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# 1 Anticipatory synergy adjustments reflect individual 2 performance of feedforward force control

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14

## 15 **Highlights**

16 • We tested whether anticipatory synergy adjustments are related to feedforward control.

17 • We observed significant ASAs before a quick change of the total finger force.

18 • The ASA properties were correlated with the error of force pulse.

19 • Almost all subjects showed an increase of the variance that affects the total force.

20 • Multi-digit synergy is weakened to reduce future error based on prediction error.

21

## 22 **Abstract**

1 We grasp and dexterously manipulate an object through multi-digit synergy. In the framework  
2 of the uncontrolled manifold (UCM) hypothesis, multi-digit synergy is defined as the  
3 coordinated control mechanism of fingers to stabilize variable important for task success, e.g.,  
4 total force. Previous studies reported anticipatory synergy adjustments (ASAs) that  
5 correspond to a drop of the synergy index before a quick change of the total force. The  
6 present study compared ASA's properties with individual performances of feedforward force  
7 control to investigate a relationship of those. Subjects performed a total finger force  
8 production task that consisted of a phase in which subjects tracked target line with visual  
9 information and a phase in which subjects produced total force pulse without visual  
10 information. We quantified their multi-digit synergy through UCM analysis and observed  
11 significant ASAs before producing total force pulse. The time of the ASA initiation and the  
12 magnitude of the drop of the synergy index were significantly correlated with the error of  
13 force pulse, but not with the tracking error. Almost all subjects showed a significant increase  
14 of the variance that affected the total force. Our study directly showed that ASA reflects the  
15 individual performance of feedforward force control independently of target-tracking  
16 performance and suggests that the multi-digit synergy was weakened to adjust the multi-digit  
17 movements based on a prediction error so as to reduce the future error.

18

## 19 **Keywords:**

20 synergy, finger, anticipatory synergy adjustments, feedback control, feedforward control,  
21 uncontrolled manifold analysis

22

# 1. Introduction

Humans grasp and manipulate objects by dexterously coordinating their multi-digit, especially the four fingers that oppose the thumb: the index, middle, ring, and little fingers. These four fingers produce a total finger force that is balanced by the thumb force to stably grasp objects. Multi-digit coordination is a mechanism that stabilizes the total force of fingers through the compensation of the variability of some fingers by other fingers. This point of view of coordination is based on the “principle of abundance” [1] in which the human central nervous system (CNS) finds not a unique optimal solution but a solution manifold to solve Bernstein’s redundancy problem [2]. Neurophysiological mechanisms generating multi-digit coordination are collectively called multi-digit synergy.

Uncontrolled manifold (UCM) analysis has been proposed [3-5] and used to evaluate and quantify this multi-digit synergy [6-11]. In the framework of UCM analysis, the variance of coordinated multi-elements across trials is projected onto two orthogonal subspaces: one consisting of a subset of multi-elements that does not affect a performance variable important for task success (UCM) and another that directly affects the performance variable (orthogonal to the UCM). The two projected variance elements are called UCM and ORT components, respectively. Using these two variance components, an index of synergy is defined to quantify a degree of coordination. UCM analysis, which has been used for multi-digit synergy and also the motor synergies of various movements, e.g., upper limb movements [12,13], whole body movements [14,15], and walking [16,17], has revealed a coordinated control mechanism of CNS.

When we voluntarily produce a finger force with one finger, the other fingers produce involuntary forces. The non-independence of individual fingers is called “enslaving”

1 [18], which is due to various factors, e.g., a biomechanical property of hand musculotendon  
2 and a neurological property of overlapping finger representations in the motor cortex. A  
3 motor command for individual fingers without the enslaving effect is called the “finger mode.”  
4 A previous study using UCM analysis suggested that CNS controlled the finger modes by  
5 multi-digit coordination to stabilize the total force and the total moment of force [19]. In this  
6 study, we considered the coordination among the finger modes, i.e., finger mode synergy, to  
7 be multi-digit synergy.

8           The synergy index dropped when the performance variable quickly changed at  
9 self-paced timing [8, 20]. Moreover, the initiation time of the synergy drop was faster than the  
10 change’s initiation time in the performance variable. This phenomenon is called an  
11 anticipatory synergy adjustment (ASA), which reflects the pre-adjustments of a synergy for  
12 quick changes of the performance variable. Moreover, ASA’s time of initiation of patients  
13 with motor impairment was slower than the control group [21, 22], which implies that ASA is  
14 an index related to motor control ability. However, since the relationship between ASA  
15 properties and individual performance of motor control was not examined, ASA’s functional  
16 role remains unclear. Previous studies concluded that ASA was observed before the voluntary  
17 quick change of the performance variable [8] and was affected by cerebellar disorders [21].  
18 Based on these studies, we hypothesized that ASA is related to individual performance of  
19 feedforward force control.

