E ects of daily training amount on visual motion perceptual learning

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Perceptual learning has been widely used to study the plasticity of the visual system in adults. Owing to the belief that practice makes perfect, perceptual learning protocols usually require subjects to practice a task thousands of times over days, even weeks. However, we know very little about the relationship between training amount and behavioral improvement. Here, four groups of subjects underwent motion direction discrimination training over 8 days with 40, 120, 360, or 1080 trials per day. Surprisingly, di erent daily training amounts induced similar improvement across the four groups, and the similarity lasted for at least 2 weeks. Moreover, the group with 40 training trials per day showed more learning transfer from the trained direction to the untrained directions than the group with 1080 training trials per day immediately after training and 2 weeks later. These ndings suggest that perceptual learning of motion direction discrimination is not always dependent on the daily training amount and less training leads to more transfer.

Introduction

The human brain can achieve long-term improvement in perceptual sensitivity as a result of learning (Fahle & Poggio, 2002). A prevailing view on this improvement is that "practice makes perfect," implying that tens of thousands of trials of training over days or weeks are necessary to induce substantial improvement in performance (Aberg et al., 2009; Banai & Lavner, 2014; Censor, Sagi, & Cohen, 2012; Chung, Levi, & Li, 2006; Husk, Bennett, & Sekuler, 2007; Sigman & Gilbert, 2000). However, several recent studies showed that a small amount of training was su cient to induce perceptual learning (Amar-Halpert et al., 2017; Hussain, Sekuler, & Bennett, 2009; Molloy et al., 2012). Hussain et al. (2009) examined the amount of practice needed to improve performance on texture and face identi cation. In a texture identi cation task, they found that 105 trials of practice on the rst day were required to enhance performance relative to the control group at the start of testing on the second day. In a face identi cation task, even only 21 trials of practice could enhance performance relative to the control group (Hussain et al., 2009). In a recent study

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on texture discrimination learning (Amar-Halpert et al., 2017), participants underwent a practice for 252 trials on the rst day, and then they returned for 3 daily sessions with only ve near-threshold trials per session. Discrimination thresholds were measured on the rst day and the fth day. Intriguingly, such short training resulted in a remarkable learning e ect. Based on this nding, Amar-Halpert and colleagues proposed that learning was due to a memory reactivation mechanism.

It has been shown that training beyond a certain amount could not further bene t learning (Karni & Sagi, 1993; Savion-Lemieux, T., & Penhune, V. B., 2005). In a temporal-interval discrimination task, Wright and Sabin (2007) trained subjects for either 360 or 900 trials per day for 6 days. Signi cant learning occurred with both 360 and 900 training trials per day, and 900 training trials per day did not induce greater improvement relative to 360 training trials. Likewise, similar e ects were also observed with a mirror-reading letter task (Ofen-Noy, Dudai, & Karni, 2003), a visual texture discrimination task (Karni & Sagi, 1993), and an auditory identi cation task (Roth, 2005). Notably, overtraining could even be detrimental to the learning e ect already acquired (Ashley & Pearson, 2012; Censor, Karni, & Sagi, 2006; Mednick et al., 2002; Mednick, Arman, & Boynton, 2005; Ofen, Moran, & Sagi, 2007). Mednick et al. (2005) measured the performance on a texture discrimination task in three 1-hour sessions and found that the performance deteriorated steadily both within and across the rst two sessions. Because repeated within-day testing led to a retinotopically speci c decrease in performance, such perceptual deterioration is not simply due to general fatigue or boredom. Therefore, intensive training might lead to limited behavior improvement.

In this study, we aimed to investigate the relationship between daily training amount and behavioral improvement—how does the daily training amount modulate the magnitude and speci city of the perceptual learning e ect with a motion direction discrimination task? We were also interested in how long the modulation e ects could persist. Participants were trained for 40, 120, 360, or 1080 trials per day with a visual motion direction discrimination task. Threshold measurements were conducted before, one day after, and two weeks after eight training days at the trained direction and the untrained directions (30°, 60°, and 90° away from the trained direction).

Methods

Subjects

Fifty-nine subjects (21 males) participated in the study. Their ages ranged from 18 to 28. All subjects

were naïve to the purpose of the study and had never participated in any perceptual learning experiment before. They were right-handed with reported normal or corrected-to-normal vision and had no known neurological or visual disorders. They gave written, informed consent in accordance with the procedures and protocols approved by the human subject review committee of Peking University. This study adhered to the Declaration of Helsinki.

