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By

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Abstract

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Acknowledgments

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Chapter 1

Introduction

Chapter 2

Design Evaluation Experiment

2.1 Introduction

After investigating the technical approach (Chapter ??) and the benefit to including the passive haptics layer (Chapter ??), we seek to investigate the use of the Rapidly Reconfigurable Research Cockpit (R3C) in a design evaluation study. The goal of this experiment is to determine if the R3C system can be used in the place of a more traditional evaluation tool. As previous chapters have discussed, there are a number of self-evident advantages to using the R3C system. In order to compare the R3C system to a traditional evaluation, we designed an experiment to ask subjects to provide feedback on different designs of a cockpit instrument. The subjects were divided into two groups: one group used an R3C setup to operate the instruments, while the other used a more traditional setup, a touchscreen simulator of the instruments. Both groups evaluated the same two instrument designs, and subjects were asked to provide feedback using the same questionnaires.

2.2 Methods

2.2.1 Simulator Setup

The simulator workstation as configured for each group is shown and annotated in Figure ??. It was designed to have as much as possible to be the same between the two configurations. The joystick and instrument were positioned in the same location for each

Figure 2.1: Simulator Workstation

group. Neither group had out the window visuals, relying only on the attitude indicator on the instrument. For the Virtual Reality (VR) group, the visuals showed a plain interior of a cockpit, but the out-the-window view was black. Both groups had an aural indication (a click noise of a button being pressed) when a button was activated on the instrument, using the speakers mounted behind the instrument panel.

Beyond the VR group using a virtual reality headset for the visuals, the main difference between the two groups was the method for pressing the buttons on the instruments. The VR group used the hand tracker activated system previously described in Chapter ??. For this experiment, the buttons were configured to highlight a blue color when the hand tracker registered a finger within the zone. When the button was activated after the 150 millisecond delay, the highlight would disappear and the button in the virtual world would move inwards as if it were being pushed in¹, the press sound would play, as well as the behavior on the instrument associated with pressing that button. A separate release sound would play when the finger left the zone after a successful press, and for the VR group the button would move back to its starting position.

The Touchscreen (TS) group used a 10.1 inch capacitive touch screen with resolution of 1024x768. The screen was X.x in by X.x in, with a X.x in bevel. The two instruments were rendered in a web browser using standard HTML elements. Javascript press and release events were used to simulate the same behavior as described for the VR group, except for the highlighting before a button press. The visuals of the tracker were rendered on top of the browser window with the same OpenGL rendering code used for the VR group.

2.2.2 Task Design

Based on the technology available for the simulator base, a number of requirements were laid out that would guide the design of an appropriate task and instrument designs.

• Flight task using a standard joystick

¹Of course, the physical button could not and did not move

- Additional task that requires use of multiple buttons on the instrument
- Able to develop simulator for both touchscreen and R3C setup
- Able to design two different layouts with one design having distinct flaws
- Simple design yet complex enough task to have sufficient workload
- Operationally relevant tasks analogous to those required in a cockpit

Ultimately, we designed a task that required number and letter inputs using the buttons, while simultaneously flying a pitch disturbance profile.

Tracking Task

The tracking task display was a standard attitude indicator display, shown in Figure 2.2. Each tick corresponds to 1 degree in the dynamics simulation, with major ticks at intervals of 5 degrees. The attitude indicator was X.X inches square on the instrument. Subjects controlled the one-dimensional (pitch only) task using a joystick with their left hand. The joystick is pictured in Figure 2.1.

The flight dynamics model of the simulator was a stability derivative based model for a Boeing 747 in a low altitude landing configuration. The block diagram of the dynamics is shown in Figure ??. The dynamics model was updated and recorded at a rate of 125Hz.

The output of the joystick, r_{js} , varies from -1.0 to 1.0, and the gain of 10° was chosen to ensure the pilot had enough control authority to complete the task. The transfer function of the aircraft dynamics is given as:

$$\frac{\theta}{\theta_{el}} = \frac{-0.572(s + 0.553)(s + 0.0396)}{(s^2 + 2\zeta_1\omega_1 + \omega_1^2)(s^2 + 2\zeta_2\omega_2 + \omega_2^2)}$$

$$\omega_1 = 0.0578 \qquad \zeta_1 = 0.0160$$

$$\omega_2 = 1.12 \qquad \zeta_2 = 0.798$$

The disturbance model is based off the model developed in SweetRef. It is designed to provide a broad spectrum of frequencies that the human controller needs to respond to. The disturbance is a sum of sines described by:



Figure 2.2: Attitude Indicator Display

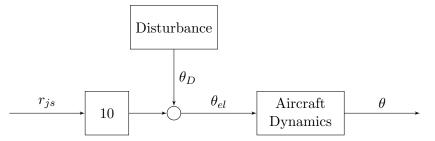


Figure 2.3: Tracking Task Dynamics Block Diagram

$$\theta_D = K \sum_{i=1}^{12} \left[a_i \left(\frac{2\pi k_i}{240} \right) \sin \left(\frac{2\pi k_i}{240} t + \phi_i \right) \right]$$
 (2.2)

The k_i terms are given as,

$$k_1 = 7,$$
 $k_2 = 11,$ $k_3 = 16$
 $k_4 = 25,$ $k_5 = 38,$ $k_6 = 61$
 $k_7 = 103,$ $k_8 = 131,$ $k_9 = 151$
 $k_{10} = 181,$ $k_{11} = 313,$ $k_{12} = 523$

The amplitude terms are $a_i = 0.5$ for i <= 6 and $a_i = 0.005$ otherwise. The phase terms, ϕ_i , were randomly selected on the $(-\pi, \pi)$ interval ensuring a uniform distribution. This random selection was pre-calculated for each trial, however the order was repeated for each subject so there was no between subject variance in the disturbance signal. Furthermore, each subject received the same sequence of disturbance signals for each instrument design. The disturbance amplitude, K, was chosen such that the root-mean square (RMS) of the signal was 3.5 degrees.

Prompting Task

The prompting task was designed to be both a realistic task for a cockpit as well as a demanding task when done in addition with the tracking task. The task developed required the subjects to read and memorize a short string of characters and enter it back using the buttons on the instrument. To limit the task physically (by number of buttons) and mentally, the characters used were the number 1 through 6 and the letters A through F. The prompts were 4 characters long and once the subject started entry the prompt would disappear, forcing them to hold it in short term memory.

The sequence of the prompts was separated into 10 second "windows". The prompt would appear randomly between 2 and 3 seconds of the start of the window. From the time of appearance, subjects were given seven (7) seconds until timeout. When the subject pressed the first button of the prompt, the prompt itself was cleared and asterisk symbols (*) were shown in place of the prompt for each button entry by the subject. If the subject

Figure 2.4: Keypad Design

ran out of time, the text in entry area would return to black. Although subjects were briefed on the timeout and given practice to learn the pace, no warning or indication of time left was shown during the trials. Whether they completed the prompt within the time limit, or they timed-out, this process was repeated every 10 seconds. This meant that subjects had at least 3 seconds of time with no prompt, though usually more.

The prompts themselves were always composed of three numbers followed by a letter or three letters followed by a number. This structure was decided upon to provide a consistent pattern. The prompts were randomly chosen but were not allowed to have repeat numbers or letters, and for the prompts with three letters, common words or acronyms were filtered out (e.g. "BAD", "FDA"). The selection of letters or numbers as the first three characters was randomly chosen as well, with an equal weight to each.

2.2.3 Instrument Designs

The two different designs used were developed to be both realistic and believable as a cockpit instrument design that would be under consideration, yet still have one design with flaws that would be found in a design evaluation. We developed a 'Keypad' design with the prompting task button keys on the right side and the tracking task on the left, and an 'Edgekey' design with the prompt buttons split on either side of the tracking task display. For both designs the tracking task display was the same size on the display. The prompting task text was placed below the tracking task display, and the same font, size and color was used for both designs. These were kept consistent to limit the number of possible variables between the two designs. The prominent difference is the placement and behavior of the buttons which is described in this section.

The Keypad design is pictured in Figure 2.4. The buttons are 1in by 0.75in, with about 0.26in between buttons horizontally and 0.38in vertically. Each button has the label directly on the top of the button. For the VR group, the 3D printed instrument had the button labels raised to provide a tactile feedback. The font was approximately 0.36in tall, and the labels were embossed above the button surface 0.05in.

Figure 2.5: Edgekey Design

The Edgekey design is pictured in Figure 2.5. In this design, there is not a single button for every number and letter. Instead, the bottom button on either side would switch the behavior (and labels) of the remaining six buttons from being 1 through 6 to A through F. In other words, the bottom "switching" buttons would change the rest of the buttons from the numbers to the letters, and vice-versa. The labels were placed offset from the button on the "screen" portion of the instrument, allowing them to change dynamically. The buttons are slightly smaller in this design, at 0.76in by 0.55in. The spacing between buttons vertically is the same as the Keypad design at 0.38in. The center to center distance between the two sides of the button rows is 7.3in. For the VR group, the 3D-printed instrument had raised nubs on each button covering half the width, 0.08in tall and raised 0.05in.