20           To test this hypothesis, in this paper, we examine whether ASA properties (its  
21 initiation time and the magnitude of the drop of the synergy index) correlate with individual  
22 performance of feedforward force control. To observe an ASA phenomenon and to evaluate  
23 performance of feedforward force control, we used a quick force pulse production paradigm

1 [8, 21, 22]. The quick force pulse production task consisting of two phases: a target-tracking  
2 phase and a force pulse production phase. In the conventional quick force pulse production  
3 task, subjects produced force pulse at self-paced timing and with visual information. In this  
4 study, we changed the force pulse production phase into a phase in which subjects produced  
5 force pulse at a specific given time point and without visual information to more strongly  
6 require subjects to perform feedforward control. Since the force pulse production with above  
7 conditions is ballistic and quite fast movements, we considered that the force pulse production  
8 task is mainly performed by feedforward control, and evaluated the performance of  
9 feedforward force control by an error from target force. We assumed that the force pulse  
10 production contains a part of individual target-tracking ability, because the target of force  
11 pulse was given by visual information. Therefore, we also check the relationship between the  
12 ASA properties and individual target-tracking performance, i.e., tracking-error during steady  
13 state of the target-tracking phase. The ASA is occurred when the UCM component decreases  
14 and/or the ORT component increases. Therefore, we also investigate the changes in the UCM  
15 and ORT components from ASA's time of initiation to the time of the change's initiation in  
16 the total force. Finally, we discuss its functional role.

17

## 18 **2. Methods**

### 19 *2.1. Subjects*

20 Twenty healthy right-handed volunteers (19 males and 1 female) participated in our  
21 experiments. Their average age was 25.4 (22-42 years). The experiments were approved by  
22 the ethics committee at Advanced Telecommunication Research Institute International. All  
23 subjects received explanations about the experimental procedure and gave their written

1 informed consent.

2

### 3 2.2. Apparatus

4 Four custom-made force sensors (FSR 402, Interlink Electronics Inc., CA, USA) were used to  
5 measure the finger forces in the vertical direction (Fig. 1a). The circular contact surface of  
6 each sensor was covered with a rubber pad. The positions of the force sensors were adjusted  
7 in the horizontal plane to match the individual finger positions in which the subjects easily  
8 produced finger force. A cushion material was placed under the subject's palm. The subject's  
9 forearm was fixed to the device by a strap. The force signals were recorded using an AD/DA  
10 device (DAQ NI USB-6353, National Instruments, TX, USA) at a 600-Hz sampling rate. The  
11 visual information related to each task was displayed on a computer screen (Figs. 1b and 1c).

12

### 13 2.3. Task procedures

14 Subjects sat on a chair with their right hands fixed to the finger force measurement device.  
15 The measurement experiments consisted of three tasks: (1) a maximal voluntary contraction  
16 (MVC) force production task, (2) a single-finger ramp-tracking task, and (3) a quick force  
17 pulse production task. Before the experiments began, the experimenter demonstrated the  
18 actual experimental procedure by briefly performing all of the tasks.

19

20 1. MVC force production task: We measured the MVC force of the four fingers. The subjects  
21 pressed on the force sensors with four fingers and produced a maximal total force after a 3-s  
22 countdown. The total force was visually feedback by the height of the vertical bar. This task  
23 was repeated twice. We determined the MVC force as the highest value of the finger force.

1

2 2. Single-finger ramp-tracking task: Subjects tracked the force target template by producing  
3 an individual single-finger force (from the index to the little finger). The force target template  
4 and the produced finger force are displayed in Fig. 1b. The small filled circle was horizontally  
5 moved for 20 s at a constant speed. The height of the circle corresponded to the force of the  
6 tested finger. During the first 4 s, subjects kept 0 %MVC force of the tested finger (rest).  
7 Over the next 12 s, they gradually increased the finger force of the tested finger from 0 to  
8 40 %MVC. Finally, they kept 40 %MVC of the tested finger for 4 s and only produced finger  
9 force using the tested finger while keeping the rest of their fingers on the sensors.

10

11 3. Quick force pulse production task: The subjects tracked the force target template with  
12 visual information, and then, quickly produced a force pulse without visual information using  
13 all four fingers. The force target template and the produced total finger force are shown in Fig.  
14 1c. The small filled circle was horizontally moved for 8 s at a constant speed. The height of  
15 the circle corresponded to the total force of the four fingers. The circle disappeared at the “Go”  
16 line (vertical solid line) and remained invisible until after the force pulse was produced. The  
17 target force template consisted of a target-tracking phase (first 4 s) and a force pulse  
18 production phase (last 4 s). During the target-tracking phase, the subjects produced 5 %MVC  
19 of total force to track the target line. At the initiation of the force pulse production phase (at  
20 the “Go” line), they quickly produced a force pulse within the  $25 \pm 5$  %MVC target and  
21 immediately relaxed. During the force pulse production, no visual information of the  
22 produced total force was given. After relaxation, only the peak value of the force pulse was  
23 visually feedback. In previous studies using a similar paradigm [8, 21, 22], subjects produced



1 force pulses at a self-paced timing with visual information. In contrast, in the current study,  
 2 the force pulse was produced at the specific time point (“GO” line) and without visual  
 3 information to more strongly require subjects to perform feedforward control. We defined  
 4 successful trials as those in which subjects produced a force pulse within the  $25 \pm 5\%$  MVC  
 5 target. They used all four fingers to perform the task and repeated it until 30 successful trials  
 6 were achieved. They took a short break between trials to avoid fatigue.

