Tallinn University School of Digital Technologies

## Assessing the Expressiveness of the Distributed User Interface Pattern Language

Master Thesis

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#### Abstract

This Master thesis focuses on the distributed user interface (DUI) pattern language - a collection of patterns that aid HCI researchers and practitioners in the design of interfaces that span across multiple devices. The purpose of this thesis is to determine whether the pattern language is useful for analysing existing DUIs. The current pattern language (which includes DUI patterns with descriptions related to each pattern) needs to be assessed because the descriptions of patterns are based on the review of literature and the understanding of the person who compiled the pattern language. This pattern language has not been tested with external Human-Computer Interaction (HCI) researchers and practitioners engaged in designing and developing DUIs as part of their everyday work.

For achieving the goal of the thesis, a combination of different methodologies was used. A rating exercise and a survey were conducted. The rating exercise was conducted to measure the level of reliability/agreement among the HCI experts. This level of agreement is measured by using the Intra-class correlation coefficient (ICC). To get additional insights about the usage of the pattern language for assessing existing DUIs, the following tools were used: (1) NASA task load index for assessing the amount of perceived workload, and (2) an open-ended follow-up questionnaire for collecting thorough feedback about the pattern language from HCI experts. The purpose of the follow-up questionnaire was to understand what needs to be improved in the pattern language, and what are the most valuable features in the pattern language for the HCI experts in order to help them analyse existing DUIs.

The outcomes of the rating exercise, the NASA-TLX values, and answers to the questionnaire suggest that the DUI pattern language in its current form can indeed be used to support the analysis of existing DUIs without requiring significant cognitive effort and causing excessive frustration.

**Keywords:** Distributed user interfaces, design patterns, pattern language, cross-device interactions, interaction design



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### Acknowledgements

I would first like to thank my thesis supervisors Ilya Shmorgun and David Lamas of the School of Digital Technologies at Tallinn University. The door to Prof. Lamas's office was always open whenever I ran into a trouble spot or had a question about my research. He consistently allowed this thesis to be my own work, but steered me in the right direction whenever he thought I needed it.

I would also like to thank the experts who were involved in the assessment procedure and validation of the questionnaire for this research project. Without their passionate participation and input, the assessment procedure could not have been successfully conducted.

Finally, I must express my very profound gratitude to my parents for providing me with unfailing support and continuous encouragement throughout my years of study and through the process of researching and writing this thesis. This accomplishment would not have been possible without them. Thank you.

Amir Zare Pashaei

## Declaration

I declare that apart from work whose authors are clearly acknowledged, this thesis is the result of my own and original work.

This work has not and is not being submitted for any other comparable academic degree.

The thesis was supervised by Ilya Shmorgun (Tallinn University, Estonia) and David Lamas (Tallinn University, Estonia).

Amir Zare Pashaei

..... (date)

..... (signature)

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## Chapter 1

## Introduction

Distributed User Interfaces (DUIs) are an area of Human-Computer Interaction (HCI) studying interfaces distributed across different devices, displays, and users engaged in colocated or remote collaboration (Melchior, 2011). According to Elmqvist (2011) a DUI is "a user interface, which components are distributed across one or more dimensions, including input, output, platform, space and time". The above five distributed dimensions are described as follows:

- Input (I) controlling input on a single or several devices (Johanson, Hutchins, Winograd, & Stone, 2002), (Myers, Stiel, & Gargiulo, 1998), (Wallace, Mandryk, & Inkpen, 2008)
- Output (O) graphical output tied to a single or distributed across several devices (Czerwinski, Meyers, Tan, & Robertson, 2009), (Biehl et al., 2008), (Wallace et al., 2008)
- Platform (P) the interface executes on a single or is distributed across several platforms.
- Space (S) the interface is restricted to the same physical space or can be distributed geographically (Baecker, 1993).

• Time (T) - interface elements execute simultaneously or are distributed in time.

According to Elmqvist (2011), one of the main challenges of DUI design was that there were no sufficient generalizable toolkits and frameworks which could support DUI development. Shmorgun and Lamas (2015) surveyed existing literature on DUIs in search of existing methods, approaches, and challenges in the design of DUI. Afterwards, Shmorgun, Lamas, and Mercer (2016) introduced patterns for designing DUIs as an aid for HCI researchers and practitioners. As the outcome of their research, they established a catalogue of design patterns, which are gathered in a Semantic MediaWiki (see Figure 2.1) and a design pattern language created on top of it. However, this pattern language needed to be assessed, because when HCI experts want to design something they will rarely start from scratch, and instead will look for what has been done before and try to learn from existing design knowledge. When they want to learn from existing design knowledge, they would need to have a way of de-constructing and analysing existing works. The purpose of the pattern language is thus two-fold: (1) it helps to analyse what has been done before and learn from it; and (2) it is meant to be applied when designing new interfaces or applications.

As both of these points are difficult to address in a single study, this thesis focuses only on the first part. In order to achieve this point, a number of existing applications (case studies) has been compiled. These cases represent examples of thorough systematic work on DUI design. An assessment exercise was then conducted to see if the existing DUI patterns can be used to describe the DUIs from the collected examples, what enabling technologies have been used, what purposes they serve, what devices they can work on. Hence, by using this approach and learning from existing design knowledge, the HCI experts would be able to better understand and learn from the details of existing DUI designs.

## 1.1 Research Problem

Design patterns have been introduced as an aid for HCI researchers and practitioners to support the process of designing DUIs. So far, design patterns have been proved useful for modelling design experience in domains of software engineering and HCI. The aim of a design pattern is to show a proven solution to a recurring design problem in a way that it is easy to understand and can help generate new ideas (Borchers, 2000).

An issue has been identified that HCI researchers and practitioners who were making the first steps into the area of designing DUIs did not have enough information available to them about the various possibilities that DUIs offer them and what current technology supports. To solve this issue, Shmorgun et al. (2016) explored and established a collection of patterns in order to organise patterns into a hierarchical structure - a pattern language, following Borcher's approach (Borchers, 2000). According to Shmorgun et al. (2016), a DUI design pattern language has been introduced to expose connections between patterns so that similar or related patterns can be more easily identified and explored. This pattern language can be described as a set of building blocks for scaffolding the design process in a way that helps designers better identify the described interactions.

The current version of the pattern language needed to be assessed because the descriptions of individual patterns belonging to the language were based on review of literature and the understanding of the person who compiled the pattern language, but not tested with external HCI experts engaged in designing and developing DUIs as part of their day to day practice. The pattern descriptions however needed to be understandable for people who want to design DUIs in a way that they can distinguish and differentiate among patterns and use them effectively. According to Shmorgun et al. (2016), in order to improve the pattern language, its expressiveness needed to be assessed to see how well the patterns could be used for analysing existing DUIs and specifying new ones. According to Shmorgun et al. (2016), such assessment was necessary to provide better ways of navigating through the pattern language, meaning that each user should be able to effectively find and pick the most relevant patterns. There was a need for an adequate metric, which could represent that the patterns were different from each other and that HCI experts could differentiate them and use them to analyse existing DUIs. According to Landis and Koch (1977) and Portney and Watkins (2015), this metric could be represented by a statistical measurement called Kappa. So while the pattern descriptions and their relationships have been identified and implemented in the pattern language, the Kappa value would show whether the patterns descriptions were differentiated enough.

## **1.2** Research Goal and Questions

Based on the identified research problem, the following research goals were set:

- Assess the clarity of design pattern descriptions and their connections by measuring the level of agreement of HCI experts when selecting patterns to describe existing DUIs;
- Assess the cognitive load related to using the DUI patterns for assessing existing DUIs;
- Identify aspects of the DUI pattern language that would need further improvement.

The following research questions were then formulated to help in achieving the goals:

- [RQ1] Can a reasonable level of reliability/agreement be reached when using the DUI pattern language to assess existing DUIs?
- [RQ2] How cognitively demanding is using the pattern language for assessing existing DUIs?
- [RQ3] What aspects of the pattern language would need to be improved to better support the assessment of existing DUIs?

The expected outcomes of this thesis were stated as follows:

#### • Measurement of the level of reliability/agreement

Reaching a reasonable level of reliability/agreement would suggest that HCI experts could easily distinguish and differentiate between the patterns.

