

## INTRODUCTION

### Motivation

- Assistive technologies for driving and navigation have been engaged for the past two decades.
- Determining the level of haptic guidance, e.g., the magnitude and direction of haptic force, is a challenging problem [1].
- For instance, an excessive guidance level may degrade user's performance and cause discomfort, whereas a lack of enough guidance may yield task-failure.

### Objectives

- To provide subjects with customized haptic guidance based on their task-performing characteristics.
- To identify the effect of customized haptic guidance on subjects' task-performance and performing-characteristics.

### Approach

- Subject's control strategy is parameterized by inverse optimal control (IOC), and the obtained parameters will serve as metrics to customize haptic feedback for each subject.
- The following 3 will be done: i) assigning a *coach* - an expert having the desired characteristics for the customized guidance, ii) defining a *guiding path*, and iii) determining the *level of guidance* for each subject.

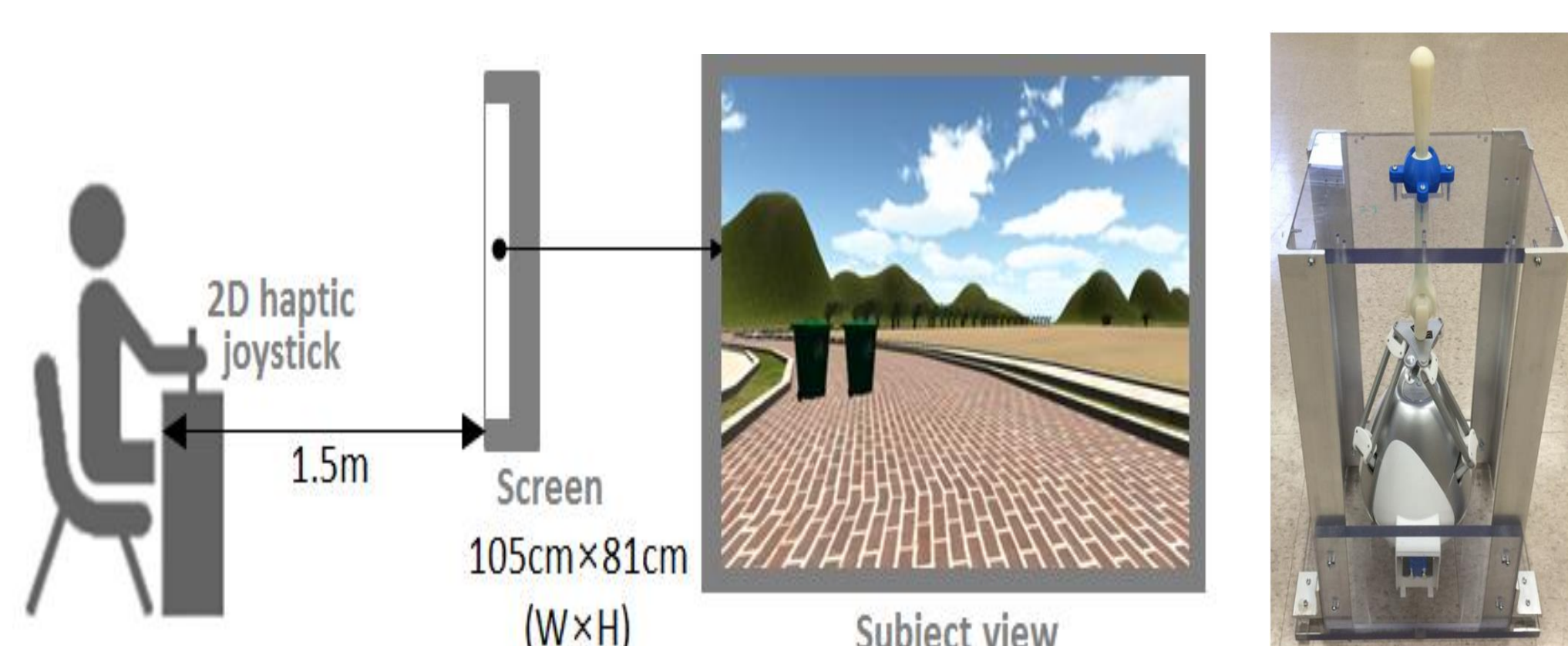
## METHODS

### Subjects

- 16 healthy young adults (14 male, 2 female, age=20-35) participated in this study.

### Procedures

- Subjects were seated at 1.5m from a 105cm-by-81cm screen, and the modified version of Novint Falcon was used as 2D haptic interface (Fig. 1).
- The experiment consisted of two separate sessions: the first session for obtaining the baseline data and the second session for identifying the effect of customized haptic feedback based on the baseline data.



