lesions are necessary.

#### Relationship between motor learning and incoordination

Dysmetria is a symptom of incoordination induced by impaired cerebellar precision control. Studies of monkey saccade eye movements have shown that dysmetria, which is evaluated by the variability of movement in each trial, closely correlates with motor learning. Lesions of the monkey cerebellar vermal or hemispheric areas involved in saccade control not only impair the saccade amplitude adaptation but also increase the variability of saccade amplitude [56, 57]. In the present study, the variability of the finger-touch error induced by a prism decreased as the adaptation progressed in healthy subjects (Fig. 3A), indicating that motor learning may act to decrease the variability of movement. Meanwhile, patients with cerebellar diseases showed an increase in the variability of the finger-touch error in BASELINE compared with healthy subjects, indicating dysmetria. Such an increase in the variability of the finger-touch error in cerebellar patients did not improve during PRISM (Fig. 3B). While no correlation was found between AI and the magnitude of the variability of the finger-touch error for individual subjects (Fig. 5A), AI showed a tendency to decrease as the disease progressed in some patients (Figs. 5B and 5C). Taken together with these findings, we consider that there may be a close correlation between the impairment of motor learning and dysmetria. The possibility that limb ataxia may hamper cerebellar motor learning in cerebellar patients is unlikely, because very low AIs (0–0.2) were observed in individuals with a small variability of the finger-touch error (< 10 mm). Conceptually, the internal model of movement formed by motor learning is assumed to be utilized for precision motor control by the cerebellum [1, 58].

# Clinical implications of AI

The present prism adaptation paradigm provides several clinical implications. First, testing motor learning may help in extracting the cerebellar component from signs composed of multiple neural dysfunctions. In the present cohort, *AI* was lower in patients in the CBL group showing purely cerebellar syndromes than in the CBL+ group with clinical evidence of multi-system degenerations, whereas SARA and 9HPT did not show any significant difference between them (Fig. 7D). We reasoned that both SARA score and 9HPT reflect not only the cerebellar but also the extra-cerebellar signs such as bradykinesia of basal ganglia origin. This view is further supported by the comparison of *AI*, SARA and 9HPT between the MSA-C +MSA-P and pure parkinsonian MSA patients (Fig. 7E). Second, *AI* appears useful in quantitatively tracking the progression of changes in cerebellar dysfunctions even for two-year follow-up (Figs. 5B and 7C). To further confirm the utility of *AI* in tracking disease progression, much

longer follow-up studies are necessary. Third, *AI* and the present paradigm may be applied to the rehabilitation of cerebellar dysfunctions, such as intensive coordination training with kinetic video games [59], which was shown to improve the motor performance of patients with cerebellar diseases.

AI was significantly decreased and dispersed in healthy subjects over 70 years old, suggesting that the aging effect on motor learning varied among individuals. The cerebellum is one of the brain regions that has been shown to decline with aging both anatomically [ $\underline{60}$ ,  $\underline{61}$ ] and functionally [ $\underline{62}$ - $\underline{65}$ ]. A previous study of prism adaptation of ball throwing behavior showed that adaptation became slower [ $\underline{66}$ ,  $\underline{67}$ ], which is generally consistent with the results of the present study.

The cerebellum has been suggested to be involved in cognitive functions such as emotional working memory [2], language [68-71], and thought [72]. The cooperation between the cerebellum and the cerebral cortex is assumed to be involved in such cognitive functions, as well as the induction of prism adaptation [47-50]. The present prism adaptation protocol and *AI* could thus be utilized not only to diagnose patients with cerebellar diseases, but also might help to investigate higher cerebellar functions based on the cerebro-cerebellar network loop.