#### • Measurement of the level of perceived workload

By measuring the level of perceived workload, the pattern language could be assessed to see how cognitively demanding is using the pattern language. HCI experts would be less likely to use the pattern language if the effort of understanding it would be too great.

#### • Description of the aspects of the pattern language needing improvement

By identifying and describing the aspects of the pattern language that could still be improved would contribute to the improvement and maturing of the language. Getting insights about the features and properties of the pattern language that are perceived as more useful and attractive to HCI experts would help expose those features in a more prominent way.

## 1.3 Research Methodology

To answer the previously formulated research questions the following methods were selected.

#### Method 1 (to answer [RQ1])

In order to reach a reasonable level of reliability/agreement, an exploratory study with HCI experts has been conducted. The reason why an exploratory study has been conducted was to understand if the patterns and their descriptions were clear and different enough from each other that HCI experts could use them effectively for analysing existing DUIs. From this a conclusion could be reached whether the pattern language needed any

improvements or not. As part of this study, a rating exercise has been conducted in order to see how HCI experts used the patterns to analyse existing DUIs.

#### Method 2 (to answer [RQ2])

A questionnaire was implemented to see how cognitively demanding using the pattern language was. The questionnaire was based on NASA-TLX (which is a widely used, subjective, multidimensional assessment tool that rates the perceived workload in order to assess a task effectiveness or other aspect of performance) and used to measure the perceived workload of HCI experts when using the DUI pattern language.

#### Method 3 (to answer [RQ3])

A semi-structured questionnaire was implemented to collect insights regarding the aspects of the pattern language that needed to be improved. The data collected through the questionnaire was then analysed through qualitative content analysis. The aim of this analysis was to explore if there were any issues regarding the usage of the DUI pattern language. If there were any issues, then they could be addressed in the future to further improve the pattern language.

## 1.4 Research Plan

The overall research design consisted of three phases (see Figure 1.1). Phase one focused on gaining initial understanding of how the pattern language was built, what the relationships between the patterns were, and how the descriptions for each pattern were provided. In phase two the study procedure was put together, the profile of HCI experts to participate in the study was compiled, the questionnaires were designed, and the study was implemented. In the last phase analysis of the collected data was conducted and conclusions were derived.

	Task Description
Phase 1: Contextualisation	<ul> <li>Reading through the pattern descriptions</li> <li>Understanding the relationships between patterns</li> <li>Understanding the way, the pattern language is built</li> </ul>
Phase 2: Assessment	<ul> <li>Describing the study procedure</li> <li>Compiling the DUI descriptions</li> <li>Creating the rating exercise</li> <li>Specifying the profile for the HCI experts</li> <li>Designing the questionnaire</li> <li>Conducting the pilot study</li> <li>Conducting the main study</li> </ul>
Phase 3: Analysis	<ul> <li>Analysing the level of reliability/agreement</li> <li>Measuring the task load index</li> <li>Evaluating the pattern language</li> </ul>

Figure 1.1: Phases of the research study

## Chapter 2

## Contextualisation

The patterns belonging to the DUI pattern language were previously gathered in a Semantic MediaWiki (see Figure  $2.1^1$ ).

List of Availa	hle DI II De				
		sign Patterns			
Pattern	• Family •	Motivation	• Setting	Technology	Theory
MobiES	Cross-Device Dragging	Augmenting existing practices Creating technological infrastructure	Private Public	Displays Machine-readable data formats Physical object identification Sensors Networking technologies	
The Conduit	Cross-Device Dragging	Designing new types of interactions Creating engaging experiences	Private	Networking technologies Alternative forms of input	
Hyperdrag	Cross-Device Dragging	Augmenting existing practices Creating technological infrastructure Designing new types of interactions	Private Public	Displays Multimedia Networking technologies Physical object identification Machine-readable data formats	
Cross-Device Drag-and-Drop	Cross-Device Dragging	Creating technological infrastructure Augmenting existing practices	Private Semi-private	Displays Alternative forms of input Networking technologies Machine-readable data formats	
Face-to-Mirror the Full Screen	Cross-Device Portals	Creating technological infrastructure	Semi-private Public	Displays Alternative forms of input Sensors	Proxemics Theory
MultiSpace	Cross-Device Portals	Creating technological infrastructure Designing new types of interactions	Private Public	Displays Networking technologies	

Figure 2.1: List of DUI design patterns in the Semantic MediaWiki

In this wiki, 47 patterns exist so far. Each pattern can be categorised by its name, family, motivation, setting, enabling technology, and supporting theory. The description of a pattern consists of the following:

<sup>&</sup>lt;sup>1</sup>http://idlab.tlu.ee/patterns/index.php/Main\_Page

- Summary: A paragraph describing how the design pattern works;
- **Description:** A detailed explanation of the pattern as presented in the original research, describing interactions involved;
- Design motivation: Describes the primary motivations guiding DUI design;
- **Design goal:** Describes the main goals for designing DUIs;
- **Device type:** Takes into consideration the context of use: private, semi-private, public;
- Enabling technology: List of technologies that are used for enabling the design pattern;
- **Reference:** Reference to the original article where the interaction technique was first described.
- Pattern family: Groups this and other related patterns into a pattern family;
- Cites: All articles cited by the one where the pattern is described;
- Cited by: All articles referencing this particular article;
- **Related to:** Citations of influential material to or from this article, plus any instance of association without citation;
- **Examples:** A real-life implementation of the pattern;
- Diagram: A schematic representation of the pattern.

The fields **Cites**, **Cited by**, and **Related to** were previously used to identify the connections between the articles describing the design patterns. This analysis contributed to establishing the relationships between the individual design patterns and helped form them into a design pattern language. As an example, one of the patterns is called The Conduit (N. Chen, Guimbretiere, & Sellen, 2012), which is a design pattern for facilitating information transfer among ereaders. In this pattern, the non-dominant hand of the user designates the target device and the dominant hand select the item to be transferred. In this case, the user's body acts an imaginary conduit between the 2 devices, facilitating the file transfer. This pattern can also be used to navigate to pages corresponding to a thumbnail selected on another device. In this case, one device is used for displaying thumbnail previews and the other one for reading the corresponding pages. (Figure 2.2) shows an overview of this design pattern as represented in the wiki.

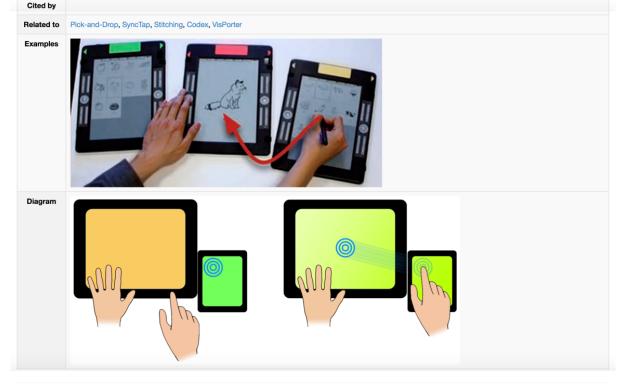
## 2.1 Study Procedure

A review of literature review was conducted to identify possible approaches for assessing the expressiveness of the pattern language. One of the suitable approaches was proposed by Lenz, Diefenbach, and Hassenzahl (2014). In their paper, Lenz et al. (2014) describe research aimed at identifying and categorising attributes of aesthetic interaction design. For their analysis, Lenz et al. (2014) first identified all attributes mentioned in publications on designing aesthetic interactions and compiled them in a list. Overall, 19 design approaches consisting of 151 attributes were collected. Next, the attributes and categories along with examples and definitions provided by the authors of the approaches were given to five independent raters. Their task was to assign each attribute to the category fitting best. After doing so, Lenz et al. (2014) calculated a Fleiss' Kappa statistic for assessing the level of reliability/agreement between the raters. "Clear assignment" was marked when four or five of five votes were collected. The purpose of the categorization was two-fold: (1) it helped to validate the suggested categories; (2) it provided an overview of emerging frequent and shared themes as well as a discussion of the differences between the initially identified approaches.