7

#### 8 2.4. Data analysis

9 All of the measured force data were filtered with a second-order Butterworth low-pass filter  
 10 with a 10-Hz cutoff frequency. Using the force data in the single-finger ramp-tracking task,  
 11 we calculated enslaving matrix  $\mathbf{E}$  that reflects the unintentional finger force produced by the  
 12 untested fingers when a tested finger produced force. The finger force data during the middle  
 13 12 s (dynamic phase) were used to calculate the  $\mathbf{E}$  components by linear regression:

$$14 \quad F_{i,j} = f_i^0 + k_{i,j} \times F_{TOT,j}, \quad (1)$$

$$15 \quad \mathbf{E} = \begin{bmatrix} k_{I,I} & k_{I,M} & k_{I,R} & k_{I,L} \\ k_{M,I} & k_{M,M} & k_{M,R} & k_{M,L} \\ k_{R,I} & k_{R,M} & k_{R,R} & k_{R,L} \\ k_{L,I} & k_{L,M} & k_{L,R} & k_{L,L} \end{bmatrix}, \quad (2)$$

16 where subscripts  $i, j = \{I \text{ (index), } M \text{ (middle), } R \text{ (ring), } L \text{ (little)}\}$ , and  $j$  indicate the tested  
 17 fingers.  $F_{i,j}$ ,  $f_i^0$ , and  $F_{TOT,j}$  respectively denote the individual  $i$ -finger force, the residual of the  
 18 linear regression, and the total force. The enslaving index of  $j$ -finger  $EN_j$  was calculated as  
 19 follows:

$$20 \quad EN_j = \sum_j k_{i,j} / 3 \quad (i \neq j). \quad (3)$$

21 Using force data in the quick force pulse production task, we calculated the

1 performances of force control and the time profile of the index of the multi-digit synergy. We  
2 removed the outlier data (e.g., tracking failures in the feedback phase), and used data of  $28.3$   
3  $\pm 0.73$  (mean  $\pm$  SD) accepted trials for analysis. To remove an effect of trial-by-trial time  
4 directional variability of the change in the total force on the index of synergy, the time of the  
5 initiation of the change in the total force ( $t_0$ ) was defined as the time when the force's time  
6 derivative reached 5% of its peak value. All of the analyzed force data were aligned with  
7 respect to  $t_0$ . We evaluated the target-tracking performance by the mean value of the  
8 normalized error across the steady state of the target-tracking phase (from  $-600$  to  $-400$  ms  
9 with respect to  $t_0$ ) and the performance of feedforward force control by the normalized error  
10 when the peak of the total force appeared in the force pulse production phase. Since the finger  
11 force was affected by the signal dependent noise due to a neurophysiological property [23-25],  
12 we normalized the error as follows:

$$13 \quad \text{normalized error} = \left( \frac{F_{TOT} - F_d}{F_{TOT}} \right)^2, \quad (4)$$

14 where  $F_d$  indicates the target total force. Using UCM analysis [3], we quantitatively evaluated  
15 the motor synergy of the finger modes (Fig. 1d). Finger mode vector  $\mathbf{m}$  was calculated by  
16 finger force vector  $\mathbf{F}$  and enslaving matrix  $\mathbf{E}$  as  $\mathbf{m} = \mathbf{E}^{-1}\mathbf{F}$ . The relationship between total  
17 finger force  $F_{TOT}$  and finger mode vector  $\mathbf{m}$  was  $F_{TOT} = [1, 1, 1, 1] \mathbf{E}\mathbf{m}$ . Therefore, UCM was  
18 defined by the null space of the equation,  $[1, 1, 1, 1] \mathbf{E}$ . Basis vectors  $\boldsymbol{\varepsilon}$  span the null space,  
19 according to  $0 = [1, 1, 1, 1] \mathbf{E}\boldsymbol{\varepsilon}$ . Using basis vectors  $\boldsymbol{\varepsilon}$ , the variance of the finger modes in the  
20  $\mathbf{m}$  space across the trials was projected onto the direction along the UCM (UCM component:  
21  $V_{UCM}$ ) and orthogonal to it (ORT component:  $V_{ORT}$ ), for each time step. We defined the index  
22 of synergy to quantify the multi-digit synergy:

$$\Delta V(t) = \frac{V_{UCM}(t)/3 - V_{ORT}(t)/1}{V_{TOT}(t)/4}, \quad (5)$$

where  $V_{TOT}$  denotes the total variance. All variance components were normalized by the dimensions of the finger modes and the total finger force.  $\Delta V > 0$  indicates that the total finger force is controlled by the coordination of the four fingers. To statistically evaluate the index of synergy, we used a log-transformed index of synergy [26]:

$$\Delta V_z(t) = \log\left(\frac{\Delta V(t)+4}{4/3-\Delta V(t)}\right). \quad (6)$$