# **Supporting Information**

**S1 Fig. Adaptation curves in mildly ataxic individuals.** (A)-(D) The four panels show adaptation curves in mildly ataxic individuals [CN1 (A), CN2 (B), CN12 (C), and CN13 (D)], whose SARA scores are 10 to 14. (E) Summary of results. (TIF)

**S1 Table. Characteristics of healthy subjects.** The healthy participants included in this study consisted of 21 non-elderly (< 70 years old, HN) and 17 elderly (> 70, years old, HE) subjects. M = male; F = female; R = right; L = left; SARA = Scale for the Assessment and Rating of Ataxia; *AI* = adaptability index. (DOC)

**S2 Table.** Advantages of present paradigm in comparison with those used in previous studies. Fukushima K, Tanaka M, Suzuki Y, Fukushima J, Yoshida T. Adaptive changes in human smooth pursuit eye movement. Neurosci Res. 1996; 25: 391–398.

Shelhamer M, Tiliket C, Roberts D, Kramer PD, Zee DS. Short-term vestibulo-ocular reflex adaptation in humans. II. Error signals. Exp Brain Res. 1994; 100: 328–336.

Smith MA, Shadmehr R. Intact ability to learn internal models of arm dynamics in Huntington's disease but not cerebellar degeneration. J Neurophysiol. 2005; 93: 2809–2821.

Thach WT, Goodkin HP, Keating JG. The cerebellum and the adaptive coordination of movement. Annu Rev Neurosci. 1992; 15: 403–442.

Wallman J, Fuchs AF. Saccadic gain modification: visual error drives motor adaptation. J Neurophysiol. 1998; 80: 2405–2416.

Woodruff-Pak DS, Papka M, Ivry RB. Cerebellar involvement in eyeblink classical conditioning in humans. Neuropsychology. 1996; 10: 443–458.

(DOC)

# Acknowledgments

The authors thank the healthy volunteers, patients and their families for their participation in this study, and Y. Ohashi (The University of Tokyo, Tokyo, Japan), M. Takano, Y. Takahashi, A. Tanaka and H. Ibi for their help with the statistical analysis of data or task support. They also thank Drs. M. Ito (RIKEN Brain Science Institute, Saitama, Japan) and T. Yamazaki (The

University of Electro-Communication, Tokyo, Japan) for their critical reading of the manuscript.

### **Author Contributions**

Conceived and designed the experiments: YH TH HM SN KI. Performed the experiments: YH TH KM MN KS KI. Analyzed the data: YH TH KM SN KI. Contributed reagents/materials/ analysis tools: YH TH KK HM SN KI. Wrote the paper: YH TH TY HM SN KI. Designed the software used in analysis: TH KK SN.