The Lenz et al. (2014) study design was used as inspiration for conducting the assessment

**The Conduit** 

Summary	The conduit uses your body as a data-transferring metaphor - with your non-dominant hand, tap the receiving device; then with your dominant hand, tap the piece of data to transfer - the transfer will go "through your body" from origin to destination.
Description	Chen et al. developed a Conduit technique to facilitate information transfer among e-readers in their United Slates system. In this technique the non-dominant hand of the user designates the target device and the dominant hand select the item to be transferred. In this case the user's body acts an imaginary conduit between the 2 devices, facilitating the file transfer. This technique can also be used to navigate to pages corresponding to a thumbnail selected on another device. In this case one device is used for displaying thumbnail previews and the other one for reading the corresponding pages.
Design motivation	Designing new types of interactions, Creating engaging experiences
Design goal	Designing new interaction techniques, Improving information management across devices, Supporting joint interaction with information across devices
Device type	Private
Enabling echnology	Networking technologies, Alternative forms of input
Theory	
Reference	Chen, N., Guimbretiere, F., & Sellen, A. (2012). Designing a multi-slate reading environment to support active reading activities. ACM Transactions on Computer- Human Interaction (TOCHI), 19(3), 18.
Pattern family	Cross-Device Dragging
Cites	Pick-and-Drop, Hyperdrag, ConnecTable, SyncTap, Stitching, Codex
<b>e</b>	



Category: Interaction techniques

Figure 2.2: The Conduit design pattern

of the expressiveness of the DUI design pattern language. To do so, a sample of DUI projects was compiled by selecting publications that describe fully implemented DUIs. Only publications from 2014 and 2015 were selected to limit the analysis to state of the art work. The preparation of this study took place in the beginning of 2016 and so newer publications were not yet available at the time. The collection procedure resulted in a sample of 29 articles, out of which only 6 have been chosen to be given to the raters, in order not to overload them with too much information. As it was needed to provide DUI descriptions to the raters in a systematic way, a template was designed to ensure that the DUI descriptions would follow the same structure.

## 2.2 Compiling the DUI Descriptions

The previously selected 6 DUIs included:

- Object and ARM shadows (Besacier, Tournet, Goyal, Cento, & Scott, 2014): Object and ARM shadows is a system which proposes to show visual feedback for drag and drop operations on a tabletop in the form of virtual shadow.
- 2. **Duet** (X. A. Chen, Grossman, Wigdor, & Fitzmaurice, 2014): Duet is a system that tracks motion and touch input and extends visual and tactile output to both devices which are smart-phone and smart-watch.
- 3. **Surface Link** (Goel et al., 2014): Surface Link is a system that allows a set of mobile devices lying on the same surface to share information thanks to acoustic and inertial signals.
- 4. **ReflectoSlates** (Martinez Plasencia et al., 2014): ReflectoSlates is a hardware/software system which is aimed to enable users of tabletops in a collaborative setting to see and interact with personal content on a tabletop while allowing other users to see public content at the same place.

- 5. **SurfacePhone** (Winkler, Löchtefeld, Dobbelstein, Krüger, & Rukzio, 2014): Surface Phone is a system that demonstrates the joint system of pico-projector and mobile phone that creates an interactive projection on a table surface.
- 6. Mochatop (Wozniak et al., 2014): MochaTop is a software system that is developed and distributes content over several devices located nearby (for example, lying on a common surface) and allows for joint interaction with this content across all the devices.

A template was then created to provide raters with thorough information about each DUI. This helped ensure that DUI descriptions would follow a similar structure and would be easier for the raters to comprehend. The full article was provided as supplementary material in case the raters needed additional information to better understand how a particular DUI worked. An online (HTML) version<sup>2</sup> of the template was provided in order to make it easier for the raters to navigate through DUIs and access related information (see Figure 2.3). The web-based version of the DUI descriptions also made it possible to include short videos that provided brief overviews of how the particular DUI worked.

For each of these 6 DUIs the following information was included:

- **Description** a summary of what the DUI is;
- Goal the aim of implementing the DUI;
- General need to see what materials are necessary in order to help the DUI work;
- Immediate need to see on-the-go requirements while using the DUI;
- **Problem** the problem that the DUI tries to solve;
- Solution the solution the DUI is going to provide;
- Interaction involved types of interaction the DUI uses;

<sup>&</sup>lt;sup>2</sup>http://lin2.tlu.ee/~amirzp/dui/1.object-and-arm-shadows.html

- Usage setting the usage setting: private, semi-private, public;
- Devices used the kinds of devices used by the DUI;
- Enabling technologies technologies needed to implement the DUI;
- Diagram and Video demonstration of how the DUI works.

## 2.3 Conducting the Rating Exercise

Input from multiple people is a common way for collecting research data. The question of consistency or agreement among the individuals providing research data immediately arises due to the variability among human observers. A well-designed research study must therefore include procedures that measure agreement among the various participants of the study. The extent of agreement among the participants is called "interrater reliability". There are two categories of reliability with respect to study participants: reliability across multiple participants, which is called interrater reliability, and reliability of a single participant, which is called intrarater reliability. According to Stemler (2010), there are a number of statistics that can be used to measure interrater and intrarater reliability. These statistics include Cohen's Kappa (for two raters), the Fleiss Kappa (adaptation of Cohen's Kappa for three or more raters), the contingency coefficient, the Pearson r and the Spearman Rho, the intra-class correlation coefficient, the concordance correlation coefficient, and Krippendorff's Alpha (useful when there are multiple raters and multiple possible ratings).

There have been loads of different types of methods used in order to measure interrater reliability. Previously, interrater reliability was measured as a percent agreement. In order to calculate the percent agreement, the number of agreement scores was divided by the total number of scores. The concept of "agreement among raters" is very simple, and for many years interrater reliability was measured as percent agreement among the data collectors. In order to calculate the measure of percent agreement, first a matrix should

## 1.Object and ARM Shadows

Description	Object and ARM shadows is a system which proposes to show visual feedback for drag and drop operations on a tabletop in the form of virtual shadow. When an object is picked up from the tabletop, its virtual "shadow" either alone or with the shadow of user's arm is shown on the tabletop surface.
Goal	To provide a signifier of the cross-device interaction for a user
General need	Move a virtual object from tabletop to tablet
Immediate need	Track the moved object
Problem	People are unable to track their movement while carrying a virtual object
Solution	A way of showing visual feedback while a user transfers objects "on-the-air" from one touch device to another is proposed.
Interaction involved	Dragging (pick and drop transfer on-the-air)
Usage setting	Private/public interaction (interaction between the users' devices and the shared tabletop)
Devices used	Tabletop, tablet
Enabling technologies	Visual (kinect), touch screen, wifi internet
Diagram	Object Shadow 'pick' Object-plus-Arm Shadow Object-plus-Arm Shadow
Video	Object and Arm Shadows: Visual Feedback for Cross Dex.: 🕐

Figure 2.3: Web-based description of the DUI provided to the raters

be created in which the columns represent the different raters, and the rows represented variables for which the raters had collected data. The cells in the matrix should contain the scores the data collector entered for each variable. At the end the percentage depicts the level of agreement among the raters (McHugh, 2012).

Portney and Watkins (2015) propose different ways of measurement for describing the levels of reliability/agreement among raters based on the ranges of Kappa values. Interrater reliability/agreement was calculated based on the ranges of Kappa values to assess the level of reliability/agreement between the raters. Before calculation it was necessary to provide a rating sheet to the HCI experts participating in the study in a way that could be easy for them to use. The rating sheet was designed so that the 6 DUIs were listed on the top of the sheet and the DUI design patterns were listed on the left side (see Figure 2.4). The task of the raters was to go through the descriptions of the 6 DUIs, either on paper or by using the web version, and to assign the DUI patterns that in their opinion best described the interactions depicted by the particular DUI. On the rating sheet the patterns were sorted alphabetically and the DUIs were sorted in the same sequence used in the web-based version.

Afterwards, to calculate the level of agreement among raters, the responses of the raters were collected into separate spreadsheets based on the number of DUIs. In an individual spreadsheet the columns represented different raters and the rows represented the design patterns.

## 2.4 Specifying the Profile of the HCI Experts

In order to conduct the rating exercise it was necessary to identify the HCI experts that would participate in the study. To do so, a description of the HCI expert profile was composed to simplify the process of looking for the experts (see Figure 2.5). In the template, the information regarding each HCI expert was categorised into two major parts: **experience** and **background**.