We defined the time of initiation of ASA ( $t_{ASA}$ ) as the time when  $\Delta V_z$  fell below its mean value during the steady state (from  $-600$  to  $-400$  ms with respect to  $t_0$ ) by more than two standard deviations. We also calculated the magnitude of the drop of the index of synergy ( $\Delta \Delta V_z = \Delta V_z(t_0) -$  (average value of  $\Delta V_z$  during steady state)) as well as the changes in the UCM component ( $V_{UCM}(t_0) -$  (average value of  $V_{UCM}$  during steady state)) and the ORT component ( $V_{ORT}(t_0) -$  (average value of  $\Delta V_{ORT}$  during steady state)) and the coefficients of the correlation between the properties of ASA ( $t_{ASA}$  and  $\Delta \Delta V_z$ ) and the performances of force control: the normalized error at a time when the peak of total force appeared and average value of it during steady state.

### 3. Results

The average performance of the multi-digit force production across all subjects is presented in Table 1. The index of the enslaving  $EN$  indicated that the ring and little fingers showed a relatively high enslaving effect. The time of the initiation of ASA ( $t_{ASA}$ ) was significantly earlier than the time of initiation of change in the total force ( $t_0$ ), which was tested by a one-sample  $t$ -test ( $P = 1.20 \times 10^{-4} < 0.01$ ,  $t_{(19)} = -4.82$ ). Moreover, the index of

1 synergy ( $\Delta V_z$ ) significantly dropped from  $t_{ASA}$  to  $t_0$  (one-sample  $t$ -test,  $P = 8.27 \times 10^{-7} < 0.01$ ,  
2  $t_{(19)} = -7.17$ ), indicating that the subjects showed significant ASAs before quick changes in  
3 their total finger force.

4 Figure 2 shows the time profiles of the index of synergy ( $\Delta V_z$ ) and the total finger  
5 force. During the steady state of the target-tracking phase (from  $-600$  to  $-400$  ms), the mean  
6 value of the index of synergy was significantly higher than the value of the uncoordinated  
7 index which is the value of index of synergy consisting of same value of UCM and ORT  
8 components (one-sample  $t$ -test,  $P = 3.48 \times 10^{-11} < 0.01$ ,  $t_{(19)} = 13.5$ ). This indicates that the  
9 total finger force was controlled by the coordination of the four fingers. During the force  
10 pulse production phase ( $t > t_0$ ), the index of synergy quickly dropped below the uncoordinated  
11 index. As mentioned above, significant ASA was observed.

12 Figure 3 shows the relationships between the properties of ASA and the  
13 performances of force control. The upper figures (Figs. 3a and 3b) show that the time of  
14 initiation of ASA ( $t_{ASA}$ ) and the magnitude of the drop of the index of synergy ( $\Delta \Delta V_z$ )  
15 significantly correlated with the performance of feedforward force control, i.e., the  
16 normalized error when a force peak appeared (coefficients of correlation for  $t_{ASA}$ :  $r = 0.52$ ,  $P =$   
17  $0.019 < 0.05$ ; for  $\Delta \Delta V_z$ :  $r = 0.55$ ,  $P = 0.012 < 0.05$ ). In contrast, the lower figures (Figs. 3c  
18 and 3d) show that the ASA properties were not correlated with the target-tracking  
19 performance, i.e., the average normalized error across the steady state of target-tracking phase  
20 (coefficients of correlation for  $t_{ASA}$ :  $r = -0.006$ ,  $P = 0.98$ ; for  $\Delta \Delta V_z$ :  $r = 0.044$ ,  $P = 0.85$ ).  
21 Moreover, a relationship between the time of initiation of ASA and the magnitude of the drop  
22 of the index of synergy showed positive correlation ( $r = 0.77$ ,  $P = 0.0001 < 0.05$ ). These  
23 results indicate that the ASA properties reflect the performance of feedforward force control

1 of individual subjects independently of the target-tracking performance.