#### References

- 1. Ito M. The cerebellum and neural control. New York: Raven Press; 1984.
- 2. Ito M. The Cerebellum: Brain for an Implicit Self. New York: FT Press; 2011.
- Lisberger SG, Thach WT. The Cerebellum. In: Kandel ER, Schwartz JH, Jessell TM, Siegelbaum SA, Hudspeth AJ, editors. Principles of Neural Science. McGraw-Hill; 2013. pp. 960–981.
- 4. Babinski J. De l'asynergie cérébelleuse. Rev Neurol. 1899; 7: 806-816.
- 5. Holmes G. THE CEREBELLUM OF MAN. Brain. 1939; 62: 1–30.
- Topka H, Valls-Sole J, Massaquoi SG, Hallett M. Deficit in classical conditioning in patients with cerebellar degeneration. Brain. 1993; 116: 961–969. PMID: <u>8353718</u>
- 7. Woodruff-Pak DS, Papka M, Ivry RB. Cerebellar involvement in eyeblink classical conditioning in humans. Neuropsychology. 1996; 10: 443–458.
- Gerwig M, Kolb FP, Timmann D. The involvement of the human cerebellum in eyeblink conditioning. Cerebellum. 2007; 6: 38–57. PMID: <u>17366265</u>
- Shelhamer M, Tiliket C, Roberts D, Kramer PD, Zee DS. Short-term vestibulo-ocular reflex adaptation in humans. II. Error signals. Exp Brain Res. 1994; 100: 328–336. PMID: 7813669
- Walker MF, Zee DS. Directional abnormalities of vestibular and optokinetic responses in cerebellar disease. Ann N Y Acad Sci. 1999; 871: 205–220. PMID: <u>10372073</u>
- Baizer JS, Glickstein M. Proceedings: Role of cerebellum in prism adaptation. J Physiol. 1974; 236: 34P–35P. PMID: <u>4206505</u>
- Weiner MJ, Hallett M, Funkenstein HH. Adaptation to lateral displacement of vision in patients with lesions of the central nervous system. Neurology. 1983; 33: 766–772. PMID: <u>6682520</u>
- **13.** Martin TA, Keating JG, Goodkin HP, Bastian AJ, Thach WT. Throwing while looking through prisms. I. Focal olivocerebellar lesions impair adaptation. Brain. 1996; 119: 1183–1198. PMID: <u>8813282</u>
- Smith MA, Shadmehr R. Intact ability to learn internal models of arm dynamics in Huntington's disease but not cerebellar degeneration. J Neurophysiol. 2005; 93: 2809–2821. PMID: <u>15625094</u>
- Rabe K, Livne O, Gizewski ER, Aurich V, Beck A, Timmann D, et al. Adaptation to visuomotor rotation and force field perturbation is correlated to different brain areas in patients with cerebellar degeneration. J Neurophysiol. 2009; 101: 1961–1971. doi: <u>10.1152/jn.91069.2008</u> PMID: <u>19176608</u>
- Thach WT, Goodkin HP, Keating JG. The cerebellum and the adaptive coordination of movement. Annu Rev Neurosci. 1992; 15: 403–442. PMID: <u>1575449</u>
- Norris SA, Hathaway EN, Taylor JA, Thach WT. Cerebellar inactivation impairs memory of learned prism gaze-reach calibrations. J Neurophysiol. 2011; 105: 2248–2259. doi: <u>10.1152/jn.01009.2010</u> PMID: <u>21389311</u>
- Alexis B, Pulst S- M. Spinocerebellar degenerations: the ataxias and spastic paraplegias. Philadelphia: Butterworth-Heinemann; 2007.
- Sato N, Amino T, Kobayashi K, Asakawa S, Ishiguro T, Tsunemi T, et al. Spinocerebellar ataxia type 31 is associated with "inserted" penta-nucleotide repeats containing (TGGAA). Am J Hum Genet. 2009; 85: 544–557. doi: <u>10.1016/j.ajhg.2009.09.019</u> PMID: <u>19878914</u>
- Kobayashi H, Abe K, Matsuura T, Ikeda Y, Hitomi T, Akechi Y, et al. Expansion of intronic GGCCTG hexanucleotide repeat in NOP56 causes SCA36, a type of spinocerebellar ataxia accompanied by motor neuron involvement. Am J Hum Genet. 2011; 89: 121–130. doi: <u>10.1016/j.ajhg.2011.05.015</u> PMID: <u>21683323</u>
- Brusse E, Maat-Kievit JA, van Swieten JC. Diagnosis and management of early- and late-onset cerebellar ataxia. Clin Genet. 2007; 71: 12–24. PMID: <u>17204042</u>