DUIs	1. Object and ARM shadows	2. Duet	3. SurfaceLink	4. ReflectoSlates	5. SurfacePhone	6. MochaTop
Bumping						
Chucking						
Codex						
Conductor						
ConnecTable						
Cross-Device Drag-and-Drop						
Cross-Device Pinch-to-Zoon						
DisplayStacks						
Drag-and-Pick						
Drag-and-Pop						
EasyGroups						
Face-to-Mirror the Full Scree	n .					
HandLaser						
HandMouse						
HeadLaser						
HeadMouse						
HyperDrag						
Interface Currents						
Lift-and-Drop						
MobiES						
MultiSpace						
PaperVideo						
Perspective-Aware Interfaces	•					
Pick-and-Drop						
Pinch						
Portals						
Retrieving						
Select-and-Point						
Send-to-Me						
SharedViews						
Shuffling						
Slurp						
Stitching						
SyncTap						
Taking						
That One There!						
The Conduit						
Throwing						
Throwing (MobiComics)						
Tilt-to-Preview						
Touch-and-Connect						
TranSticks						
Ubiquitous Graphics						
Vacuum						
Video Wall						
VisPorter						
Voting						

Figure 2.4: Rating exercise sheet

The experience section addressed the responsibilities HCI experts had in different design and development projects they participated in, the number and types of projects they worked on, and whether they had any experience in cross-device interaction design.

In the background section, the main focus was on the work history and education of the expert. It was essential to know if the expert is active in design/IT occupation or working in academia in the field of HCI or interaction design or any related field. Also, it was important to know if the expert had any education related to HCI or cross-device interaction design. Besides, it was important to know if the person was located in Tallinn or not. In case the expert was not local, it would be necessary to contact him/her via Skype and conduct the study remotely. Still, the main focus was on the experts located locally to ease the study procedure.



**HCI expert** 

Experience: Responsibilities, type of projects

Level 3-4 years, mid-to-professional level

Requirements Experience with cross-device interaction design

**Projects** Cross-device interaction solutions and multi-platform interaction methodologies Background: Work history, education, location

Status Currently or recently employed in a design or IT occupation, or working in academia in the field of HCI/Interaction design

Education Interaction design, human-computer interaction, cross-device interaction design

Career Path Spent 1 or 2 years at a company as a UX/UI designer or spent 1 or 2 years at school of interaction design/HCI

Location Based in Tallinn or available remotely over Skype

Figure 2.5: The HCI expert sample profile

## 2.5 Designing the Questionnaire

The purpose of conducting the questionnaire was two-fold: first, it was necessary to measure the level of cognitive workload in order to assess the task's effectiveness and performance by using a well-known measurement tool - the NASA Task Load Index (NASA-TLX). Second, it was necessary to identify the issues related to the usage of the pattern language, and see what needs to be improved in the pattern language by collecting additional feedback about the pattern language from the HCI experts, and analyse it by using qualitative content analysis.

The questionnaire was composed of three major parts:

- **Demographical information** including age, gender, and fields of activity of the HCI expert;
- Measurement of workload using the NASA-TLX;
- Follow-up questionnaire including 9 open-ended questions for collecting additional feedback about the pattern language from the HCI experts.

At the end of the questionnaire contact information of the raters was collected for following up in case there would be a need for clarification.

#### 2.5.1 Providing Demographical Information

Conducting the demographic information of the participants, was very important for this thesis. As the survey targets specific group of people (HCI experts), the demographic information depicts that if the target audience is reached or not. On the other side, as it was aimed for a representative sample of a population, knowing demographic characteristics of each participants would help in determining how close the sample replicates the population.

For this section, questions about age, gender and field of activity of the HCI expert were asked in order to get to know what different age groups HCI experts have; what different genders they have and what field of activity they are involved in.

#### 2.5.2 Measurement of Workload

Workload is difficult to conceptualise as shown by the following definitions. Workload can be defined as "the relative capacity to respond" (Lysaght, Hill, Dick, Plamondon, & Linton, 1989). "Workload is a construct that is used to describe the extent to which an operator has engaged the cognitive and physical resources required for a task performance" (Backs, Ryan, & Wilson, 1991). "Workload is a multidimensional and complex construct that is affected by external task demands, environmental, organizational and psychological factors, and perceptive and cognitive abilities" (Weinger, Reddy, & Slagle, 2004). These three definitions show that workload is a difficult concept to define and that workload consists of several components.

There are different approaches to measuring workload such as using the Cooper-Harper Scale, the perceived workload scale, the Subjective Workload Assessment Technique (SWAT), the Workload Profile (WP), the Rating Scale Mental Effort (RSME), or the NASA-Task Load Index (NASA-TLX) (Hill et al., 1992). For this thesis, the NASA-TLX has been chosen.

NASA TLX was originally developed more than 20 years ago to measure workload in aviation (G. Hart Sandra, 2006; S. G. Hart & Staveland, 1988). The NASA-TLX is one of the most widely used instruments for assessing the overall subjective workload. The NASA-TLX is a multidimensional instrument that consists of 6 sub-scales: Mental Demand (MD), Physical Demand (PD), Temporal Demand (TD), Frustration (FR), Effort (EF), and Performance (PE) (see Figure 2.6<sup>3</sup>). Twenty-step bipolar scales are used to obtain ratings on these dimensions, resulting in a score between 0 and 100. The underlying assumption of the instrument is that the combination of these 6 dimensions is likely to represent "workload" experienced by operators (G. Hart Sandra, 2006).

Name	Task		Date
Mental Demand	Hov	v meritally den	nanding was the task?
Very Low			Very High
Physical Demand	How physica	lly demanding	) was the task?
Very Low			Very High
Temporal Demand	How hurried	or rushed was	the pace of the task?
Very Low			Very High
	How success you were ask		n accomplishing what
Perfect			Failure
		d you have to performance?	work to accomplish
Very Low			Very High
	How insecur and annoyed		d, irritated, stressed,
Very Low			Very High

Figure 2.6: NASA-TLX workload rating sheet

According to literature, NASA-TLX is a reliable and valid instrument for workload measurement. Furthermore, NASA-TLX is easy to administer, especially when using the raw

<sup>&</sup>lt;sup>3</sup>https://en.wikipedia.org/wiki/NASA-TLX

scores instead of the weighted scores (Hendy, Hamilton, & Landry, 1993; Nygren, 1991). Finally, NASA-TLX is one of the few instruments that include a measurement of physical workload.

For each of the six dimensions of workload measurement in NASA-TLX there is an accompanying description that the subject should read before rating. Each dimension is rated for every task within a 100-point range with 5-point steps. These ratings are then combined to form the overall task load index. Accompanying descriptions for each measurement can help participants answer more accurately. The descriptions are as follows:

- Mental Demand How much mental and perceptual activity was required? Was the task easy or demanding, simple or complex?
- **Physical Demand** How much physical activity was required? Was the task easy or demanding, slack or strenuous?
- **Temporal Demand** How much time pressure did you feel due to the pace at which the tasks or task elements occurred? Was the pace slow or rapid?
- Overall Performance How successful were you in performing the task? How satisfied were you with your performance?
- Frustration Level How irritated, stressed, and annoyed versus content, relaxed, and complacent did you feel during the task?
- Effort How hard did you have to work (mentally and physically) to accomplish your level of performance?

#### 2.5.3 Administering the Follow-Up Questions

The aim of this part of the questionnaire was to get thorough feedback from HCI experts regarding the usage of the pattern language. The aim was to see what needs to be modified or added to the pattern language and how it could be improved. This section included 9 questions and the HCI experts were able to answer any of them. The questions were mainly focused on the features of the pattern language and were meant to explore whether there is a need for specific improvements.

### 2.6 Introducing the Study Procedure to HCI Experts

To ensure a higher success rate of the overall study, the HCI experts had to be carefully introduced to the procedure in a way that would be clear and easy for them to understand. A script was designed to ensure that all experts would follow the same procedure. The HCI experts were introduced to the study procedure as follows. First, the pattern language was shown to the HCI experts and the navigation in the pattern language was demonstrated. Second, descriptions of 6 DUIs were provided to the HCI experts and they could see all the relevant information for each DUI. Third, the HCI experts read through each DUI description and assigned the DUIs to any corresponding pattern in the pattern language. After doing the rating exercise, the questionnaire was provided to the experts to gain thorough feedback about using the pattern language.