2           When the index of synergy drops, one possibility is a decrease of the UCM  
3 component and/or an increase of the ORT component. We calculated the change in the UCM  
4 and ORT components from steady state to  $t_0$  (Fig. 4). Almost all subjects ( $n = 19$ ) increased  
5 the ORT component. In contrast, about half subjects ( $n = 9$ ) decreased the UCM component,  
6 but the other subjects increased the UCM component. These results indicate that change in the  
7 ORT component was robust across subjects, but change in the UCM component differed  
8 between individuals, when the ASA was occurred.

9

## 10 **4. Discussion**

11 In this study, we hypothesized that ASA is related to the performance of feedforward force  
12 control and directly compared ASA's properties and the error of force pulse production and  
13 the tracking error. To more strongly require subjects to perform feedforward control, we  
14 modified the visual feedback condition in the conventional quick force pulse production task  
15 and observed a significantly earlier initiation time of ASA than the change in the total force  
16 and a significant drop of the index of synergy (Fig. 2). Moreover, the normalized error related  
17 to the individual performance of feedforward force control significantly correlated with the  
18 individual time of the initiation of ASA and the magnitude of the drop of the index of synergy  
19 (Figs. 3a and 3b). In contrast, the normalized error, related to the individual target-tracking  
20 performance, was not significantly correlated with the ASA properties (Figs. 3c and 3d).  
21 These results indicate that the ASA index reflects the individual performance of feedforward  
22 force control independently of the target-tacking performance. Moreover, the ASA properties  
23 were positively correlated each other, i.e., the earlier timing of ASA, the larger magnitude of

1 the drop of index of synergy. This result implies that the speed of ASA was similar across  
2 subjects. Moreover, it was reasonable that the individual performance of feedforward force  
3 control correlated with both timing and magnitude of ASA. To the best of our knowledge, this  
4 is the first study to show the correlation between the individual properties of ASA and  
5 individual performances of feedforward force control across healthy participants.

6         According to the definition of the index of synergy, the ASA is occurred by  
7 decrease of the UCM component and/or increase of ORT component. In this study, the  
8 change in the ORT component was robust across subjects, but the change in the UCM  
9 component differed between individuals (Fig. 4). Since almost all subjects increased the ORT  
10 component, it is suggested that the CNS generally adopted a strategy in which the total force  
11 actively varied when the total force quickly changed without visual information, i.e., when  
12 feedforward control was performed. Weakening the stabilized synergy also seems to be  
13 required to quickly perform feedforward control. Such "weakened synergy" has been reported  
14 not only in multi-digit movements but also in walking [16], whole body movements [20], and  
15 dampening hand vibration while walking [27]. In this study, the stronger the weakened  
16 synergy is (earlier ASA initiation and the greater the magnitude of the drop of the index of  
17 synergy) the higher the performance of feedforward force control. When an individual  
18 performance of coordinated control is evaluated, both of the following are important: the  
19 synergy evaluation that stabilizes the performance variable and destabilizes the performance  
20 variable.

21         Finally, we discuss ASA's functional role. The present study showed that the higher  
22 the ASA performance is, the greater the performance of feedforward force control, i.e., the  
23 smaller normalized error. Therefore, the ASA phenomenon would reflect the pre-adjustment

1 of the multi-digit movements to accurately control the performance variable. Since a larger  
2 multi-digit pre-adjustment leads to better performance of feedforward force control,  
3 pre-adjustment of the multi-digit will reduce the output error. Next, we discuss the  
4 mechanism of the pre-adjustments. Since the finger force was adjusted before the force pulse  
5 production, the output error of the total force pulse was predicted. Recent computational  
6 neuroscience studies argued that CNS utilizes prediction error based on an internal model to  
7 body control [28, 29]. Since body control is affected by neurophysiological internal noise, the  
8 output movements are varied [23-25]. When the finger total force is controlled without visual  
9 information, CNS predicts the error of the total force based on an internal hand model and an  
10 internal state to reduce the future output error of the total force by an anticipatory adjustment  
11 of the multi-digit movements based on the prediction error. The ASA would reflect two kinds  
12 of purposes of the pre-adjustments. One is the purpose to destabilize the total force based on  
13 the prediction error so as to reduce future error, which would be reflected in the increase of  
14 the ORT components. The other is the purpose to control an initial state before force pulse  
15 production, i.e., to converge the specific balance of finger modes, which would be reflected in  
16 the decrease of UCM component. These two pre-adjustment of the multi-digit movements to  
17 reduce the future error is reflected in the both increase of the ORT component and decrease of  
18 the UCM component, dropping the index of synergy, i.e., ASA, suggesting that its functional  
19 role is the pre-adjustment of multi-digit movements based on prediction error to reduce future  
20 error. In this study, we only showed correlation between properties of ASA and  
21 individual performance of feedforward force control, and did not approach the  
22 causality. Therefore, important future work is to reveal the causal relationship  
23 between the ASA and feedforward control, and to approach the functional role of

1 the ASA.