- 22. Manto M, Marmolino D. Cerebellar ataxias. Curr Opin Neurol. 2009; 22: 419–429. doi: <u>10.1097/WCO.</u> <u>0b013e32832b9897</u> PMID: <u>19421057</u>
- Gilman S, Wenning GK, Low PA, Brooks DJ, Mathias CJ, Trojanowski JQ, et al. Second consensus statement on the diagnosis of multiple system atrophy. Neurology. 2008; 71: 670–676. doi: <u>10.1212/</u> 01.wnl.0000324625.00404.15 PMID: <u>18725592</u>
- Ishikawa K, Watanabe M, Yoshizawa K, Fujita T, Iwamoto H, Yoshizawa T, et al. Clinical, neuropathological, and molecular study in two families with spinocerebellar ataxia type 6 (SCA6). J Neurol Neurosurg Psychiatry. 1999; 67: 86–89. PMID: <u>10369828</u>
- Lowe J, Duyckaerts C, Frosch MP. Pathology of Degenerative Diseases of the Nervous System. In: Françoise G, Umberto DG, Poirier J, editors. Escourolle & Poirier Manual of Basic Neuropathology. 4th ed. Philadelphia: Butterworth-Heinemann; 2004. pp. 169–196.
- Owada K, Ishikawa K, Toru S, Ishida G, Gomyoda M, Tao O, et al. A clinical, genetic, and neuropathologic study in a family with 16q-linked ADCA type III. Neurology. 2005; 65: 629–632. PMID: <u>16116133</u>
- Yamada M, Sato T, Tsuji S, Takahashi H. CAG repeat disorder models and human neuropathology: similarities and differences. Acta Neuropathol. 2008; 115: 71–86. PMID: <u>17786457</u>
- Ikeda Y, Ohta Y, Kobayashi H, Okamoto M, Takamatsu K, Ota T, et al. Clinical features of SCA36: a novel spinocerebellar ataxia with motor neuron involvement (Asidan). Neurology. 2012; 79: 333–341. doi: <u>10.1212/WNL.0b013e318260436f</u> PMID: <u>22744658</u>
- Seidel K, Siswanto S, Brunt ER, den Dunnen W, Korf HW, Rüb U. Brain pathology of spinocerebellar ataxias. Acta Neuropathol. 2012; 124: 1–21. doi: <u>10.1007/s00401-012-1000-x</u> PMID: <u>22684686</u>
- Schmitz-Hubsch T, du Montcel ST, Baliko L, Berciano J, Boesch S, Depondt C, et al. Scale for the assessment and rating of ataxia: development of a new clinical scale. Neurology. 2006; 66: 1717–1720. PMID: <u>16769946</u>
- Swets JA. ROC analysis applied to the evaluation of medical imaging techniques. Invest Radiol. 1979; 14: 109–121. PMID: <u>478799</u>
- Lalkhen AG, McCluskey A. Clinical tests: sensitivity and specificity. Continuing Education in Anaesthesia, Critical Care & Pain. 2008; 8: 221–223.
- Young IT. Proof without prejudice: use of the Kolmogorov-Smirnov test for the analysis of histograms from flow systems and other sources. J Histochem Cytochem. 1977; 25: 935–941. PMID: 894009
- 34. Ansari AR, Bradley RA. Rank-sum tests for dispersions. Ann Math Stat. 1960; 31: 1174–1189.
- DeLong ER, DeLong DM, Clarke-Pearson DL. Comparing the areas under two or more correlated receiver operating characteristic curves: a nonparametric approach. Biometrics. 1988; 44: 837–845. PMID: 3203132
- Akobeng AK. Understanding diagnostic tests 3: Receiver operating characteristic curves. Acta Paediatr. 2007; 96: 644–647. PMID: 17376185
- Watanabe H, Saito Y, Terao S, Ando T, Kachi T, Mukai E, et al. Progression and prognosis in multiple system atrophy: an analysis of 230 Japanese patients. Brain. 2002; 125: 1070–1083. PMID: <u>11960896</u>
- Geser F, Wenning GK, Seppi K, Stampfer-Kountchev M, Scherfler C, Sawires M, et al. Progression of multiple system atrophy (MSA): a prospective natural history study by the European MSA Study Group (EMSA SG). Mov Disord. 2006; 21: 179–186. PMID: <u>16161136</u>
- Schmitz-Hubsch T, Fimmers R, Rakowicz M, Rola R, Zdzienicka E, Fancellu R, et al. Responsiveness of different rating instruments in spinocerebellar ataxia patients. Neurology. 2010; 74: 678–684. doi: 10.1212/WNL.0b013e3181d1a6c9 PMID: 20177122
- Jacobi H, Bauer P, Giunti P, Labrum R, Sweeney MG, Charles P, et al. The natural history of spinocerebellar ataxia type 1, 2, 3, and 6: a 2-year follow-up study. Neurology. 2011; 77: 1035–1041. doi: <u>10.</u> 1212/WNL.0b013e31822e7ca0 PMID: 21832228
- 41. Fernandez-Ruiz J, Diaz R. Prism adaptation and aftereffect: specifying the properties of a procedural memory system. Learn Mem. 1999; 6: 47–53. PMID: 10355523
- Block HJ, Bastian AJ. Cerebellar involvement in motor but not sensory adaptation. Neuropsychologia. 2012; 50: 1766–1775. doi: <u>10.1016/j.neuropsychologia.2012.03.034</u> PMID: <u>22554563</u>
- 43. Gutierrez-Garralda JM, Moreno-Briseno P, Boll MC, Morgado-Valle C, Campos-Romo A, Diaz R, et al. The effect of Parkinson's disease and Huntington's disease on human visuomotor learning. Eur J Neurosci. 2013; 38: 2933–2940. doi: <u>10.1111/ejn.12288</u> PMID: <u>23802680</u>
- Redding GM, Wallace B. Adaptive spatial alignment and strategic perceptual-motor control. J Exp Psychol Hum Percept Perform. 1996; 22: 379–394. PMID: 8934851
- Redding GM, Rossetti Y, Wallace B. Applications of prism adaptation: a tutorial in theory and method. Neurosci Biobehav Rev. 2005; 29: 431–444. PMID: <u>15820548</u>