## 2.7 Piloting the Study

For the pilot phase it was decided to do the rating exercise with two HCI experts and then do it with another four in the main phase. The reason behind it was to see if there is any necessary modification before the main study. The participants in the pilot phase were both from industry and they had experience of cross-device interaction design. They were both working in IT companies in Tallinn. In the pilot phase, the pattern language was introduced to the raters with full explanation of some sample patterns. The patterns which were explained to the HCI experts were selected from the patterns with different families, so that the raters could have an understanding of each of the different pattern families. In addition, the six DUIs with accompanying descriptions were provided. Afterwards, the rating sheet was provided. The results of the pilot study suggested that there was no specific need to improve the study procedure or the materials provided to the raters.

#### 2.8 Conducting the Main Study

After finishing the pilot phase with the two raters, the main phase has been conducted to assess how effectively the patterns can be used for analysing existing DUIs. The study has been carried out in the same way that the pilot phase has been conducted, but this time with four raters. This time the study participants were from both academia and industry, both male and female. In order to find the right participants, their social profile was checked via LinkedIn. The portfolio of each participant was checked assessed to see if the participants had any experience in designing cross-device interactions. The time to carry out the study differed for each participant based on individual levels of understanding. Some of the participants had to read the information about the DUIs and patterns multiple times. Also, some of the participants used to ask questions during the study as they encountered misunderstandings. The average duration for doing the rating exercise for each participant was about two hours. The average time for filling out the survey was about twenty minutes. After finishing the study, participants were asked to verbally provide any additional feedback about the pattern language. Most of the participants were happy about the features of the pattern language and they have stated that there is sufficient information in it. Also, they stated that the pattern language was totally new to them and they have not seen anything similar before.

#### Chapter 3

#### Analysis

The previous chapter discussed how the study was conducted, how the information was collected, what methodologies were used. In this chapter as there were different parts to analyse, the procedure of the analysis of each section has been provided separately.

#### 3.1 Demographic Information

The cluster sampling approach was used in order to select the target audience for this study. In this approach the total population is divided into groups (or clusters) and a simple random sample of the groups is selected. Cluster sampling is a sampling technique used when "natural" but relatively heterogeneous groupings are evident in a statistical population. Each cluster should be a small-scale representation of the total population. The clusters should be mutually exclusive and collectively exhaustive. The technique gives more accurate results when most of the variation in the population is within the groups, not between them. A random sampling technique is then used on any relevant clusters to choose which clusters to include in the study. The clusters that has been selected for the purpose of this thesis were mainly in academia and industry, but other related clusters were considered to be included as well (see Figure 3.1).

Age categorisation will often determine knowledge and experience of the person with the

focus they have on the skills and the working tasks that they encounter in their professional activities. The age group that was involved in the study is between 18 to 44 years of age (see Table 3.1).

Age group	Count	Percentage
18 - 24	1	17%
25 - 34	2	33%
35 - 44 years of age or older	3	50%

Table 3.1: Age group distribution of the study participants

Out of six participants of the rating exercise three were female and three were male. For the purpose of this thesis knowing the gender was very important because depending on the gender there would be different workload measurement which will be discussed in the next section. And as the workload has been measured it was needed to identify the genders in advance.

In order to choose the correct participants it was decided that the participants can be from two major groups: academia and industry. Within both groups the targeted participants were people with experience in cross-device interaction design and HCI. There was the possibility to include people from another group who would have related experiences. These were mainly people who had the experience of working in the HCI community, but might have no specific education in this field, and their experience was gained through doing multiple projects (see Figure 3.1).

Furthermore, having experience related to cross-device interaction design was essential in choosing the correct participants. It was expected to find people who had done real projects in this area, therefore they could have provided better and more thorough information for the goal of the study. Participants selected for this study all had experience of designing cross-device solution, except for two who had been involved in similar projects and were still included in the sample. The similar projects that they had done was still related to cross-device interaction design but they were not designing a new artefact. they were working on the existing design and improving it.

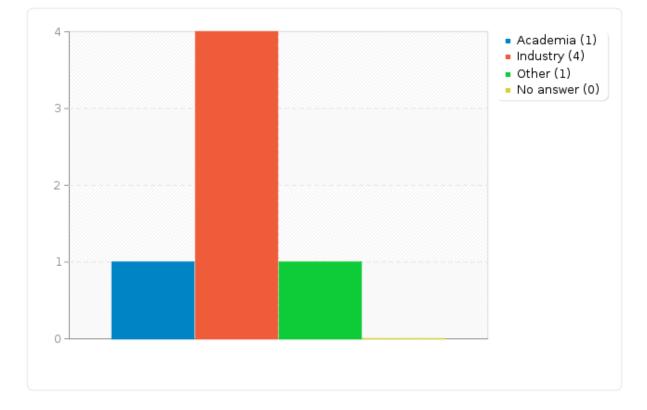


Figure 3.1: Fields of activity of the study participants

#### **3.2** Rating Exercise

According to Portney and Watkins (2015) there are two different types of reliability: **Test-Retest Reliability** and **Rater Reliability**. For the purpose of this study, rater reliability has been chosen, because it was needed to see how the HCI experts use patterns to analyse existing DUIs. According to Portney and Watkins (2015) in statistics interrater reliability, inter-rater agreement, or concordance is the degree of agreement among the raters. It gives a score of how much homogeneity (or consensus) there is in the ratings given by different raters. There are different types of statistics for reliability calculation as it has been discussed before. Reliability is different to correlations in that they take into account the amount of agreement that could be expected to occur through chance.

For the purpose of this thesis, the intra-class correlation coefficient (ICC) was used. The reason is that the data, which has been gathered during the rating study, is quantitative. Fleiss' Kappa and Cohen's Kappa are mainly dealing with qualitative data, while ICC can estimate inter-rater reliability based on quantitative data because of its high flexibility.

#### 3.2.1 Intra-Class Correlation Coefficient (ICC)

ICC is a descriptive statistic that can be used when quantitative measurements are made on units that are organised into groups. It describes how strongly units in the same group resemble each other. The ICC is used to assess the consistency, or conformity of measurements made by multiple observers measuring the same quantity. The assumptions related to ICC are that:

- The raters should be fully independent, meaning that the raters have no influence on each other;
- The data should be normally distributed among the raters;
- The data should be continuous/quantitative.

In this study, as the data are the numbers of assignment from each rater for each specific DUI and those numbers have no other value, then it can be concluded that the data is quantitative, and so the ICC is the appropriate statistic for calculating the level of agreement/reliability among the raters for this study.

In order to calculate the ICC Kappa value, there were 47 cases (patterns) assigned by 6 raters to 6 variables (DUIs). This dataset had to be assessed in terms of finding out the agreement/reliability among the raters. As there were a total of 6 variables, then the main dataset had been divided into 6 datasets (separate dataset for each variable). So the challenge in this step was that the data from each of the raters was collected separately and stored in different datasets as it was needed to have a different dataset for each variable. After creating the dataset for each specific variable, the ICC Kappa value had been calculated with IBM SPSS. The challenge with calculating the ICC was to identify the correct type and form of ICC for this study, because depending on the type of ICC there will be different results. There are three distinct models of ICC where each model has two types with the descriptions for each model and type provided below:

1. Model 1 - each subject is assessed by a different set of randomly selected raters.

- ICC (1,1): Each subject is assessed by a different set of randomly selected raters and the reliability is calculated from a single measurement.
- ICC (1,k): As above, but reliability is calculated by taking an average of the k raters' measurements.
- 2. Model 2 each subject is assessed by each rater and raters have been randomly selected.
  - ICC (2,1): Each subject is measured by each rater and raters are considered representative of a large population of similar raters. Reliability is calculated from a single measurement.
  - ICC (2,k): As above, but reliability is calculated by taking an average of k raters' measurements.
- 3. Model 3 each subject is assessed by each rater, but the raters are the only raters of interest (meaning that there is a specific group of raters).
  - ICC (3,1): Each subject is assessed by each rater, but the raters are the only raters of interest. Reliability is calculated from a single measurement.
  - ICC (3,k): As above, but reliability is calculated by taking an average of k raters' measurements.

