

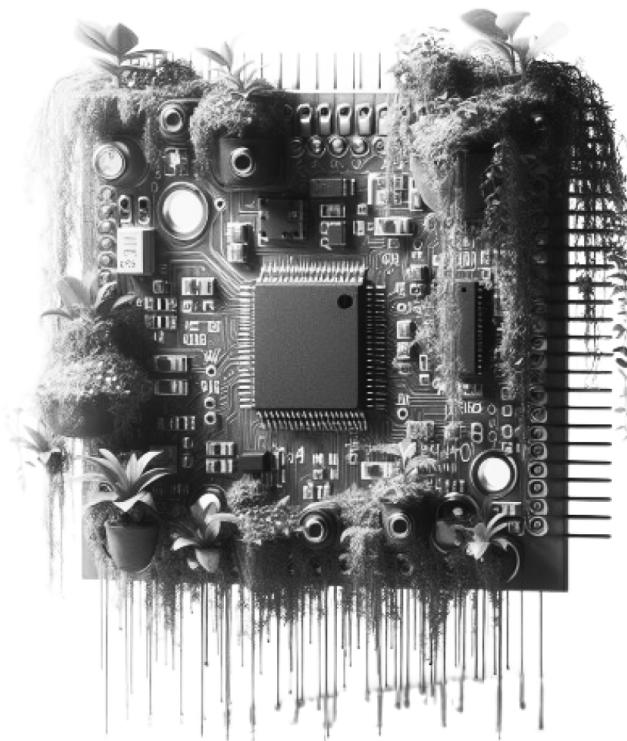
**A BREATH OF FRESH AIR: TOWARDS OPTIMAL INDOOR AIR QUALITY**  
INVESTIGATING INTERVENTION STRATEGIES FOR ENHANCING OCCUPANTS AWARENESS, COMFORT AND HEALTH

SUBMITTED IN PARTIAL FULFILLMENT FOR THE DEGREE OF MASTER OF SCIENCE

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## ABSTRACT

Suboptimal Indoor Air Quality (IAQ) has been identified to pose health risks and affect the cognitive performance of occupants within indoor environments. The study investigates occupants' awareness and perceptions of IAQ, facilitating occupants' adoption of preventive measures. Employing a user-centered mixed-methods approach, the research employs Post-Occupancy Evaluation (POE) methods to elicit occupants' understanding of indoor air quality and utilizes sensory monitors to collect and measure common pollutants in specific indoor environments. These insights guide the development of 'Bluebird', an interactive data physicalization that visualizes real-time air quality data which was subsequently evaluated and usability-tested with occupants. The results of the user study reveal a lack of awareness among users regarding indoor air quality, while evaluations of the prototype demonstrate that physical hardware displaying real-time data can effectively increase occupants' awareness.

## KEYWORDS

Human-Building interaction, Indoor air quality, Living Lab, Data physicalization, Smart buildings, User-centered design.

## 1 INTRODUCTION

Globally, it is estimated that people spend approximately 90% of their time indoors [30, 45] and breathe 11.000 liters of air per day [14]. Suboptimal indoor air quality (IAQ) conditions affect building occupants' experiences of comfort and insufficient ventilation in indoor environments is proven to play significant roles in occupants' well-being, health, and cognitive functions [28, 54]. The perceived comfort of occupants is influenced by the overall Indoor Environmental Quality (IEQ) consisting of several key metrics (e.g. mechanical ventilation, temperature regulation, natural lighting) to create a combined IEQ index for a specific indoor space [31]. Among these metrics, indoor air quality stands out as a crucial factor deserving special attention due to its invisibility to occupants [47], polluted air goes undetected by smell or sight, underscoring the importance of monitoring and maintaining optimal indoor air quality. Furthermore, mechanical ventilation systems in buildings operate discreetly and are frequently insufficient for ventilation in densely populated small rooms like meeting rooms, laboratory offices, or hot-desking work areas [46], which contributes to occupants' perceived lack of control. Since these systems are typically automated [38] and cannot be directly regulated or controlled by occupants themselves [27].