While some of the more subtle differences were expected to possibly be noted by the evaluation study (e.g. having smaller buttons, different position of the flight task), the major flaw designed into the Edgekey design was the switching key to change from letters to numbers and back. This additional action fundamentally changed the demands of the task, as the subjects now had to press this additional button to change labels at least once per prompt. Pressing the switch key was always required between pressing the third and fourth button, and would be required before the first button press if the state of the buttons did not match the start of the new prompt. Since there was no guarantee that the next prompt would start with the instrument on the correct setting, there was an additional cognitive load in determining whether a switch was necessary at the beginning of the prompting window.

2.2.4 Experiment Design

Subjects were divided into the two groups, Touchscreen (TS) and Virtual Reality (VR). The overall sequence of the experiment started with a training session on the simulator and the task, followed by an evaluation session for each of the two designs, finishing with questionnaires asking subjects to evaluate the two designs. The timeline of the experiment

was the same for each subject, except for counterbalancing the order that the designs were evaluated. The training portion started with a slide deck explaining the tasks, the simulator that the subject was using depending on which group they were in, and the functionality of the two designs they were to evaluate. Next, they performed practice trials with just the tracking task and then just the prompting task.

For the evaluation sessions with each design, they performed six trials with both tasks. The first three were a minute long, and were considered practice trials, and not included in the data analysis, though this was no communicated to the subjects. The following three trials were two minutes each, and were used for the results. Each evaluation session concluded with a two minute trial of just the tracking task. This was included to investigate if the subject had improved or fatigued at the tracking task throughout the experiment.

2.2.5 Dependent Measures

The dependent measures were chosen to evaluate the performance of each task individually as well as the workload of the subject. For the tracking task, the root-mean square error (RMSE) was calculated for each trial. The error in this case is simply the pitch shown to the subject, the output of the flight model described above.

The prompting task has two dependent measures, for speed and accuracy. For speed we consider the *response time*, defined as the time between the prompt is first shown to the subject and when they press the first button of their response entry. The accuracy is measured by how many prompts they complete correctly. Twelve prompts are shown to the subject within each trial, and these measures are meaned per trial and then per design for each subject.

For workload, a NASA Task Load Index (TLX) survey was administered after they completed each design. The TLX survey asks for a rating of their workload between 0-100 for the following subscales: Mental Demand, Physical Demand, Temporal Demand, Performance, Effort, and Frustration. Our implementation allowed selection of the ratings within increments of 5, and included anchors of "Low" and "High" at the extrema of 0 and 100, respectively (except for Performance, which uses "Good" and "Bad"). The midpoint

was also visually indicated with a larger tick. The ranked pairs modification was used and completed for both times the subject took the survey. This modification asks the subject, for each of the pairwise combinations of subscales, which they felt contributed more to their workload. The number of times they select each subscale is used a weight to calculate a weighted mean for the total TLX score.

Finally, the subjects were given a questionnaire asking for their feedback on each instrument design. For each design, the subjects were asked the following questions:

- Please comment on any difficulties you had performing the prompting task with this
 design especially in contrast to the other design.
- Please comment on anything you liked in this design.
- Please comment on anything you did not like in this design.
- Any other comments?

Additionally, the following questions were asked:

- Which instrument design did you prefer? Why?
- Did you experience any physical fatigue during the experiment? Where?
- Any other comments?

An open form text box was used for the response field for each of these questions.

In a standard design evaluation study, the feedback received from the users in this questionnaire (and other debriefing interviews) would often be the main source for carrying out re-design. The goal of this experiment is to determine and document in which ways does this feedback differ. For example, if most subjects in one group noted issues with the size of a button, while no one in the other group found an issue with that button, this would indicate that using this VR system may not highlight the same issues regarding button sizes. The groups were purposely left ambiguous in the example, as it does not matter which group found the flaw and which group did not comment on it. Although we could postulate as to which group are "correct" in their evaluation of the instrument, it is not a

useful exercise, as the only result is to document what potential differences could arise so that users of this system can be aware.

With that goal in mind, the analysis of the feedback questions seeks to find the differences between groups. To perform this, the sentences from the open form responses were first separated into single feedback comments, and summarized using common language. If a single subject repeated the same comment in the answers to multiple questions, they were only counted once. Each of these simplified feedback comments were assigned to a category or overall summary of their feedback. This process was completed separately for each group. To summarize the differences, we aim to look for feedback that is unique to a certain group or feedback that receives a higher frequency of comments in one group.