2           In conclusion, we investigated relationship between ASA phenomenon and  
3 individual performance of feedforward force control. In a quick force pulse production task,  
4 the time of ASA's initiation and the amplitude of the drop of the index of synergy  
5 significantly correlated with individual performance of feedforward force control, i.e., the  
6 normalized error from the target total force at the feedforward control phase. Moreover,  
7 almost all subjects showed significant increase of the variance of the finger modes that  
8 directly affects the total force. These results indicate that ASA is an index that reflects  
9 individual performance of feedforward force control independently of individual  
10 target-tracking performance and suggest that the ASA reflects pre-adjustment of multi-digit  
11 movements based on prediction error to reduce future error.

12

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20

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# 1 Tables

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## 3 Table 1

4 Performance of multi-digit force production of all subjects. Means and standard deviations  
5 (SD) of the maximal voluntary contraction (MVC) forces, enslaving index (EN), time of  
6 initiation of anticipatory synergy adjustments (ASAs) ( $t_{ASA}$ ), and magnitude of drop of index  
7 of synergy ( $\Delta\Delta V_z$ ) are presented. Subscripts denote the following: *I*, index; *M*, middle; *R*, ring;  
8 *L*, little fingers.

	MVC (N)	EN <sub><i>I</i></sub>	EN <sub><i>M</i></sub>	EN <sub><i>R</i></sub>	EN <sub><i>L</i></sub>	$t_{ASA}$ (s)	$\Delta\Delta V_z$
Mean	72.6	0.0076	0.0157	0.0673	0.0850	-0.124	-0.580
SD	13.3	0.0191	0.0194	0.0571	0.0679	0.115	0.362

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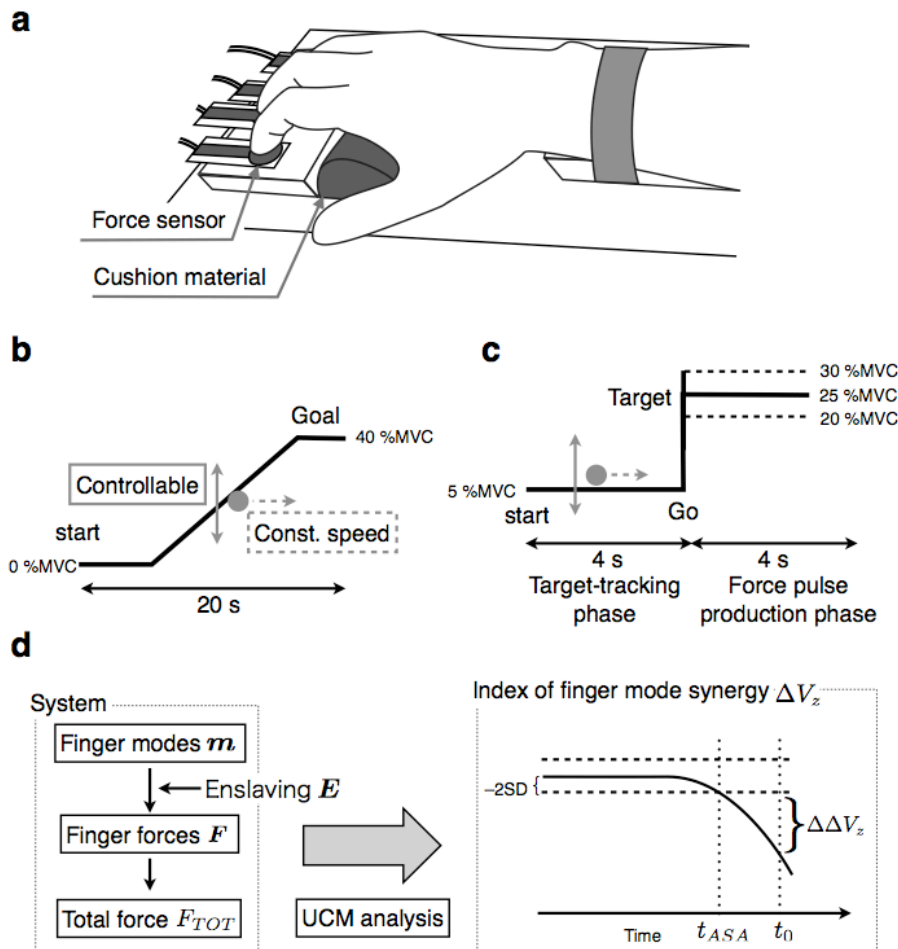
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## 4 Figures



5

6 **Fig. 1** Experimental setup and analysis method: (a) Subjects placed their fingers on four

7 custom-made force sensors and their palm on a cushion material. (b) Computer screen display

8 in single-finger ramp-tracking task. Gray circle was horizontally moved for 20 s with constant