This creates an interplay between occupants' effects on comfort, built environments, and computing technologies (see Figure 5) researched in an overarching interdisciplinary field of study, known as Human-Building Interaction (HBI) [1]. This research specifically focuses on understanding occupants' needs through in-the-wild [42] studies gaining insight into occupants' awareness, collecting indoor air quality data in designated spaces, prototyping data physicalization devices to visualize indoor air quality, and using these designs as data probing tool [58] evaluating their effectiveness with

the overarching objective of obtaining insights into occupants' comfort levels and facilitating their adoption of preventive measures against poor indoor air quality [57].

While research on defining comfort within indoor buildings [2], gathering and analyzing sensory air quality data [14], and the effects of poor air quality are prevalent [30], there remains a research gap in understanding occupants' behavior and their subjective needs, along with limited research on design solutions that display environmental data and computing installations communication data to building occupants for awareness. Particularly within the field of physically visualizing data to convey IAQ to building occupants in real-time.

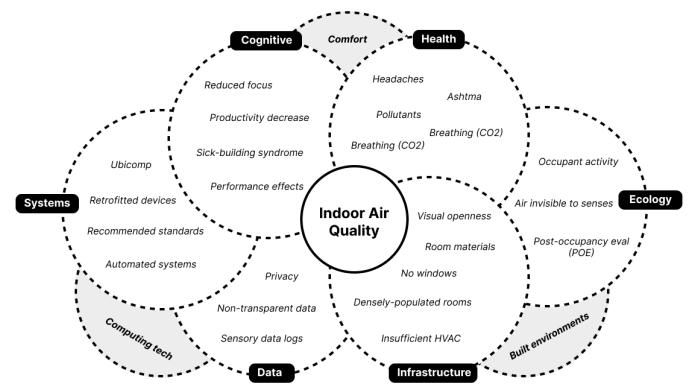


Figure 1: Complexity diagram providing an overview of the effects of IAQ and needs of occupants [2, 14, 28, 30, 45, 54]

### 1.1 Research questions

In order to research intervention strategies for improving indoor air quality, the following main research question is formulated:

*RQ: How can real-time sensory measurements and future predictions of indoor air quality be physically visualized to increase awareness among occupants facilitating their adoption of preventive measures against suboptimal air quality?*

To effectively answer this main research question, this research is guided by the following supporting sub-questions ("sq" for "sub-question") that also serve as objectives to delineate the necessary knowledge:

- SQ1: *How aware are occupants of their perception of indoor air quality and their understanding of its subjective properties?*
- SQ2: *How can environmental information related to indoor air quality be incorporated into a physical data-driven representation in the form of a design artefact?*
- SQ3: *How does the post-installation evaluation of a prototype design solution impact occupants' awareness and their willingness to adopt preventive measures?*

## 2 RELATED WORK

Given the focus of this research is studying Human-Computer Interaction (HCI) within Built Environments (BE), this research draws from various related work including the subfield of Human-Building Interaction (HBI) (see [Section 2.1](#)) and subsequently narrows its focus to Comfort within Buildings (see [Section 2.2](#)) and Indoor Air Quality (IAQ) (see [Section 2.3](#)) for the scope of this research. Furthermore, it examines notable findings from previous approaches to mapping and encoding sensory data in a new area of research called Data Physicalization (DataPhys) (see [Section 2.4](#)).