2.2.6 Statistical Tests

The quantitative dependent measures are tested with a two-way ANOVA, with one within subjects factor (Design) and one between subjects factor (Group). The Design factor contains two levels, the two designs each subject tested, Edgekey and Keypad. The Group factor also contains two levels, the VR (Virtual Reality) group and the TS (Touchscreen) group. When the ANOVA showed significance in the interaction test, post-hoc repeated measured t-tests were undertaken to determine the significance of Design within each Group. Independent samples t-tests were used to test the significance of Group within each Design. Statistical significance level was corrected using the Bonferroni correction considering the 4 dependent measures being tested. All effects were considered statistically significant at the 0.0125 level ($\alpha = 0.05/4 = 0.0125$). Effects which have a significance level between 0.05 are considered to be marginally significant.

2.3 Results

2.3.1 Demographics

Twenty-three (23) subjects were recruited from the UC Davis engineering undergraduate and graduate student population. Twelve subjects were placed in the VR group, and the remaining eleven in the TS group. The mean age was 21.0 ($\sigma = 3.14$), with 19

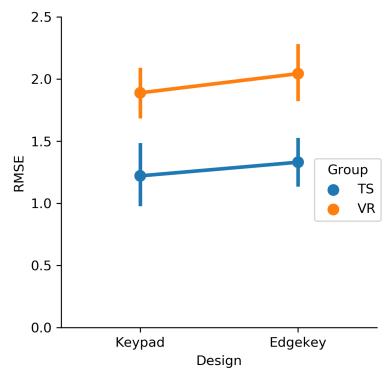


Figure 2.6: Factor Plot of RMSE

male and 4 female subjects. The genders were balanced between the two groups. Most subjects had no flight experience (two were student pilots), and all of the VR group subjects indicated that they had less than one hour of experience using virtual reality headsets.

2.3.2 Performance Measures

Tracking Task RMSE

The performance of the tracking task was measured using the root-mean square error (RMSE) of the pitch. The effect of Group yielded an F ratio of F(1,21)=21.4, p<0.001 indicating a significant difference between VR ($M=1.28\deg, \sigma=0.38\deg$) and TS ($M=1.97\deg, \sigma=0.38\deg$). In both groups, subjects were performing the tracking task using the same joystick. The most direct factor that could contribute to the decreased performance in the tracking task for the VR group is the loss of visual acuity in the tracking task display due to the technical limitations of the VR head-mounted display. Indirectly, the additional workload of the prompting task could be taking attention away from the tracking task. The effect of Design indicated a marginally significant difference (F(1,21)=

5.94, p = 0.024) for the tracking task RMSE between Keypad ($M = 1.57\deg$, $\sigma = 0.51\deg$) and Edgekey ($M = 1.70\deg$, $\sigma = 0.52\deg$). The only change in the tracking task display between the two instrument designs is a small change in position. It moves from being on the left side for the Keypad to the middle for the Edgekey. Since there was no change otherwise, this suggests that any difference on the tracking task performance between the designs would be related to additional workload from the prompting task. The interaction effect was not significant (F(1,21) = 0.17, p = 0.69).

To further investigate the change in performance between the two groups, we can investigate the trials where the subjects were only doing the tracking task. At the end of each evaluation session, the subjects ran a single trial that was just the tracking task. These trials were included to be used as a test of the assumption that the subjects were no longer learning, but can also be used as a test of the Group factor on the tracking task performance. The effect of group on RMSE for the tracking-only trials yielded a marginally significant difference (F(1,21)=4.81, p=0.039) between the VR Group $(M=1.32, \sigma=0.50)$ and the TS Group $(M=0.91, \sigma=0.43)$. There was no significant difference for the effect of design (F(1,21)=0.068, p=0.80). The interaction effect between group and design was also not significant (F(1,21)=3.21, p=0.087).

Although the tracking only trials found a marginally significant difference for the group, the difference was much more distinct for the trials with both tasks. This indicates that when the subjects were focused on the single task, they were able to mitigate most of the visual resolution differences between using a touchscreen and the virtual reality screen. Additionally, the marginally significant difference between the designs for the trials with both tasks was reduced to no significance when the additional prompting task was removed. This also points to the additional workload of the prompting task causing a performance drop on the tracking task. The factors leading to the added workload of the prompting task are investigated in the next performance measures discussed.