**Fig. 1** The experimental environment developed by Unity3D (left) and the modified Novint Falcon as 2D haptic joystick (right).

- For both sessions, the subjects were asked to drive a virtual vehicle along four roads each of which had a difference radius of curvature and obstacles.
- The subjects were instructed to drive the vehicle as fast and safe as possible.

### Data Collection

- Completion time, sampling time, task#, trial#, successes, fails, vehicle's positions and heading direction were recorded from the start line to the finish line.
- Each task was repeated 3 times. The sequence of the tasks was randomized. Sampling frequency was 60Hz.

### Subjects' Strategy Parameterization

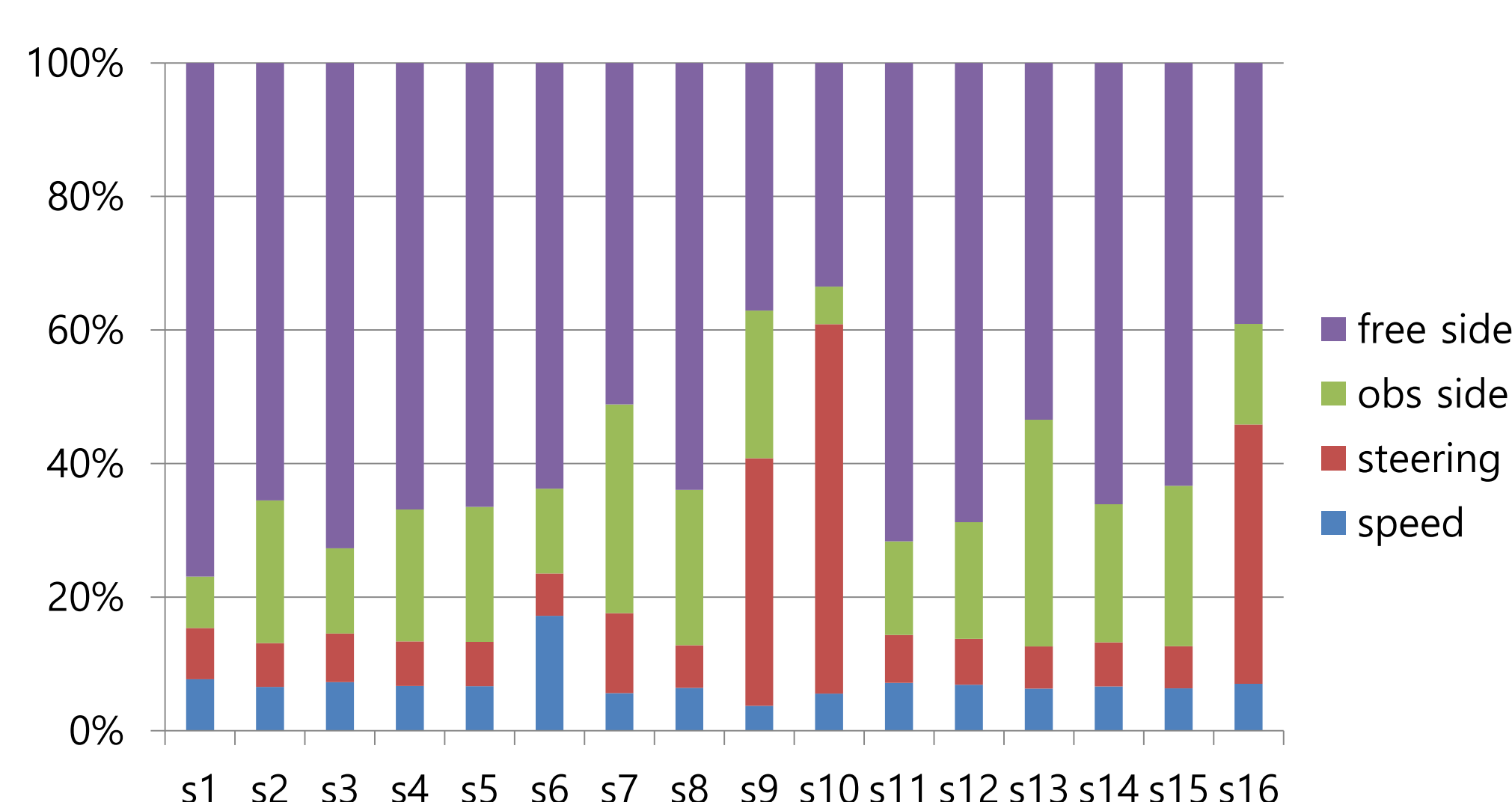
- After the first session, the subject's strategy for given tasks was analyzed by IOC.
- A cost function that each subject may have minimized during tasks was assumed to be the following form:

$$cost = \sum_{i=0}^N c_v v(i)^2 + c_\omega \omega(i)^2 + c_{d_o} d_o(i)^2 + c_{d_f} d_f(i)^2$$