### 2.1 Human-Building Interaction

Buildings increasingly incorporate new forms of digital interaction [34, 39], which means new inherent connections between 'people', 'built environments', and 'computing' research in an area called Human-Building Interaction (HBI) [1, 52]. This research area is dedicated to exploring the design of built environments that may incorporate computing to varying degrees [49]. A logical extension where indoor spaces are increasingly retrofitted with sensing devices [39]. Understanding how people use different spaces in a building through computing can inform design interventions aimed at improving the utility of the space and the well-being of occupants. [53]. Current research into architecture and built environments indicates that a significant portion of the data collected by these computing devices is not necessarily transparent or comprehensible to occupants [44], and indoor spaces are designed without much thought of placing computing devices integrated within the environment [25, 29] leaving users with a perceived lack of control over their indoor comfort.

### 2.2 Comfort within buildings

Indoor occupant comfort is achieved in interaction with the environment and is represented in four respective dimensions; thermal, respiratory, visual, and acoustic [2]. Indoor Environmental Quality (IEQ) [31] indexes serve as metrics for assessing the aforementioned properties of comfort within indoor environments with Post-Occupancy Evaluation (POE) [18] and Perceived Environmental Qualities (PEQ) [47] methods being employed to gauge occupants' perceived comfort [10].

Studies on indoor environments focus on 'static' IEQ conditions using sensors to sense environmental conditions based on the buildings' physical characteristics to meet various recommended standards such as ASHRAE 62.1<sup>1</sup>, ISO 16814<sup>2</sup>. Discrepancies between measured IEQ conditions and occupants' perceptions have also been reported in studies. For instance, research indicates that occupants generally have a low awareness of Indoor Environmental Quality (IEQ). While occupants perceive the environment as 'satisfactory', actual sensory measurements within the environment reveal quality levels below recommended standards. [47]. Recent studies have shifted their focus towards the active role occupants play within the built environment, viewing their behavior within a building as akin to a 'living ecology' [32] rather than perceiving comfort solely as 'static' properties of the building itself.

<sup>1</sup><https://www.ashrae.org/technical-resources/bookstore/standards-62-1-62-2>

<sup>2</sup><https://www.iso.org/standard/42720.html>

### 2.3 Indoor Air Quality

A suboptimal indoor environment has reportedly been associated with health-related problems such as headaches, throat irritation, and asthma [30] as well as a decrease in cognitive functions such as tiredness, effects on performance and productivity and a lack of focus [54] [17]. A phenomenon referred to as the Sick Building Syndrome (SBS) [20, 37]. Many of these symptoms are primarily associated with respiratory comfort and are closely tied to Indoor Air Quality (IAQ) concerns [28]. Effective ventilation strategies have been shown to significantly alleviate SBS symptoms [20].

The advancements of real-time IAQ monitoring systems leveraging Internet of Things (IoT) sensor technology have facilitated progress in both the measurement of IAQ and the implementation of interventions aimed at enhancing it [36]. Indications of poor air quality are gathered by measuring common pollutants with a focus on molds and allergens (humidity), volatile organic compounds (VOC), and carbon dioxide (CO<sub>2</sub>) [30] where occupant behavior and the number of occupants within indoor space have a specific negative effect on CO<sub>2</sub> levels [19]. These indoor climate factors are related to the building occupants' behaviors and need special attention to be considered in assessing the IEQ conditions and determining if adequate ventilation is present [17]. It is crucial to recognize that when occupants experience symptoms, it signifies that a suboptimal air quality situation has already occurred.

The existing literature on IAQ offers quantifiable and validated methods for measuring IAQ through sensory data. It underscores the complexities associated with IAQ and emphasizes the significance of developing solutions to ensure occupants receive adequate ventilation.

### 2.4 Data Physicalization

The research domain known as data physicalization [3, 24] has emerged as a notable area of study, emphasizing the creation of physical data visualizations making the invisible tangible and interangible by encoding data in physical artifacts [40]. This shift from focusing on individual artifacts to a broader environmental context facilitates the physical embodiment of computing [16]. Data physicalization has the potential to positively influence the perception and exploration of data [24, 51, 55], presenting distinct advantages over traditional 'screen-focused' data representations, such as 2D canvas displays (e.g. digital dashboards) [21, 23], particularly in the context of Indoor Air Quality (IAQ) where a 'physical data visualization' serves as a fitting metaphor for rendering 'invisible' indoor air. These tangible artifacts usually come in the form of ubiquitous computing (ubicomp) [9] device that seamlessly blends into the environment, essentially making the computing devices 'disappear' [56].