Prompt Response Time

The first measure of the prompting task is the response time of the subject. The response time is defined as the time from the prompt is shown to each subject until they

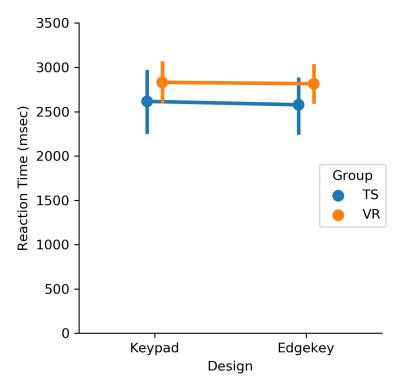


Figure 2.7: Factor Plot of Response Time

press the first button of the prompt. For the Edgekey design, it would be possible that the subject had to start with the switching button if the new prompt did not start with the same mode (letters or numbers) as the previous prompt. Since this button would not clear the prompt when it was pressed, it is not considered the first button of their entry. However, this would still require an additional movement of the subject, adding additional time. For this reason, the prompts which required the subject to start with the switch key are filtered out of this analysis.

The response time was unique among the dependent measures, as all tests were insignificant. The effect of group yielded an F ratio of F(1,21)=1.19, p=0.29 indicating no significant difference between VR ($M=2812\mathrm{msec}, \sigma=383\mathrm{msec}$) and TS ($M=2594\mathrm{msec}, \sigma=567\mathrm{msec}$). One factor that could influence the response time between groups is the additional time to activate a button in the VR environment versus the touchscreen. However, a large portion of the response time for the subject is their cognitive processing of the prompt – recognizing the new prompt has appeared, reading it, then memorizing it. Beyond potential differences in the visual environment, the cognitive portion

should not take more time for one group or the other. A potential reason that there could be a lower than expected difference between the group means is that some VR subjects learned to keep their hand closer to the instrument so that the hand tracker could keep it in view. When the hand tracker lost view of the hand, the re-acquisition time could be significant, so holding it close to the instrument would prevent this from happening. This issue comes up again when looking at the subjects' response to questions about fatigue.

The effect of design was also insignificant (F(1,21) = 0.68, p = 0.42) between Keypad $(M = 2728 \text{msec}, \sigma = 512 \text{msec})$ and Edgekey $(M = 2687, \sigma = 471 \text{msec})$. The biggest difference between the two designs is the switching key on the Edgekey design. As described above, the need for an additional switch press before the first prompt button was filtered out, so we are only comparing prompts where the first button was available right away to the subject. Since the Edgekey design had more time pressure due to the need for the switch key, subjects could have learned to respond quicker to adapt for this. However, these differences in the design did not appear to have a significant effect on the response time. Finally, the interaction effect was not significant (F(1,21) = 0.001, p = 0.96).

Prompts Correct

The second measure of the prompting task is the accuracy of the subjects in correctly completing the prompt. To get the prompt correct includes two important components for the subject. First, they must remember the prompt as they enter it, and second, they must be able to physically press the buttons within the seven second response window. For the statistical test we are using the count of how many prompts each subject completed successfully per trial. Among the incorrect prompts, we can differentiate between whether the subject entered the prompt incorrectly (failure to remember the prompt) or whether the subject ran out of time (failure to physically press the buttons). These counts are reported to help analyze the results, but are not used in the statistical tests. There were 12 prompts per trial, and every subject completed three trials for each design.

The number of correct prompts had a significant interaction effect between group and design (F(1,21)=27.8,p<0.001), meaning the main effects must be interpreted with the post-hoc tests as well. Both main effects were significant, the effect of group yielded

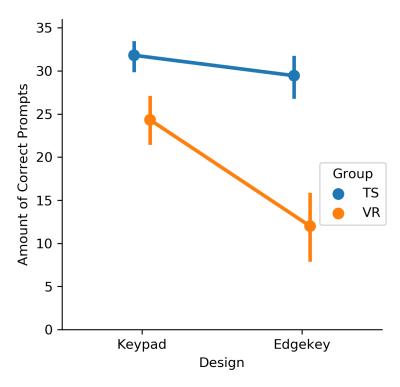


Figure 2.8: Factor Plot of Correct Prompts

an F ratio of F(1,21)=43.9, p<0.001 while the effect of design yielded an F ratio of F(1,21)=64.1, p<0.001.