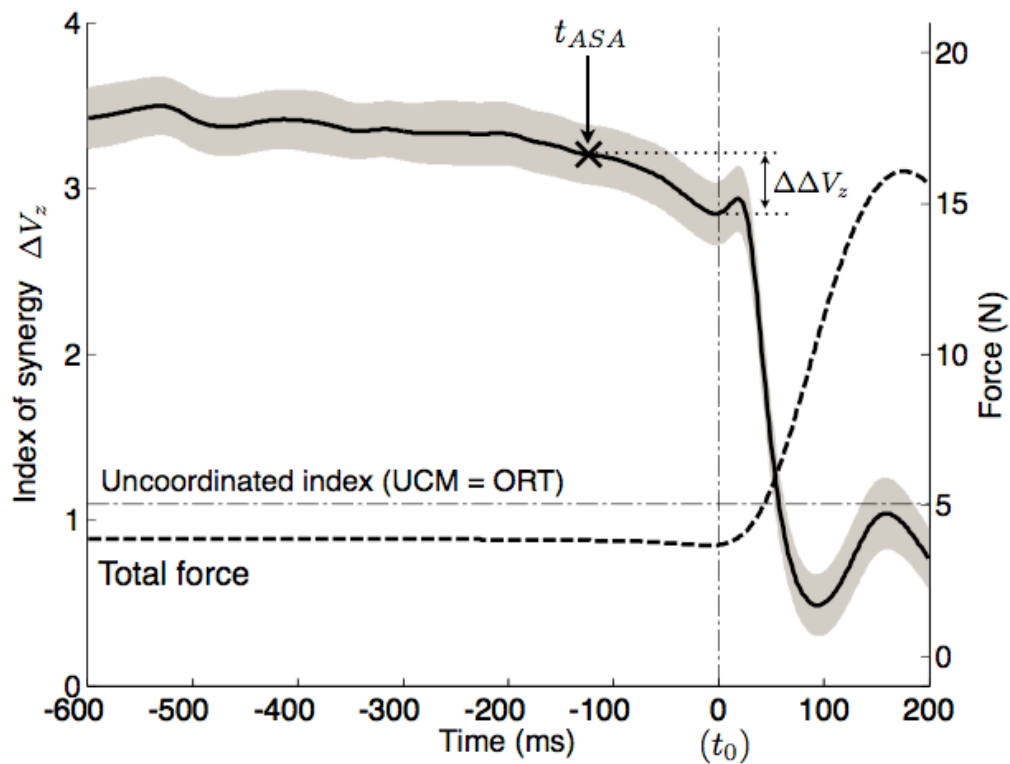
9 speed. Circle's height corresponded to finger force of tested finger. (c) Screen in quick force

10 pulse production task. Circle was horizontally moved for 8 s with constant speed and

11 disappeared during force pulse production phase. Circle height corresponded to total force.

1 (d) Total force is produced by finger modes and enslaving effect. Index of finger mode  
2 synergy is calculated through UCM analysis and used to define ASA properties.