These devices are frequently employed as persuasive technology, strategically designed to gently nudge individuals towards behavior change leveraging the emerging notion of pervasive sensing to subtly enhance users' awareness regarding the impacts of their decisions [7, 41]. This method of persuasive design serves as a powerful tool in calmly extending users' awareness, helping users understand gathered data, and the consequences of their actions, and gaining insight into their behavior [8]. A systematic analysis of over 60 representative data physicalization papers [43] show that

only numerous ( $f=3$ ) approaches to studying computing devices within indoor spaces and interactivity with occupants have been explored in prior research especially with a focus on indoor air quality to create awareness and nudge occupants to a desired behavior and rarely on large-scale architectural intervention that is the focus of this research. This framework of data physicalization and persuasive technology establishes the theoretical foundation for the creation (prototyping) and the evaluation (usability testing) of the design solution within this research.

### 3 METHODOLOGY

To answer the research question this study uses a human-centered approach (often referred to as Design Thinking) commonly found in Human-Computer Interaction studies consisting of four phases; 1) user studies to *understand* the user, 2) *data collection* methods and analysis of the situation as field trials, 3) *ideation* and experimental design of a prototype and 4) *evaluation* and usability testing of the prototype [26, 58].

This mixed-methods approach (both qualitative and quantitative) helps understand occupants' needs and informs the design and technical set-up of the prototype evaluating the effectiveness by focusing on the user's needs from the start of the study [35, 42]. For the first phase, an online questionnaire was conducted to *understand* occupants' awareness of indoor air quality (see Section 3.2), for the second phase a lab setting was created with IAQ monitors to do *data collection* and gain insight into environmental data (see Section 3.3) which in turn informed phase three the *ideation* and creation of the prototype (see Section 3.4, Section ??). In the last phase participants *evaluated* the prototype and performed usability tests (see Section 3.5). The concepts of indoor air quality monitoring and data physicalization were investigated through literature review and desk research before setting up the survey, creating the prototype, and conducting the evaluation interviews.

#### 3.1 Case study building

This study will be conducted in association with the Digital Interactions Lab<sup>3</sup> and will utilize the recently opened Lab42<sup>4</sup> building at the UvA Amsterdam Science Park<sup>5</sup> as its primary case study location (see Appendix I). Lab42 is an energy-neutral, flexible, and adaptable faculty building that facilitates collaborations among students, researchers, and businesses [6]. Since most of the space within the building are designated as informal learning spaces and another large part of the building is designed as meeting rooms (see Appendix H) occupants are most likely to experience the effects of poor indoor air quality within the meeting rooms due to the rather dense and crowded indoor environment. Lab42 is an example of a smart building or living lab where sensing devices are retrofitted throughout the building to automatically adjust lighting, temperature, and the focus of this research regulating air [5]. This already provides a base of environmental data that can be used and extended for further analysis.

<sup>3</sup><https://uva-dilab.com/>

<sup>4</sup><https://lab42.uva.nl/>

<sup>5</sup><https://www.amsterdamsciencepark.nl/>

#### 3.2 Questionnaire survey

To understand and collect occupants' subjective awareness and satisfaction of IAQ a structured survey was created to gather quantitative data within the building as a form of Post Occupancy Evaluation (POE) (see Appendix N).