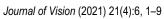
Stimuli and apparatus

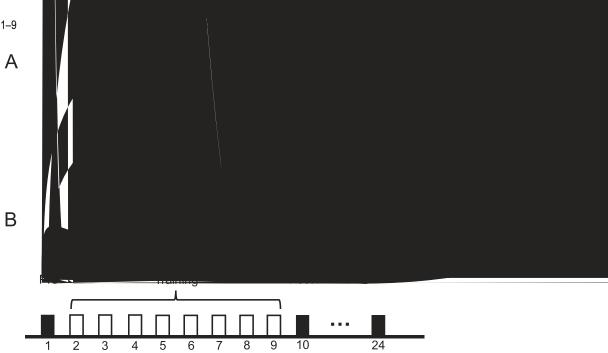
Similar to our previous study (Chen et al., 2015), visual stimuli were random-dot kinematograms (RDKs) with 100% coherence (Figure 1A). All dots in a RDK moved in the same direction (luminance: 3.76 cd/m^2 ; diameter: 0.1° ; speed: 10° /sec). At any one moment, 400 dots were visible within an 8° circular aperture. The dots were presented against a gray background (luminance: 19.8 cd/m^2). The visual stimuli were presented on an IIYAMA HM204DT 22-in monitor, with a spatial resolution of 1024×768 and a refresh rate of 60 Hz. Subjects viewed the stimuli from a distance of 60 cm. Their head was stabilized using a head and chin rest.

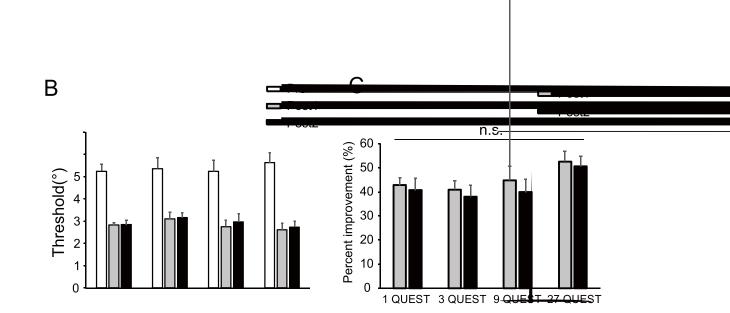
Designs

Fifty-nine subjects were randomly assigned into four training groups (n = 12, 11, 12, and 12), respectively and a control group (n = 12). Four training groups underwent four phases (Figure 1B): pretraining test (Pre), motion direction discrimination training, post-training test 1 (Post1), and post-training test 2 (Post2). The control group only underwent Pre, Post1, and Post2. Pre and Post1 took place on the days immediately before and after training, and Post2 took place 2 weeks after training.

During the training phase, each subject underwent eight daily training sessions to perform a motion direction discrimination task at a direction of θ , which was chosen randomly from eight directions: 22.5°, 67.5°, 112.5°, 157.5°, 202.5°, 247.5°, 292.5°, and 337.5° (0° was the rightward direction) at the beginning and was xed for all the sessions. For the four training groups, a daily training session consisted of 1, 3, 9, and 27 QUEST (Watson & Pelli, 1983) staircases of 40 trials, corresponding with 40, 120, 360, or 1080 trials, respectively. In a trial, two RDKs with motion directions of $\theta + \Delta \theta/2$ and $\theta - \Delta \theta/2$ were presented successively for 200 ms each and were separated by a 600-ms blank interval. The temporal order of these two RDKs was randomized. Subjects were asked to make a two-alternative forced-choice judgment of the direction of the second RDK relative to the rst one (clockwise or counterclockwise). Informative feedback was provided









signi cant, (3, 43) = 2.383, < 0.1. The main e ect of test was not signi cant, (1, 43) = 1.035, = 0.315, and the interaction between test and training amount was not signi cant either, (3, 43) = 0.242, = 0.867. Then, we made comparisons between training amount conditions at Post1 and Post2. Planned -tests showed that the group receiving 27 QUEST staircases training per day exhibited stronger speci city than the group receiving 1 QUEST staircase training per day at Post1, (22) = -2.779, < 0.01, and Post2, (22) = -1.929, < 0.05. Our results demonstrated that less training led to less speci city or more transfer, and the characteristic lasted for at least two weeks.