- Clower DM, Hoffman JM, Votaw JR, Faber TL, Woods RP, Alexander GE. Role of posterior parietal cortex in the recalibration of visually guided reaching. Nature. 1996; 383: 618–621. PMID: 8857536
- Danckert J, Ferber S, Goodale MA. Direct effects of prismatic lenses on visuomotor control: an eventrelated functional MRI study. Eur J Neurosci. 2008; 28: 1696–1704. doi: <u>10.1111/j.1460-9568.2008.</u> <u>06460.x PMID: 18973586</u>
- Luaute J, Schwartz S, Rossetti Y, Spiridon M, Rode G, Boisson D, et al. Dynamic changes in brain activity during prism adaptation. J Neurosci. 2009; 29: 169–178. doi: <u>10.1523/JNEUROSCI.3054-08.</u> <u>2009</u> PMID: <u>19129395</u>
- Chapman HL, Eramudugolla R, Gavrilescu M, Strudwick MW, Loftus A, Cunnington R, et al. Neural mechanisms underlying spatial realignment during adaptation to optical wedge prisms. Neuropsychologia. 2010; 48: 2595–2601. doi: <u>10.1016/j.neuropsychologia.2010.05.006</u> PMID: <u>20457170</u>
- Nagao S, Honda T, Yamazaki T. Transfer of memory trace of cerebellum-dependent motor learning in human prism adaptation: A model study. Neural Netw. 2013; 47: 72–80. doi: <u>10.1016/j.neunet.2013</u>. <u>01.017</u> PMID: 23462699
- Baizer JS, Kralj-Hans I, Glickstein M. Cerebellar lesions and prism adaptation in macaque monkeys. J Neurophysiol. 1999; 81: 1960–1965. PMID: <u>10200230</u>
- Kitazawa S, Kimura T, Yin PB. Cerebellar complex spikes encode both destinations and errors in arm movements. Nature. 1998; 392: 494–497. PMID: <u>9548253</u>
- Donchin O, Rabe K, Diedrichsen J, Lally N, Schoch B, Gizewski ER, et al. Cerebellar regions involved in adaptation to force field and visuomotor perturbation. J Neurophysiol. 2012; 107: 134–147. doi: <u>10.</u> <u>1152/jn.00007.2011</u> PMID: <u>21975446</u>
- Burciu RG, Reinold J, Rabe K, Wondzinski E, Siebler M, Müller O, et al. Structural correlates of motor adaptation deficits in patients with acute focal lesions of the cerebellum. Exp Brain Res. 2014; 232: 2847–2857. doi: <u>10.1007/s00221-014-3956-3</u> PMID: <u>24798401</u>
- 55. Küper M, Wunnemann MJ, Thurling M, Stefanescu RM, Maderwald S, Elles HG, et al. Activation of the cerebellar cortex and the dentate nucleus in a prism adaptation fMRI study. Hum Brain Mapp. 2014; 35: 1574–1586. doi: 10.1002/hbm.22274 PMID: 23568448
- Barash S, Melikyan A, Sivakov A, Zhang M, Glickstein M, Their P. Saccadic dysmetria and adaptation after lesions of the cerebellar cortex. J Neurosci. 1999; 19: 10931–10939. PMID: 10594074
- Ohki M, Kitazawa H, Hiramatsu T, Kaga K, Kitamura T, Yamada J, et al. Role of primate cerebellar hemisphere in voluntary eye movement control revealed by lesion effects. J Neurophysiol. 2009; 101: 934–947. doi: 10.1152/jn.90440.2009 PMID: 19196922
- Wolpert DM, Kawato M. Multiple paired forward and inverse models for motor control. Neural Netw. 1998; 11: 1317–1329. PMID: <u>12662752</u>