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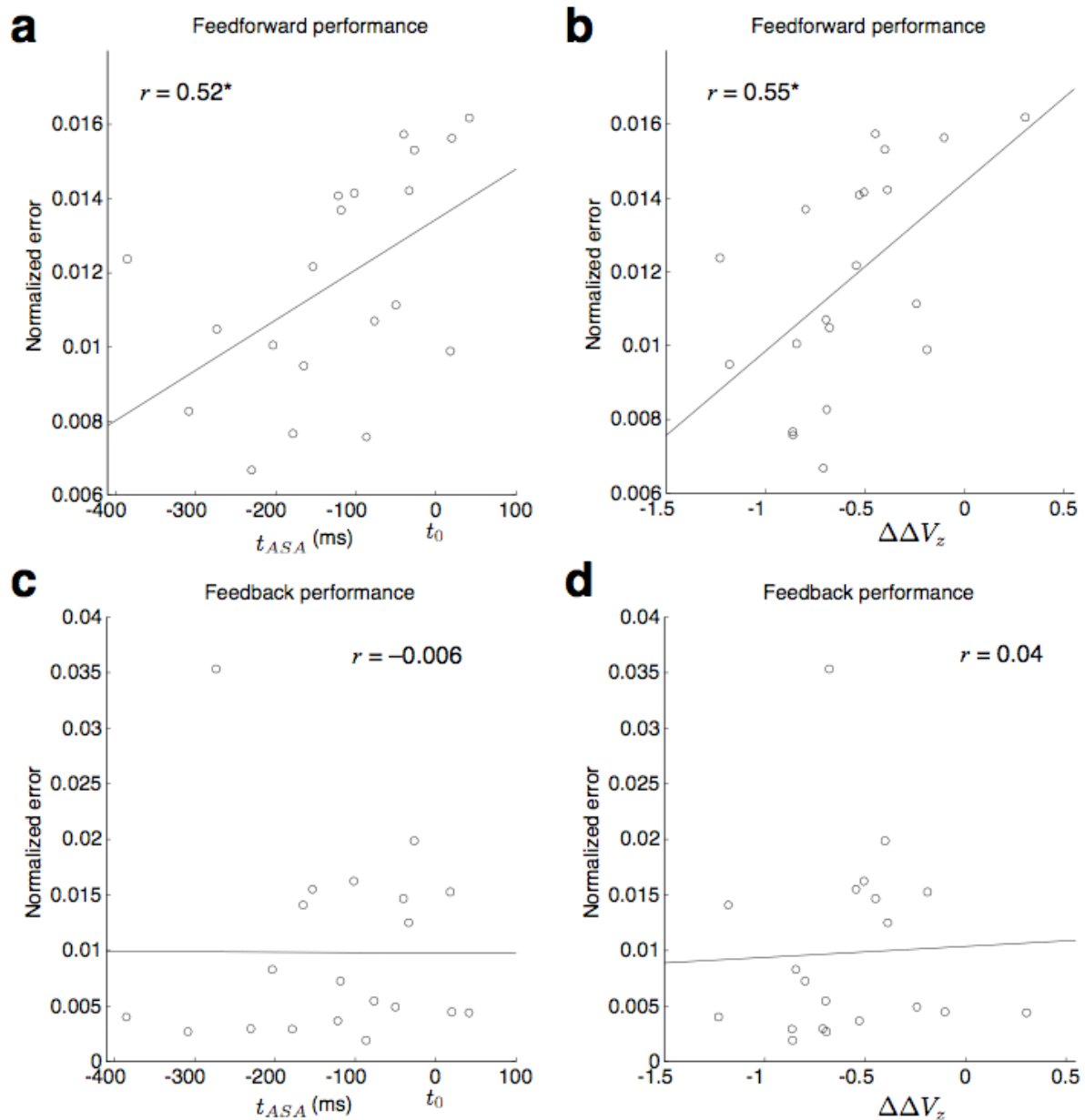


5 **Fig. 2** Time profiles of total force (dash line) and index of synergy (solid line) in quick force  
6 pulse production task. Gray area indicates standard error of synergy index across all subjects.

7 Vertical and horizontal dash-dotted lines denote time of initiation of change in total force and  
8 value of uncoordinated index (the value of index of synergy consisting of same value of UCM  
9 and ORT components), respectively. Cross mark indicates mean time of ASA initiation.

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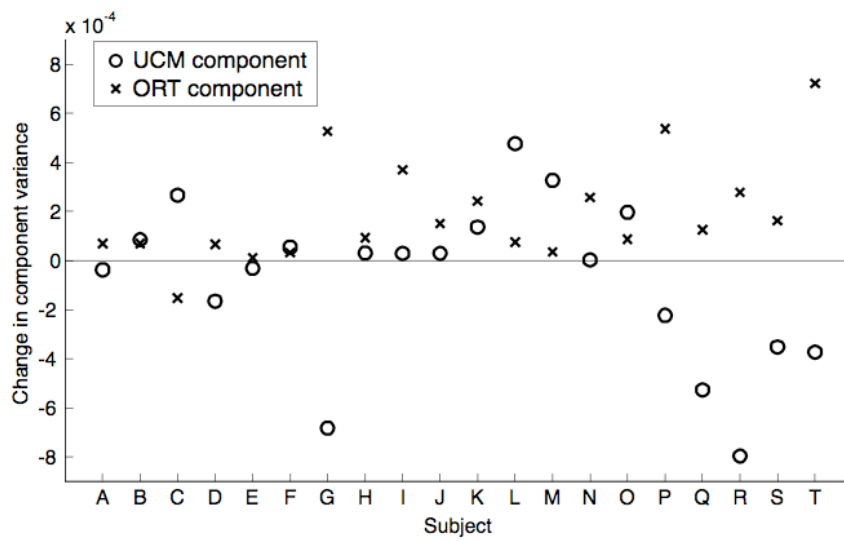
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2 **Fig. 3** Relationships between ASA properties and performances of force control. Upper (a and  
 3 b) and lower (c and d) panels are associated with performance of feedforward force control  
 4 and target-tracking performance, respectively. Left (a and c) and right (b and d) panels are  
 5 related to time of initiation of ASAs ( $t_{ASA}$ ) and magnitude of drop of index of synergy ( $\Delta\Delta V_z$ ),  
 6 respectively. Circles and lines denote values of individual subjects and linearly regressed lines,  
 7 respectively. Coefficients of correlation ( $r$ ) are presented ( $*P < 0.05$ ).

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2 **Fig. 4** Change in UCM and ORT components from steady state to that of change in total force  
 3 ( $t_0$ ). Circles and crosses indicate the change in the UCM component and ORT component,  
 4 respectively. The horizontal axis denotes subjects' ID.