For the effect of design on the VR group, the repeated measured t-test indicated a significant difference (t(11) = 8.0, p < 0.001) between the Keypad $(M = 8.11, \sigma = 1.62)$ and the Edgekey $(M = 4.00, \sigma = 2.37)$ The TS group had a marginally significant difference (t(10) = 2.28, p = 0.045) between Keypad $(M = 9.82, \sigma = 1.38)$ and the Edgekey $(M = 10.6, \sigma = 0.96)$. These results indicate that both groups had trouble with the additional time pressure caused by the Edgekey design requiring the use of the switch key. The TS group performed a lot closer to their performance in the Keypad design, however, only getting approximately 1 fewer prompt correct. The VR group had much more difficulty in the Edgekey design, correctly completing about half as many as they completed in the Keypad design. However, they had more difficulty in both designs compared to the TS group.

This agrees with the post-hoc tests for differences between groups within each design. These tests had significant effects for both the Keypad design (t(21) = 4.44, p < 0.001) between the VR group and the TS group, and the Edgekey design (t(21) = 7.05, p < 0.001)

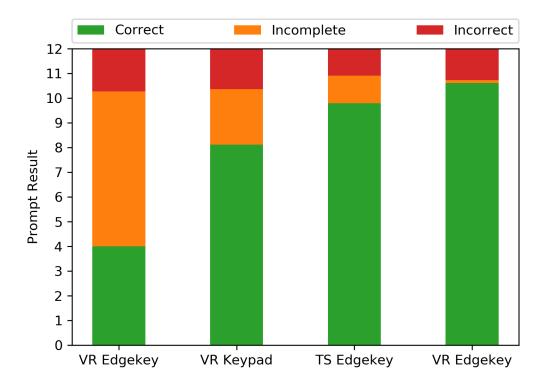


Figure 2.9: Result of prompts

0.001) between the VR group and the TS group. The main effect of group clearly has a meaningful effect, which found the VR group ($M=6.05, \sigma=2.88$) had significantly fewer correct prompts than the TS group ($M=10.2, \sigma=1.2$). This difference is largely due to subjects not being able to complete the prompt. Figure 2.9 shows the breakdown of the mean result of each trial for each group and design. Across all groups and designs, very few prompts were completed that were incorrect, and most of the difference in number completed correctly is due to the incomplete prompts. A contributing factor for this would be the method of button activation used for the VR group combined with the time pressure. Another contribution would be the limitations of the hand tracker. When the hand tracker lost tracking or gave bad information, it became hard or impossible for the subject to activate a button until the hand tracker returned to normal. When this happened in the middle of a prompt, the amount of time it took to recover from the bad tracking would lead to a timeout on the prompt entry, causing an incomplete prompt. The variance of number correct was also much larger in in the VR group, which could be caused by the unfamiliar nature of the VR environment compared to a touchscreen.

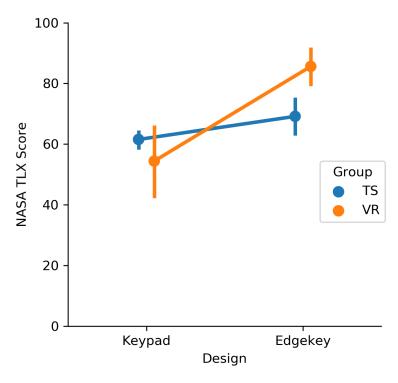


Figure 2.10: Factor Plot of NASA TLX

NASA TLX

After the subject completed their trials for each design, they filled out a NASA TLX workload survey. Their scores, weighted means by the pairwise comparisons, are used here as a measure of their self-reported workload. The interaction effect between group and design was found to be significant (F(1,21) = 8.25, p < 0.001). The main effects showed a significant difference in design (F(1,21) = 23.6, p < 0.001), but not in group (F(1,21) = 1.69, p = 0.21). This could mean that the group did not affect the TLX score, but in the presence of an interaction effect, the post-hoc tests will guide the interpretation.

The repeated measures t-tests indicated significance between designs for the VR group (t(11) = -4.20, p = 0.001) between the Keypad design $(M = 54.4, \sigma = 20.4)$ and the Edgekey $(M = 85.6, \sigma = 11.2)$ There was a marginally significant difference between designs for the TS group (t(10) = -2.72, p = 0.02) between the Keypad design $(M = 61.5, \sigma = 4.46)$ and the Edgekey $(M = 69.2, \sigma = 10.1)$. The effect of design was much stronger in the VR group, but both groups indicated respectively higher workload on the TLX scores for the Edgekey design. This follows from the experimental design which hypothesized that the