Table 3.2 shows the definition of each model as presented in IBM SPSS.

ICC type	Name in SPSS
ICC (1,1)	One-way random single measures
ICC $(1,k)$	One-way random average measures
ICC $(2,1)$	Two-way random single measures
ICC $(2,k)$	Two-way random average measures
ICC (3,1)	Two-way mixed single measures
ICC $(3,k)$	Two-way mixed average measures

Table 3.2: Different Types of ICC and their names in SPSS

In order to choose the correct type of ICC, there are two questions that should be answered:

- 1. Are there consistent raters for all variables? For example, do the exact same 6 raters make ratings for every variable?
- 2. Is there a sample or population of raters?

If the answer to Question 1 is "yes" and the answer to Question 2 is "population", then ICC(3) should be chosen (population means that there are a number of existing raters). In SPSS, this is called "Two-Way Mixed." This ICC makes the same assumptions as ICC(2), but instead of treating rater effects as random, it treats them as fixed. This means that the raters in the task are the only raters of interest for the study. Hence, for the purpose of this thesis ICC (3) is the correct model. But as it has been discussed before, there are two different types of ICC measurement for each model. The types are: **Consistency** and **Absolute agreement**. Consistency is the default type which has been selected by SPSS, but Absolute agreement should be used whether the errors involved in the measurement are systematic or not. So choosing the type in this case is not an important issue, but still for this thesis Consistency was chosen because in this case it is not needed to work with the errors involved in the measurement; and for the purpose of this thesis it is not important to determine if the errors are systematic or not. In the procedure all six datasets were analysed and the data was extracted.

According to Table 3.3 which has been introduced by Cicchetti (1994) the level of agreement differs depending on the range of output. The average measure ICC among the raters has been calculated to see how reliable the measurement is. Also the average measure ICC is an index for the reliability of different raters averaged together. This ICC is always higher than the single measure ICC. The value produced by this ICC in this study is 0.60, which means that there is a **Good** level of agreement among the raters. Also, it means that the pattern language and DUIs are reliable enough for the raters (HCI experts) in a way that it is easy to distinguish and differentiate among the patterns and it is possible to use these patterns in order to assess existing DUIs.

Kappa statistic	Strength of agreement
< 0.40	Poor
0.40 - 0.59	Fair
0.60 - 0.74	Good
0.75 - 1.00	Excellent

Table 3.3: Scale for interpreting Kappa values

#### **3.3** Measurement of Workload

NASA-TLX was used in order to measure the level of cognitive workload participants experienced when engaging in the rating exercise. It is possible to administer NASA-TLX in two ways. It can be administered through either an online version or a paper and pencil version. The paper and pencil version includes rating scale definitions, sourcesof-workload comparison cards, a rating sheet, a sources-of-workload tally sheet, and a weighted rating worksheet. The version which has been used for the purpose of this thesis is the paper and pencil version, but the rating sheet was provided to the raters through on online questionnaire in order to make the raters' task easier.

The NASA-TLX is a two-part evaluation procedure consisting of calculating weights and ratings. The first requirement was for each rater to evaluate the contribution of each factor (its weight) to the workload of a specific task. There are fifteen possible pair-wise comparisons of the six scales. Each pair is presented on a card (see Appendix A). Raters circled the member of each pair that contributed more to the workload of the task. The numbers of times that each selected factor was tallied. The tallies can range from 0 (not relevant) to 5 (more important than any other factor). The second requirement was to obtain numerical ratings for each scale that reflect the magnitude of that factor in the given task (this part was done through the questionnaire). The scales are presented on a rating sheet (see Appendix B). The ratings exercise was conducted following the entire task (after finishing the rating exercise for measuring the reliability/agreement among the raters). By finishing these steps the overall workload score for each rater was calculated by multiplying each rating by the weight given to that factor by that rater. The sum of the weighted ratings for each task was divided by fifteen - the sum of the weights (see Appendix C and D for a sample Tally Sheet and Worksheet).

The procedure for collecting data with the NASA-TLX was as follows:

- 1. Instructions: Raters read the scale definition and instructions.
- 2. Familiarisation: Raters practised using the rating scales after performing a few tasks to ensure that they have developed a standard technique for dealing with the scales.
- 3. **Ratings:** Raters performed the tasks, providing ratings on the six sub-scales following all task conditions of interest.
- 4. Weights: Raters completed the "Source-of-Workload Evaluation" for the tasks included in the study.

The procedure for calculating the weighted workload score was two-fold:

- 1. Tally sheet: For each rater the "Source-of-workload Tally Sheet" was used to calculate the weight for each factor. The raters used the evaluation cards and put a mark on the appropriate row of the tally column for each response. After doing the Source-of-Workload evaluation, the tallies for each scale were added and the totals were written in the "Weight" column.
- 2. Worksheet: The weight column for the tally sheet was then transferred to the "Weighted Rating Worksheet". Each rater had his or her individual workload parameter count placed on a separate worksheet for the appropriate task. Ratings were placed in the "Raw rating" column of the worksheet. The "Adjusted Rating" was formed by multiplying the **Raw Rating** by the **Source-of-Workload Weight**. The adjusted ratings were summed across the different scales. The sum was divided by fifteen to obtain the overall weighted workload score for the raters in the task condition.

Table 3.4 depicts an example of workload calculation for rater two. The overall weighted workload is 47. Figure 3.2 depicts the composition of the weighted workload score. This bar graph shows the area of rating between 0 to 100 and the six sub-scale ratings. Data was analysed to examine the possible relationship between raters and workload. Results show no statistically significant differences in workload between the raters with an exception for frustration level, which increases based on the level of the knowledge and experience of one of the raters. As the level of the knowledge of the rater decreases in a specific section of the task, the level of frustration increases accordingly. This is because the rater needs to put more effort in order to fully understand the specific matter. The results depicted that the average amount of workload among the HCI experts is less than 50.

Scales	Rating	Tally	Weight
Mental Demand	60	4	0.26
Physical Demand	70	3	0.20
Temporal Demand	45	1	0.06
Performance	30	3	0.20
Effort	25	3	0.20
Frustration	45	1	0.06
Overall = 47			

Table 3.4: Example of workload calculation for rater two

#### 3.4 Follow-up Questionnaire

The open-ended follow-up questions in the questionnaire were analysed by using the conventional content analysis approach. According to Hsieh (2005), qualitative content analysis is defined as a research method for subjective interpretation of the content of text data through the systematic classification process of coding and identifying recurring themes. Also Hsieh (2005) mentions that the goal of content analysis is "to provide knowledge and understanding of the phenomenon under study". Content analysis includes three distinct approaches: conventional, directed or summative.

According to Emmert and Barker (1989), qualitative content analysis includes seven steps:

1. Formulating the research question to be answered;



Figure 3.2: Composition of the weighted workload score

- 2. Selecting the sample to be analysed;
- 3. Defining the categories to be applied;
- 4. Outlining the coding process and the coder training;
- 5. Implementing the coding process;
- 6. Determining trustworthiness;
- 7. Analysing the results of the coding process.

The process may differ depending on the specific content analysis approach used. The most important step in any kind of content analysis is the coding part. So if the coding part is done in a correct way, then it means that the content analysis will be successful. The approach selected for conducting the analysis of the follow-up questionnaire in this thesis is summative content analysis. According to Hsieh (2005), summative content analysis evaluates the data as a whole, the text is often approached as single words or in relation to particular content. Analysis of the patterns leads to an interpretation of the

contextual meaning of specific terms or content. In summative content analysis, analysis begins with keywords and the keywords are identified before and during data analysis. Also keywords are derived based on the interest of the researcher. On account of this, it was decided that this approach is the most appropriate approach for the purpose of this thesis.