- Ilg W, Schatton C, Schicks J, Giese MA, Schols L, Synofzik M. Video game-based coordinative training improves ataxia in children with degenerative ataxia. Neurology. 2012; 79: 2056–2060. doi: <u>10.1212/</u> <u>WNL.0b013e3182749e67</u> PMID: <u>23115212</u>
- Raz N, Lindenberger U, Rodrigue KM, Kennedy KM, Head D, Williamson A, et al. Regional brain changes in aging healthy adults: general trends, individual differences and modifiers. Cereb Cortex. 2005; 15: 1676–1689. PMID: 15703252
- 61. Zhang C, Zhu Q, Hua T. Aging of cerebellar Purkinje cells. Cell Tissue Res. 2010; 341: 341–347. doi: 10.1007/s00441-010-1016-2 PMID: 20652318
- **62.** Solomon PR, Pomerleau D, Bennett L, James J, Morse DL. Acquisition of the classically conditioned eyeblink response in humans over the life span. Psychol Aging. 1989; 4: 34–41. PMID: <u>2803610</u>
- Durkin M, Prescott L, Furchtgott E, Cantor J, Powell DA. Concomitant eyeblink and heart rate classical conditioning in young, middle-aged, and elderly human subjects. Psychol Aging. 1993; 8: 571–581. PMID: 8292285
- Woodruff-Pak DS, Jaeger ME. Predictors of eyeblink classical conditioning over the adult age span. Psychol Aging. 1998; 13: 193–205. PMID: <u>9640581</u>
- Thieme A, Thurling M, Galuba J, Burciu RG, Göricke S, Beck A, et al. Storage of a naturally acquired conditioned response is impaired in patients with cerebellar degeneration. Brain. 2013; 136: 2063–2076. doi: <u>10.1093/brain/awt107</u> PMID: <u>23729474</u>
- Fernández-Ruiz J, Hall C, Vergara P, Díaz R. Prism adaptation in normal aging: slower adaptation rate and larger aftereffect. Brain Res Cogn Brain Res. 2009; 9: 223–226.
- 67. King BR, Fogel SM, Albouy G, Doyon J. Neural correlates of the age-related changes in motor sequence learning and motor adaptation in older adults. Front Hum Neurosci. 2013; 7: 142. doi: <u>10.3389/</u> <u>fnhum.2013.00142</u> PMID: <u>23616757</u>

- Leiner HC, Leiner AL, Dow RS. Does the cerebellum contribute to mental skills? Behav Neurosci. 1986; 100: 443–454. PMID: <u>3741598</u>
- Raichle ME, Fiez JA, Videen TO, MacLeod AM, Pardo JV, Fox PT, et al. Practice-related changes in human brain functional anatomy during nonmotor learning. Cereb Cortex. 1994; 4: 8–26. PMID: 8180494
- Ackermann H. Cerebellar contributions to speech production and speech perception: psycholinguistic and neurobiological perspectives. Trends Neurosci. 2008; 31: 265–272. doi: <u>10.1016/j.tins.2008.02.</u> <u>011</u> PMID: <u>18471906</u>
- Stoodley CJ, Schmahmann JD. Evidence for topographic organization in the cerebellum of motor control versus cognitive and affective processing. Cortex. 2010; 46: 831–844. doi: <u>10.1016/j.cortex.2009</u>. <u>11.008</u> PMID: <u>20152963</u>
- Ito M. Control of mental activities by internal models in the cerebellum. Nat Rev Neurosci. 2008; 9: 304–313. doi: 10.1038/nrn2332 PMID: 18319727