- where  $v$ : linear velocity,  $\omega$ : angular velocity,  $d_o$ : distance from the vehicle to road boundary on obstacle side, and  $d_f$ : distance from the vehicle to road boundary on obstacle-free side.
- Positives coefficients,  $c_v$ ,  $c_\omega$ ,  $c_{d_o}$ , and  $c_{d_f}$ , could be estimated by solving an IOC problem based on the observed baseline data  $v$ ,  $\omega$ ,  $d_o$ , and  $d_f$  [2][3].
- (See Figure 2) Subject's vector  $q$  to represent *performing-characteristics* was defined from the estimated coefficients as  $q = [c_v, c_\omega, c_{d_o}, c_{d_f}] \times 100 / (c_v + c_\omega + c_{d_o} + c_{d_f})$ .

### Analysis

- To examine the benefit of subject-specific customization, a baseline with no guidance and a guidance that enforced the vehicle to a road center were compared.
- Repeated measures analysis of variance (rANOVA) was performed to identify the effect of various guidance on the average and variability of subjects' performance.
- Significance level was set to 0.05 (SPSS v21, Chicago, IL).



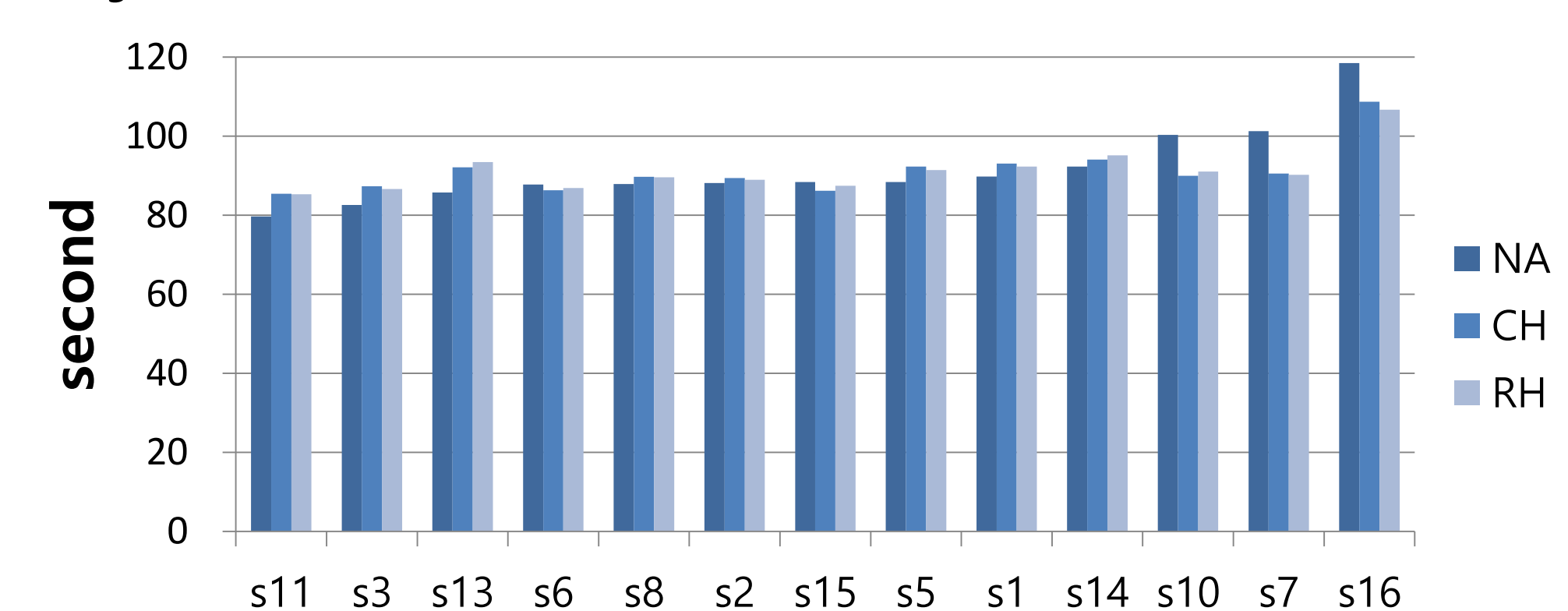
**Fig. 2** Parameterized performing-characteristics vector  $q$  represented as bar graphs for all subjects

## RESULTS AND DISCUSSION

### Coach Assignment

- Based on the baseline data during the first session, subjects were grouped into 3 groups by k-means clustering (bold is a coach): {**s4**, s2, s5, s7, s8, s13, s14, s15}, {**s9**, s10, s16}, and {**s12**, s1, s3, s6, s11}.