The follow-up questionnaire was coded and the content of answers analysed. Terms such as "working features", "ease of use", and others were coded as the main aspect of the follow-up questionnaire. It was expected to see how people express their thoughts about the pattern language in terms of: usage of the pattern language, navigation through the pattern language, finding relevant information in the pattern language, exploring what features of the pattern language work and what features do not work, finding out what features were easy to use and what features were difficult to use, discovering the missing parts of the pattern language, determining if there is a sufficient amount of patterns in the pattern language and detecting if there should be more or less patterns in it, and finally providing any additional feedback about the pattern language. Figure 3.3 shows the main topics and sub-topics resulting from the content analysis.

With the help of NVivo (a widely used research tool), data objects were analysed and codes identified. By using Microsoft Excel, the answers of each HCI expert were gathered in a different file and added to NVivo for coding and analysis. In order to do the analysis;

The overall data analysis procedure was as follows. First, data was imported into NVivo. Then data was categorised based on the HCI expert profile, so that it could be easy to find information related to each study participant. Data was coded based on the texts that the HCI experts provided. After coding the data for each participant, the code density for each participant was measured (see Appendix E for an example).

Topics and sub-topics	References	Example Survey text
Working features: Features that worked well in the pattern library <ul> <li>Navigation Bar</li> <li>Summary Tab</li> <li>The search</li> <li>Visuals</li> </ul>	6	"Visual explanations", "Pictures explained the most", "The search because I used only this to find the necessary patterns", "Visuals and examples", "The navigate menu is helpful in sorting the patterns according to specific needs", "Summary provides thorough information".
Not working features: Features which didn't work properly in the pattern library • Functionality of search • Long descriptions • Repetition of patterns' information • Pictures • Same descriptions for some patterns	5	"When the intro of a pattern was repeated to other patterns", "Descriptions are a bit too long. Would love to have really simpler technical drawings. Darwing looked too similar sometimes", "The search didn't show the results by the second or third word in the name (e.g. when I searched for Conduit, it didn't display the conduit as a result. I had to type The in front of it). Also, some of the capitalization affected the results.", "Pattern part of same families often had same description and visuals, though better would be to keep them separate (probably)", "Pictures weren't clear enough sometimes".
Easy to use: Features which was easy to use in the pattern library <ul> <li>Navigation</li> <li>Search</li> </ul>	3	"Navigation was fine. Simple.", "Navigation was easy to use", "Search was easy to use".
Difficult to use: Features which was Difficult to use in the pattern library · Family tree · Images	4	"The images sometimes had more than one example, which makes it hard to understand which one you are looking at", "I found no problem with navigation", "Spot the family tree of the pattern", "All was ok!".
Relevant information: Possibility to find the relevant information Filtering	6	"Could find the relevant information".
Missing parts in the pattern library: Features or datas which were missed in the pattern library • Alternative examples • Simplified Diagrams • Video	3	"More alternative examples and diagrams perhaps", "Some of the diagrams and examples were too simplified for me to get a thorough understanding. In some cases, the same description applied to more than one interaction, therefore I wasn't sure why interactions of the same group (or project) were separated. the description could be divided so that each interaction in the group would have an indivisual, specific description." "I think videos of patterns were missing in the library".
Description clarity: Clarity of the descriptions of each pattern in the pattern library Possibilities Shorter version Text-based understanding	6	"Descriptions were clear enough to understand", "Nobody really reads, so a shorter version of everything is always better", "Mostly understandable. I didn't understand some of the patterns' possibilities device-wise (e.g. What kind of screens or surfaces they apply to)", "In most cases it was understandable. Although, for me personally it is difficult (time consuming) to try to comprehend interactions solely based on the text.",
Sufficient number of patterns: Determing the sufficient number of patterns in the pattern library · Enough	5	"There are enough patterns in the library", "There are more than enough patterns in the library".
Additional feedback: Getting additional feedback about the pattern library	2	"I feel like specialist now", "Good Job!".

Figure 3.3: Questionnaire topics, content analysis codes and example survey texts

### Chapter 4

### Discussion

The aim of this study was to assess how the DUI pattern language can be used to support analysis of existing DUIs. This assessment was necessary to understand whether outside HCI experts can successfully use the pattern language in their work without encountering excessive cognitive load while also being able to differentiate between individual pattern descriptions.

The aim of the current study was to answer three research questions:

- Can a reasonable level of reliability/agreement be reached when using the DUI pattern language to assess existing DUIs?
- How cognitively demanding is using the pattern language for assessing existing DUIs?
- What aspects of the pattern language would need to be improved to better support the assessment of existing DUIs?

To answer these questions, various methodologies were used. The aim was to achieve a reasonable level of reliability/agreement among the HCI experts to see how they can differentiate between the patterns and navigate through the pattern language. According to Landis and Koch (1977) and Portney and Watkins (2015), the level of agreement can be measured by a statistical measurement called Kappa. The result of the analysis suggested that there is a "Good" level of agreement among the HCI experts, meaning that the HCI experts were able to identify individual pattern easily and navigate through the pattern language without facing any problems.

In addition, the aim was to calculate the level of perceived cognitive workload while using the pattern language in order to identify how effectively the language can be used for DUI assessment. According to Hendy et al. (1993) and Nygren (1991), NASA-TLX is one of the best tools for measuring perceived workload. Results depicted that there is no statistically significant difference in workload among the HCI experts, except for one case, were the results of the NASA-TLX were influenced by the expert's lack of familiarity with the topic of DUI design. This means that using the pattern language for DUI assessment is effective and not excessively demanding.

Finally, the aim was to see what features of the pattern language are more useful for the HCI experts and what aspects can still be improved. According to Hsieh (2005), qualitative content analysis is the best methodology to achieve this aim. It was identified that features of the Semantic MediaWiki, such as the navigation bar, visual descriptions of individual patterns, and search, are the main features that the HCI experts tend to use while browsing for appropriate design patterns.

The navigation bar is located on the top side of the MediaWiki and helps the user understand the overall structure of the Wiki. This was one of the first features that attracted the attention of the experts during the study. They could easily choose or select what they were looking for by different categories, as provided in the navigation bar.

Visual descriptions were mainly those diagrams included in the description of each pattern in the pattern language. Visuals helped the HCI experts better understand the patterns and features related to each pattern. Visuals could be only diagrams and pictures or also videos available for some of the DUIs.

Search was one of the most used features. In some cases, HCI experts wanted to search

for a specific pattern in the pattern language and they had to put exactly the same name as the pattern had, otherwise the search could not show the exact query. As an example, an HCI expert wanted to look for a pattern called Conduit. She had to put the word "The" before the name of the pattern, otherwise search could not find the pattern. This shortcoming can make searching for necessary patterns more difficult and needs to be improved in the future.

The following limitations were identified while conducting the study and afterwards reflecting on the overall process. One of the limitations was that as the preparation of the study was conducted at the beginning of 2016, only publications from 2014 and 2015 were chosen as at the time it was not possible to select newer publications. For this reason, the 6 examples of DUIs that were provided to HCI experts were not state of the art.

Another limitation was the small number of HCI experts located in Tallinn and willing to participate in the study. While Estonia is a country with a strong focus on ICT, unfortunately the number of HCI experts residing in Tallinn is still fairly limited. In addition to this, most of the experts were very busy and scheduling appointments with them was rather difficult. For this reason, it was not possible to include more participants in the study and thus benefit from a large sample.

#### 4.1 Future Work

The outcomes of the study suggested that there are several ways in which the current version of the pattern language could be improved. One possibility is providing videos along with each pattern description in order to give a more thorough overview of the pattern to the user. This way the user would understand the patterns better and use them more effectively. Alternative examples and simplified diagrams can also be provided in order to lower the level of frustration of the reader. At the moment, some of the accompanying diagrams are a bit complicated to comprehend for the user as the pattern descriptions include a lot of technical illustrations. Another area of improvement is the search functionality. By making search more flexible, it will be easier for the user to navigate through the pattern language and find the desired patterns quicker.

While this study focused on the analysis of existing DUIs, another direction of research is exploring how HCI experts can use the pattern language in designing new DUIs. While analysing existing DUIs is one of the first steps for learning from existing design knowledge, applying design patterns in the design of new DUIs is entirely different. Addressing both of these aspects will help ensure that the pattern language can be successfully used for supporting the design of DUIs.