Test-retest e ect

It remains unclear to what extent the performance improvements in the trained and untrained directions are due to a test-retest e ect occurring at Pre, Post1, and Post2. To quantify the test-retest e ect, we collected data from a control group, which only underwent Pre, Post1, and Post2. Relative to Pre, the percent improvements averaged across the four directions were 3.095%, one-sample -test (47) = 0.656, = 0.515, at Post1 and 18.116%, (47) = 4.401, < 0.001, at Post2. Notably, the improvements at the untrained direction at Post2 were largely due to the test-retest e ect.

Discussion

In this study, we examined the relationship between daily training amount and two visual learning outcomes: the improvement at the trained feature, and the transfer e ect to the untrained features. We found that (1) a small daily training amount of 40 trials was su cient to induce a signi cant behavioral improvement; no further improvement was observed in groups with larger daily training amounts and (2) the group with the smallest daily training amount exhibited the largest transfer e ect. These e ects persisted up to 2 weeks after training. These ndings shed light on determining the training amount in practical application and help to better understand the role of training amount in some key ideas such as consolidation-reactivation, transfer, and stabilization in learning.

Traditional perceptual learning studies have hundreds or even thousands of training trials per day. Here we show that only 40 trials of daily practice were enough to trigger an improvement comparable to 1080 trials of daily practice. This nding supports a memory-reactivation framework for perceptual learning. Throughout multiple training sessions, the learning e ects gained from individual training sessions transform from short- to long-term memory via a

process named consolidation (McGaugh, 2000; Wright & Sabin, 2007). After the initial memory consolidation has been established, brief reactivations may trigger reconsolidation-like processes to improve the existing perceptual memory (Amar-Halpert et al., 2017; Bang et al., 2018). Amar-Halpert et al. (2017) have shown that decreasing the standard training amount (from 252 trials to 5 trials) on day 2 to day 4 led to no change in the overall learning e ect. However, further decreasing the training from a standard to a small amount on day 1 led to a signi cant decrease in the overall learning e ect. In the present study, all the subjects underwent a pretest of 400 trials for each condition, which established the new memory. After that, 40 trials of daily training were su cient to reactivate the memory for reconsolidation. Our results indicate that motion perceptual learning, as a speci c kind of procedural memory, might function via a consolidation-reactivation mechanism.

In contrast, overtraining might be detrimental to perceptual learning, which was referred to as perceptual deterioration (Mednick et al., 2002, 2005). Induced by too much training, perceptual deterioration is possibly due to sensory adaptation (Censor et al., 2006), strengthening less e cient neuronal connections and accumulating noise in the brain network (Censor & Sagi, 2008), or changes in the ability for attention to selectively enhance the responses of low-level sensory neurons (Mednick et al., 2005). In our study, perceptual deterioration might counteract the learning e ect after a certain amount of practice, leading to saturated overall learning e ects. The saturation of learning has also been observed in other visual, auditory, and motor learning studies (Amar-Halpert et al., 2017; Fox et al., 2016; Molloy et al., 2012; Wright & Sabin, 2007). These evidence suggests that independence of overall learning e ect on daily training beyond a certain amount may be a general principle underlying skill learning.

Interestingly, we found that an increase in the daily training amount increased speci city. In other words, prolonged training decrease transfer. This e ect may seem counterintuitive. As subjects become more pro cient at a practiced task, we logically expect more transfer. However, many visual perceptual learning studies have reported that prolonged training increased the speci city of learning, with less transfer to untrained visual orientation or retinal locations (Hung & Seitz, 2014; Hussain et al., 2012; Jeter et al., **2010**). The daily training amount may determine the degree of transfer together with another key factor, namely, stimuli variation. According to an "over tting" account, increasing the training amount increases the chance of over tting the neural system, which limits transfer. This phenomenon is likely to occur when the training data has a small variation, which may not well represent the feature space. In contrast, for data with a large variation that represents a broader feature space, increasing the training trials may not lead to over tting (Lengyel & Fiser, 2019). In the present study, stimuli variation was introduced at the pretest and post-test stages, and was kept constant across the groups. This test gave subjects a su cient amount of training (400 trials for each direction) over a relatively broad feature space (four motion direction with 0°, 30°, 60°, and 90° o set from the trained direction). During 8 training days, subjects received training on a speci ed motion direction with a near-threshold variation. Note that we used continuous staircases for each training day; except for the rst staircase, each staircase started with the threshold derived from the preceding staircase. Our training protocol resembles the single prolonged staircase used in Hung and Seitz (2014) and other perceptual learning studies (Jehee et al., 2012; Schoups

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