**3.2.1 Questions.** The questions were based on two POE studies with a focus on indoor air quality [46, 47] and used standardized questions (e.g. Q-bank) and scales (e.g. Likert-scale) similar to Customer Satisfaction (CSAT) surveys. The survey consisted of a total of 9 questions (5 multiple choice, 3 Likert scales, 1 not mandatory open question) consisting of questions about:

- (1) *Activity and occupancy*: the rough location the occupant is within the building, how often the occupants use the building for various activities, and how they would describe the occupancy in their current space.
- (2) *Awareness and satisfaction*: how aware the occupant is of the current air quality in the space, how the occupant perceives the air quality in the current space, and how satisfied the occupant is with the air quality in the current space.
- (3) *Health and cognitive symptoms* : if the occupant experiences any health or cognitive symptoms based on the air quality in the current space.

**3.2.2 Participants.** The survey was distributed via handouts with QR Codes using eligibility criteria based on demographic characteristics to occupants present at the informal learning spaces of the atrium, first floor, and second floor. There were no additional inclusion criteria besides the convenience sampling size of respondents being present in the case study building (sampling in context). Additionally, handouts were attached to the tables using stickers. All instances of participation were voluntary and conducted without remuneration. Distribution of the survey was open for submission from the 1st of March to the 31st of April 2024 which recorded X ( $n=X$ ) responses in total of which after cleanup a total of X ( $n=X$ ) responses were included in the final dataset. No personally identifiable information such as age and gender was collected during the survey and ethical considerations (e.g. consent forms) were taken into consideration. To improve the quality of the questionnaire on the initial version feedback was requested, after which the survey protocol was piloted, before distributing to participants (see Appendix C).

**3.2.3 Data cleaning, preprocessing and analysis.** After the distribution of the survey completed analysis of the collected data was performed in the form of data cleanup and exploratory data visualization. In Python (Jupyter Notebook format)<sup>6</sup> Libraries such as NumPy<sup>7</sup> were used to clean the data (e.g. remove non-consenting users) and visualization libraries such as Seaborn<sup>8</sup> were used to create graphs and plots (e.g. boxplot the likert-scales) to get an overview of the collected data and gain insight into understanding the occupants.

<sup>6</sup><https://jupyter.org/>

<sup>7</sup><https://pandas.pydata.org/>

<sup>8</sup><https://seaborn.pydata.org/>

### 3.3 Air Quality Monitoring

To gather data about the current situation of air quality within the building and understand the current situation within the building in terms of air quality data we retrofitted IAQ monitors to two specific meeting rooms within the building (see Appendix G). This data collected was further used to inform and acted as a basis for the data input of the data physicalisation (see Section ??).

**3.3.1 Technical set-up.** We deployed the monitors in meeting rooms occupants regularly use which allowed us to understand occupants' behavior and perception in real-world corporate settings as opposed to a controlled lab setting. We refer to them as the small room (room A) and the large room (room B). The small room is XX m<sup>2</sup> and is commonly used for small-size meetings (seven seats), while the large room is XX m<sup>2</sup> (fourteen seats), which is preferable for hosting larger-size meetings and seminars. Two commercially available indoor climate data loggers were installed using 3D printed mounting plates, an AirCheq Touch Aero <sup>9</sup> in the smaller room and an Atal ATU-CT ClimaTrend <sup>10</sup> in the larger room. Both monitors use industry-standard (e.g. Senseirion and SenseAir) sensors to measure common pollutants and were mounted (e.g. between 80cm and 120cm from the ground) and calibrated (e.g. intervals, polling rates) as described by both manufacturer's installation manuals. The monitoring devices were installed from the 1st of March to the 31st of April 2024

**3.3.2 Data logs.** The data gathered by the sensors provides insights into various standardized measurements related to common pollutants that affect IAQ such as molds and allergens (humidity), volatile organic compounds (VOC), and carbon dioxide (CO<sub>2</sub>) (see Table ??, Appendix M). We cross-referenced the data logs with weekly schedules based on the internal booking systems of the rooms based on the timestamped data to align the values of the sensors from the data logs when meetings were scheduled. Data analysis is performed similarly as described in (see Section 3.2.3). were data was cleaned to remove data from mainly non-opening hours and plotted and visualized to explore patterns in the data and cross-reference them with meeting times.