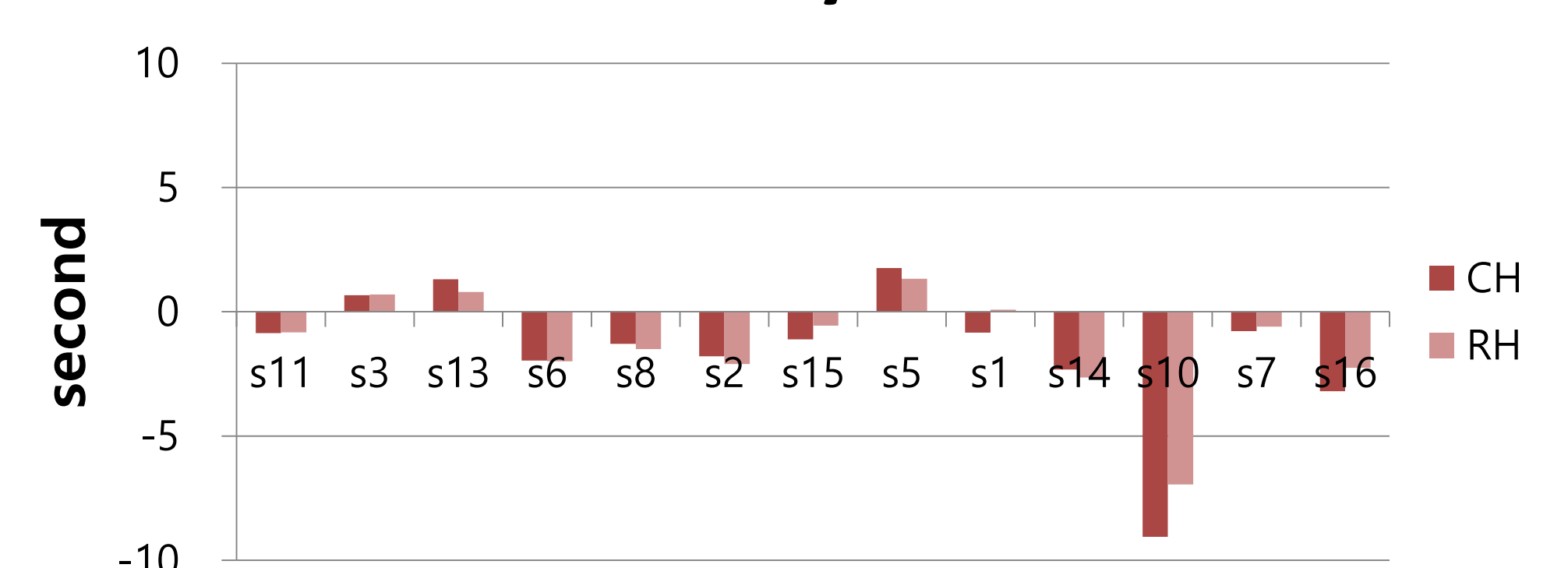
### Average Performance Enhanced for Slower Subjects



**Fig. 3** Average performance with respect to NA (no-assist), CH (customized haptic), and RH. (road-centered haptic).

- The average of subjects' performance was not significantly affected by haptic assistance.
- Performance improvement could only be observed in slower subjects, e.g., s10, s7, and s16.

### Performance Variability tended to reduce



**Fig. 4** The performance variability difference from NA when CH and RH was provided.

- rANOVA on performance variability showed tendency for variability reduction when haptic guidance was provided,  $F(2,24)=4.168$ ,  $p=0.06$ , with mean of 3.929, 2.430, and 2.658 for NA, CH, and RH, respectively.

## CONCLUSION

- To provide with the customized guidance, our approach for parameterizing subjects' control strategy was presented.
- The customized haptic guidance *only enhanced the slower subjects task-performance*.
- The customized haptic guidance (CH) showed *the stronger tendency for variability reduction* compared to road-centered haptic guidance (RH).

### References

- [1] Feygen D. et al., IEEE Symp. on HAPTICS, FL, USA, 2002
- [2] Suzuki S. and Furuta K. J. control Science and Engineering, 1-10, 2012.
- [3] Levine S and Koltun V, IEEE Conf. on Machine Learning, Edinburgh, Scotland, 2012.