Edgekey design would be more difficult. One factor that could have contributed to a larger difference in scores for the VR group could be the increased difficulty subjects had in completing the prompt, as seen in the results of the number of incorrect and incomplete prompts for the VR group using the Edgekey design (Figure 2.9. The effect of group was not shown to be significant in the ANOVA analysis, but the independent samples t-test showed a significance for the Edgekey design (t(21) = 3.69, p < 0.01) between the VR Group $(M = 85.6, \sigma = 11.2)$ and the TS Group $(M = 69.2, \sigma = 10.1)$. With the Keypad design, The effect of group was not significant (t(21) = -1.13, p = 0.27) between VR $(M = 54.4, \sigma = 20.4)$ and TS $(M = 61.5, \sigma = 4.46)$. These tests further illustrate that the VR group found a higher workload for the Edgekey design specifically, as both groups rated the workload in the Keypad design similarly.

Summary

A summary of the significance results from the ANOVA and post-hoc t-tests for all the performance measures are shown in Table 2.1. The significance is indicated by '*' for p < 0.0125, '+' for 0.0125 , and '-' for no significance. For the measures with significant interaction effect, the post-hoc t-tests are shown per group and per design.

2.3.3 Design Feedback

As discussed in Section subsection 2.2.5, the long-form feedback questions were synthesized and summarized into categories. The categories and the counts of comment occurrence for each group is summarized in Table 2.2. Categories which only received one comment are not included in this table in interest of brevity, the full table is shown in Appendix ??.

By far the issue that received the most feedback was the difficulty of using the switch key (Edgekey, Switch Difficult). Most of the complaints stated the extra difficultly of having to press another button. Some of the other complaints from this category were: it took extra time (with no extra time given), it added to the mental demands of the task, and it was difficult to see which mode the instrument was in. Both groups disliked the switch key, and mentioned it just as frequently.

	ANOVA		
	Group	Design	Group:Design (Interaction)
Tracking RMSE	*	+	-
Response Time	-	*	-
Prompts Correct	*	*	*
NASA TLX	-	*	*
	t-tests		t-tests

	Design		Grc	oup
	VR Group	TS Group	Keypad Design	Edgekey Design
Prompts Correct	*	+	*	*
NASA TLX	*	+	-	*

Table 2.1: Statistical Significance Test Results. '*' indicates significance at the p < 0.0125 level, '+' indicates marginally significant (0.0125), and '-' indicates no significance.

Switching from numbers to letters was hard, especially if I was trying to compensate for turbulence and was struggling at the time. (TS Subject)

I did not like how much extra work it was. It took so much extra focus that I forgot I was flying with the joystick (VR Subject)

Many subjects noted the familiarity of the Keypad design (Keypad, Familiar) and that having the buttons close together (Keypad, Buttons Proximal) as things they like about that design. The familiarity was noted more often for the TS Group, but both were some of the more frequent comments within each group.

One comment about the Edgekey design that got more frequent mentions from the TS Group was that they found having the flight task in the middle of the display, centered between the buttons, was preferred (Edgekey, Centered Flight Task Better). The subjects who chose the Edgekey as their preferred design almost unanimouslycited this as their reason for their preference. The comments that fed into this category also included

Topic	Feedback Summary Category	VR Group	TS Group
Edgekey	Switch Difficult	14	12
Keypad	Familiar	6	11
Edgekey	Centered Flight Task Better	3	13
Keypad	Buttons Proximal	6	7
Keypad	Buttons Always Visible	5	5
Other	Hand Tracking Issues	9	0
Edgekey	Hand Blocks View	3	4
Fatigue	Prompting Arm	4	1
Edgekey	Clean Design	3	2
Fatigue	Fatigue from Joystick	0	4
Edgekey	Easier	0	4
Keypad	Buttons Confusable	0	4
Other	Colors Disliked	2	2
Fatigue	Eye Fatigue	3	0
Keypad	Easy Focus Switch	2	1
Keypad	More Mistakes	1	2
Edgekey	Accuracy Worse	1	2
Keypad	Buttons Bad Layout	2	0

Table 2.2: Counts of Design Feedback Comments per Group

subjects who noted the difficulty of splitting their focus back and forth with the Keypad design. Interestingly, two of the TS Group subjects noted that they would have found the Keypad easier if they had tactile feedback to guide their input. This could suggest that the reason the VR Group subjects did not find the centered flight task advantageous is because with the tactile feedback of the 3D-printed instruments they were able to keep visual focus on the left half of the screen in the Keypad design, thus not seeing benefit from the centering of the flight task display.