### 3.4 Ideation and requirements

As a starting point for creating a physical representation of the air quality data we base our formative research on the growing interest in establishing theoretical and design foundations for *data physicalisation* [8, 21, 43] on how to encode the properties and use a common design language [40, 48] established by systematic reviews of data physicalization projects. The creation of a prototype illustrates the technology to be and are often deployed to conduct lab experiments and case studies [26]. The overall goal of the physicalization is described in the following definition:

*a data-driven physical artifact whose geometry and material properties encode data that aims to augment a nearby audience's understanding of data insights.*

The goal of the prototype is to generate knowledge about the intervention and human behavior around it. This is in alignment with a pragmatist methodology in design research where methods

<sup>9</sup><https://airteq.eu/producten/touch-aero/>

<sup>10</sup><https://www.atal.nl/atu-ct-climatrend-binnenklimaat-datalogger>

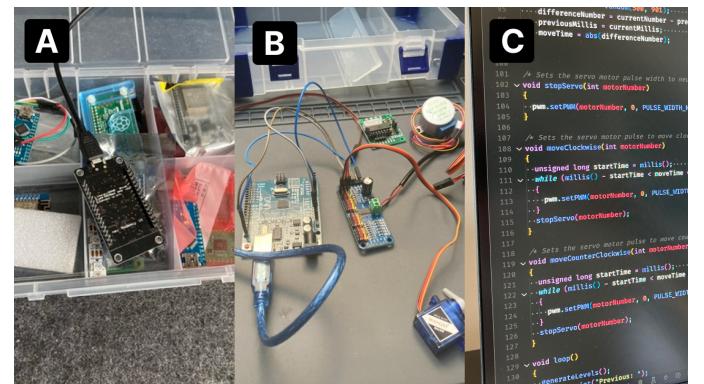
are adapted and evolve through interactions with participants. Before prototyping the design solution we first describe the overall requirements and scope of the physicalization and case studies used for ideation. The final prototype is described based on the encoded variables and design dimensions found in the literature (see Section ??).

**3.4.1 Concept requirements.** Based on this scope and the survey we describe the concept requirements ("r" for "requirements") of the design solution in further detail with six overarching requirements ranked based on the Moscow method:

- R1: **Visual Feedback:** The prototype must provide visual feedback through movement encoding environmental properties that represent air quality metrics, ensuring that users can easily interpret the information conveyed (must have).
- R2: **Size and location:** The prototype must be designed to be installed within small to medium-sized rooms, with consideration for its dimensions and weight to ensure compatibility (must have).
- R3: **Real-Time Data Integration:** The prototype should integrate real-time data from air quality monitors to dynamically adjust its behavior (should have).
- R4: **Interactive sensing:** The prototype should be interactive in which occupants can interact with the prototype by walking near it providing a tactile experience (should have).
- R5: **Material durability:** The prototype could use natural materials and be durable and resistant to environmental factors such as humidity and temperature fluctuations (could have).
- R6: **Aesthetic Integration:** The prototype could seamlessly integrate with its surrounding environment, complementing interior design aesthetics, architectural features, and layouts of the room to enhance the overall ambiance (could have).

**3.4.2 Concept models.** For the concept models, two existing datasets of academic and non-academic case studies were used as comparative studies, desk research, and as a starting point for ideation. First was the DataPhys gallery <sup>11</sup>, a collection of 372 entries classified

<sup>11</sup><http://dataphys.org/list/gallery/>



**Figure 2: Impressions of the prototyping and ideations phase.**  
A) API Data fetching B) Testing servo motors C) Writing firmware code

as data physicalizations. The second was a combination of three state-of-the-art papers with systematic reviews of physicalization with combined examples of around 132 entries classified as data physicalization of which both academic and non-academic samples [4, 40, 43]. Out of these, seven ( $f=7$ ) samples of academic were selected for further review based on the similarity with the before described requirements of which three ( $f=3$ ) samples with a focus on the environmental property of air, but not necessarily air quality within indoor environments (see Appendix X). Additionally, fifteen ( $f=15$ ) samples of non-academic case studies were reviewed after desk research which included work and prototypes from design studios and independent creators that informed the ideation phase (see Appendix Y).