### Chapter 5

#### Conclusion

The aim of this work was to assess whether the pattern language supports the analysis of existing DUIs. To achieve this, the level of agreement among HCI experts was calculated to see how reliable the pattern language is. The level of agreement achieved in this study is **Good**. According to Cicchetti (1994), this level of agreement means that the pattern language is reliable enough and outside HCI experts have a good level of agreement on this matter. This means that it is possible for them to understand the pattern language in an appropriate manner and use it in their DUI design work.

It was also important to see how cognitively demanding using the pattern language is. By calculating the workload of using pattern language by using the well-known NASA-TLX measurement tool, it was calculated that the amount of perceived workload among the HCI experts is less than 50 (based on NASA-TLX score, which is between 0 and 100). This means that using the pattern language for assessing DUIs is not demanding and does not acquire a high level of workload, so that HCI experts can use the pattern language effectively. This also suggests that the pattern language is easy to use and comprehend for users.

Finally, it was demonstrated that HCI experts can successfully analyse existing DUIs by using the pattern language. By implementing a follow-up questionnaire, it was understood which features of the pattern language work well and which features do not, what is easy to use and what offers a bit of frustration for the users, what are the limitations of the pattern language, how clear the descriptions of the patterns are, how relevant is the information provided for each pattern and eventually how users could find relevant information related to the DUIs.

It can be concluded that the pattern language is useful for analysing existing DUIs as it is easy to navigate its structure, there is a "Good" level of reliability/agreement among the HCI experts using the pattern language for DUI analysis, the perceived workload of using the pattern language is low and using it does not require significant cognitive effort. There is now also a concrete list of features that need to be improved to make the task of using the pattern language more effective.

### Chapter 6

### Kokkuvõte

Antud magistritöö keskendub hajutatud kasutajaliideste mustrikeele rakendamisele hajutatud kasutajaliideste analüüsimiseks. Tegemist on mustrite kogumiga, mis on abiks inimese ja arvuti interaktsiooni teadlastele ja praktikutele seadmeüleste kasutajaliideste disainimisel.

Töö eesmärgiks oli kindlaks määrata, kas mustrikeel on olemasolevate hajutatud kasutajaliideste analüüsimisel kasulik. Praegune mustrikeel vajas hinnangut, kuna disainimustrite kirjeldused põhinesid kirjanduse ülevaatel ja vastasid ainult mustrikeele koostaja arusaamale. Mustrikeel ei olnud testitud väliste inimese ja arvuti interaktsiooni ekspertidega, kes igapäevaselt tegelevad seadmeüleste kasutajaliideste kavandamisega ja arendamisega.

Töö eesmärgiks oli leida vastused kolmele uurimisküsimusele:

- 1. Kas on võimalik saavutada mõistlikul tasemel usaldusväärsus/üksmeelsus kasutades mustrikeelt olemasolevate hajutatud kasutajaliideste hindamiseks?
- 2. Kui nõudlik on mustrikeele kasutamine?
- 3. Mis vajab veel täiustamist mustrikeeles?

Töö eesmärgi saavutamiseks viidi läbi hindamisülesanne ja küsitlus. Hindamisülesanne viidi läbi, et mõõta usaldusväärsust/üksmeelsust inimese ja arvuti interaktsiooni ekspertide seas. Üksmeelsuse taset mõõdeti kasutades Intra-klassi korrelatsioonikordajat (ICC). Et saada lisaandmeid mustrikeele kasutamisest, kasutati järgmisi vahendeid: (1) NASA-TLX ülesande koormuse indeks, et hinnata töökoormust, (2) avatud täiendav küsimustik, et koguda tagasisidet mustrikeelest inimese ja arvuti interaktsiooni ekspertidelt. Täiendava küsimustiku eesmärgiks oli teada saada, mis vajab veel täiendamist mustrikeeles ja mis on kõige väärtuslikumad omadused mustrikeeles inimese ja arvuti interaktsiooni ekspertide jaoks, selles, mis aitavad neil analüüsida olemasolevaid hajutatud kasutajaliideseid.

Hindamisülesande tulemused, NASA-TLX väärtused ja küsimustiku vastused näitavad seda, et hajutatud kasutajaliideste mustrikeelt on võimalik oma praegusel kujul kasutada, et toetada olemasolevate hajutatud kasutajaliideste analüüse, ilma, et see vajaks olulist kognitiivset pingutust ja et see tekitaks liigset frustratsiooni.

Uuringu tulemused näitasid, et on mitmeid viise, kuidas praegust mustrikeelt oleks võimalik täiendada. Üheks võimaluseks oleks pakkuda videoid koos mustrite kirjeldustega, et anda kasutajale põhjalikum ülevaade mustritest. Kasutusel võiksid olla ka alternatiivsed näited ja lihtsustatud skeemid/diagrammid, et vähendada lugeja rahulolematust.

Kuigi antud töö keskendus olemasolevate hajutatud kasutajaliideste analüüsidele, siis teine uuringusuund on välja selgitada, kuidas inimese ja arvuti interaktsiooni eksperdid kasutavad mustrikeelt uute hajutatud kasutajaliideste kavandamisel.

# Appendix A

# Sources-of-Workload Comparison Cards

Effort	Temporal Demand
Or	Or
Performance	Frustration
Temporal Demand	Physical Demand
Or	Or
Effort	Frustration
Performance	Physical Demand
Or	Or
Frustration	Temporal Demand
Physical Demand	Temporal Demand
Or	Or
Performance	Mental Demand
Frustration	Performance
Or	Or
Effort	Mental Demand
Performance	Mental Demand
Or	Or
Temporal Demand	Effort
Mental Demand	Effort
Or	Or
Physical Demand	Physical Demand
Frustration Or Mental Demand	

Figure A.1: Sources-of-Workload Comparison Cards (Human Performance Research Group, 1986)

### Appendix B

### NASA-TLX Rating Scale

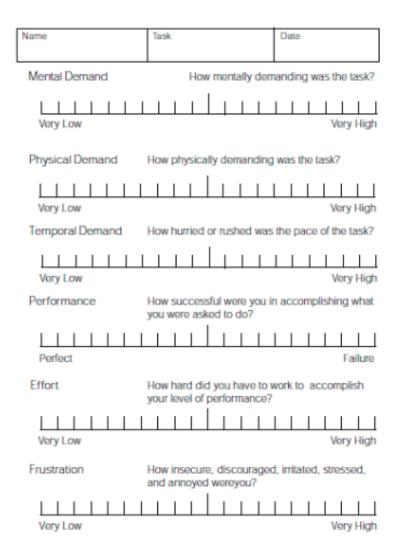


Figure B.1: NASA-TLX Rating Scale (Human Performance Research Group, 1986)

# Appendix C

### Source-of-Workload Tally Sheet

SOURCES-OF-WORKLOAD TALLY SHEET		
Scale Title	Tally	Weight
MENTAL DEMAND		
PHYSICAL DEMAND		
TEMPORAL DEMAND		
PERFORMANCE		
EFFORT		
FRUSTRATION		
Total count =		

Figure C.1: Source-of-Workload Tally Sheet (Human Performance Research Group, 1986)

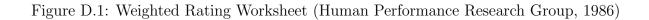
# Appendix D

# Weighted Rating Worksheet

WEIGHTED RATING WORKSHEET			
Scale Title	Weight	Raw Rating	Adjusted Rating (Weight X Raw)
MENTAL DEMAND			
PHYSICAL DEMAND			
TEMPORAL DEMAND			
PERFORMANCE			
EFFORT			
FRUSTRATION			

Sum of "Adjusted Rating" Column =

WEIGHTED RATING = (Sum of Adjusted Rating/15)



# Appendix E

# **Code Density Example**

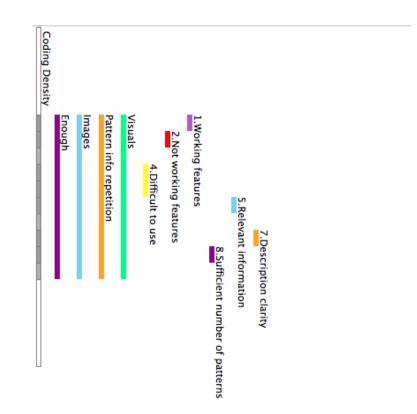


Figure E.1: Code Density Example

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