[The Edgekey design] forced me to pay more attention to what I was typing, this wouldn't have been a problem if the keypad was a physical device that allowed me to locate the numbers and letters without looking, much like the dots on a computer keyboard. (TS Subject)

I like that the flight control was cent[[]e]red, so you could see it even when you were looking at the buttons. (VR Subject)

The most notable exceptions to providing similar feedback between groups are the categories that relate to fatigue issues. Many subjects in the TS group noted fatigue caused from using the joystick, yet none in the VR group did, despite using the same joystick setup, and seated in the same location. The VR group did note more fatigue in their other arm that was used for the prompting task. This fatigue seemed to be caused by the additional effort needed to have the hand tracker recognize the hand. For example, one subject wrote:

My right wrist was somewhat fatigued. Though I think this is mostly from positioning my hand for the simulator to recognize my input. (VR Subject)

Some of this additional effort was due to subjects learning to hold their prompting task hand "hovering" while waiting for the next prompt. This was done to keep the hand in view of the hand tracker as when the hand leaves the field of view, the re-acquisition will slow down the entry of first button. Many subjects organically learned this, and kept their arm in front of the instrument between prompts.

Similarly to the fatigue issues being different, there were some comments that were due to the technology being used more-so than the designs themselves. Obviously, the subjects who noted difficulty using the hand tracker, or the one subject who mentioned touchscreen issues, are specific to the simulator technology the used. However, some of

the other categories had comments that may have been indirectly caused by the different technologies and their limitations. For example, some subjects noted the keypad design caused them to make more mistakes. For the TS Group, this was due to the touchscreen being too responsive to the button presses:

[S]ince I was able to go more quickly with this layout, I had more mistakes in the entry. (TS Subject)

One subject in VR who complained of more mistakes in the Keypad design, identified a common problem caused by the hand tracker. When the hand tracker was having registration issues it would sometimes mistakenly place the other fingers in the activation zone of the buttons underneath the one being targeted, causing multiple buttons to be pressed in a short period of time.

There's more unintended register since other fingers might trigger the buttons. (VR Subject)

Although only one subject noted this, it was observed happening to many subjects. In fact, for the VR group, eight of the twelve subjects had the wrong button register within 200 milliseconds of the last button in the Keypad design. In the other designs and groups this happened to only one or two subjects.

2.4 Discussion

2.4.1 Effects of Training

2.5 Conclusion

Appendices

Appendix A

Result Tables

A.1 Design Evaluation Experiment

Group	Design	Mean	Std. Dev.
TS		1.277	0.3789
VR		1.967	0.378
_	Edgekey	1.704	0.5188
	Keypad	1.57	0.5068

Table A.1: RMSE Means

Factor	F ratio	p value
Group	21.42	0.000145
Design	5.944	0.02374
Group:Design	0.1669	0.687

Table A.2: RMSE ANOVA

Group	Design	Mean	Std. Dev.
TS		2595	567.3
VR	_	2813	383.2
_	Edgekey	2688	471.1
_	Keypad	2729	512.5

Table A.3: Response Time Means

Factor	F ratio	p value
Group	1.199	0.2859
Design	0.6814	0.4184
Group:Design	0.00184	0.9662

Table A.4: Response Time ANOVA

Group	Design	Mean	Std. Dev.
TS	_	10.2	1.242
VR	_	6.056	2.889
_	Edgekey	6.768	3.525
_	Keypad	9.304	1.831
VR	Edgekey	4	2.37
VR	Keypad	8.111	1.616
TS	Edgekey	9.788	1.393
TS	Keypad	10.61	0.964

 Table A.5: Correct Prompts Means

Factor	F ratio	p value
Group	43.56	1.552×10^{-6}
Design	63.93	8.309×10^{-8}
Group:Design	26.89	3.872×10^{-5}

 Table A.6: Correct Prompts ANOVA

Table A.7: Correct Prompts t-tests

Group	Design	Mean	Std. Dev.
TS		65.35	8.535
VR	_	70.01	22.65
_	Edgekey	77.74	13.4
_	Keypad	57.83	15.18
VR	Edgekey	85.61	11.21
VR	Keypad	54.42	20.4
TS	Edgekey	69.15	10.06
TS	Keypad	61.55	4.468

Table A.8: NASA TLX Means

Factor	F ratio	p value
Group	1.688	0.208
Design	23.57	8.455×10^{-5}
Group:Design	8.252	0.009113

Table A.9: NASA TLX ANOVA

Table A.10: NASA TLX t-tests