**3.4.3 Concept diagrams.** Based on the user requirements and ideation and conceiving from the Communication and Multimedia Design (CMD) Methods Pack <sup>12</sup> and Design Method Toolkit <sup>13</sup> by the Digital Society School (DSS) three low fidelity (lo-fi) concepts were further elaborated (see Figure ??) in order to choose one to develop in high fidelity (hi-fi) for the user studies and evaluation.

Concept selection was based on weighted physicalization criteria from the literature, a Harris profile for the lo-fi concepts, and four expert reviews ( $n=2$  internal experts involved in the project,  $n=2$  external experts not involved in the project) feedback (see Appendix ??, Appendix ??). Also technical limitations of the provided hardware (e.g. real-time data output of monitors, cost of hardware, availability of electronic components,) and limitations in the technical set-up of the building (e.g. space in the meeting rooms, not allowed to alter furniture) were considered as heuristic evaluation. Based on the aggregation of these criteria the *Bluebird* concept was chosen to be further developed into a high-fidelity prototype (see Figure ??, Appendix J).

### 3.5 Evaluation

The prototype was evaluated as summative research using common performance-related criteria that are widely used in HCI/Information Visualisation [40] and Grounded Theory studies [13]. We employed a field-based evaluation approach with accompanying methods based on the Human-centered Design Kit by Ideo <sup>14</sup> and Delft Design Guide from the Delft University of Technology (TU) <sup>15</sup>. For evaluation criteria, we used the intentions and evaluating interview methodology described in the data physicalization design vocabulary [23, 40] as a baseline for evaluating the learnability, memorability and usefulness using in-person evaluation sessions. To measure these properties of understanding and usability of the data physicalization we adopted and rewritten questions from the Technology Acceptance Model (TAM), Software Usability Measurement Inventory (SUMI) and System Usability Scale (SUS) to gather insight into perceived usefulness, attitude towards using, and system usability [11, 15]. These questions acted as a baseline and starting point but were revised and remixed to suit the specifics of evaluating data physicalizations within the context of this research (see Appendix Q).

<sup>12</sup><https://cmdmethods.nl/>

<sup>13</sup><https://toolkits.dss.cloud/design/>

<sup>14</sup><https://www.designkit.org/methods.html>

<sup>15</sup><https://www.bispublishers.com/delft-design-guide-revised.html>

**3.5.1 Hypothesis elicitation.** Based on the research question and creation of the prototype four hypotheses ("h" for "hypothesis") were formulated which also acted as evaluation criteria to evaluate upon in the evaluation session as an observational study:

H1: **Understanding:** users will exhibit a clear comprehension of the physicalization's representation of IAQ data, as well as an understanding of its intended function and impact (ease of learning)

H2: **Engagement:** users will see the utility of the design and aesthetics of the physicalization and exhibit feedback on the quality of the design.

H3: **Effectiveness:** users acceptance and satisfaction with the IAQ physicalization will be positively correlated with perceived usefulness, attitude towards use, and system usability.

**3.5.2 Participant sampling.** The sample size of evaluation interviews was  $x$  ( $n=X$ ) and accepted because the study findings reached theoretical saturation, new interviews did not yield new insights after the first  $x$  interviews and led to repetitive data [50]. Participants were gathered through purposive sampling and recruited through internal communication of the studies via email and internal lab messaging tools. The participants were not involved in the development of the prototype and had no prior knowledge of the purpose of the prototype and its design of it. Participants were not (financially) incentivized to take part in the studies. Respondents had to meet the inclusion criteria ("c" for "criteria") that needed to be checked before the interviews:

C1: The participant needed to use a meeting room with the building a minimum of once a week

C2: The participant needed to work within the case study week a minimum of 3 days per week

This resulted in a sample of  $x$  male,  $x$  female, consisting of various roles; from researchers from different labs, PhD candidates working at the labs to private company employees encompassing a range of ages ( $\min=x$ ,  $\max=x$ ,  $mdn=x$ ) and education levels. Participants used the meetings rooms on average  $x$  ( $\min=x$ ,  $\max=x$ ,  $mdn=X$ ) a week and worked within the lab42 building  $x$  ( $\min=x$ ,  $\max=x$ ,  $mdn=X$ ) a week. The evaluation session where held between May 1st to 31st of May 2024. On average an evaluation took a total of 50 minutes to an hour.

**3.5.3 Evaluation interviews.** Within the meeting-room lab set-up in the presence of the developed prototyped pre-arranged, semi-structured individual qualitative interviews were conducted with open-ended and nonleading questions with additional in-depth questions (follow-up probing strategy) on topics emerging from the dialogue (see Appendix Q). To improve the quality of the interviews (and evaluation session in general) on the initial version feedback was requested, after which the interview protocol was piloted, before continuing with participants (see Appendix C). The goal was to gather first impressions and gain insight into how occupants understand the communicated data factors of the prototype. Some questions were purposefully vague to explore how the building occupants understand and use the prototype. Also in these cases the purpose of the prototype was not communicated to participants before-hand to gather first impressions.

**3.5.4 Participant observation (usability testing).** After the explorative questions participants were encouraged to in more detail view the prototype and interact with it as a field trial stating anything they noticed (encouraging probing strategy). Participants' behavior was observed within prolonged engagement in the meeting rooms and participants were encouraged to think aloud when viewing and interacting with the prototype (see Appendix R). Informal leading questions were asked about improvements, design optimization, and visual changes. In this manner, insights into particular interaction elements were acquired without the explicit involvement of HCI specialists. The goal was to test the usability of the prototype, study occupants and their behavior in a natural setting, and gather insight into the self-reflective properties of the prototype.

**3.5.5 Prototype effectiveness.** After the interviews and observations, the participants were asked to fill in a digital online with structured pre-defined questions form rating several properties of the prototype for their effectiveness (see Appendix S). The goal was to gather quantitative measurements about the usability and effectiveness of the prototype.

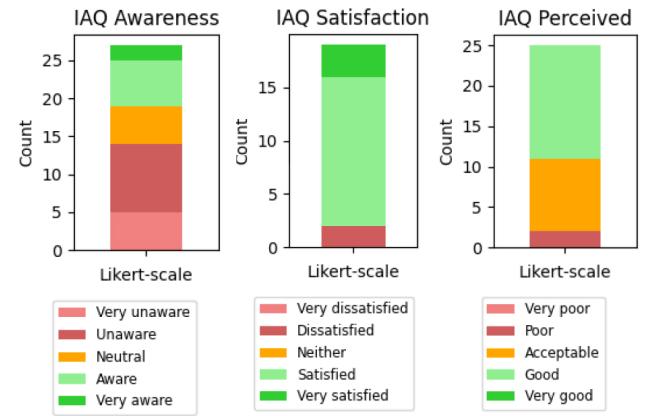
**3.5.6 Transcription and coding.** All interviews were anonymized and conducted in-person on-site and audio recorded with permission of the participants. The recordings were then verbatim transcribed using the built-in Microsoft 365 transcription tool<sup>16</sup> to avoid bias while note-taking. The transcribed interviews as textual data were processed via Atlas.ti<sup>17</sup> for qualitative coding.

## 4 RESULTS

The goal of the chosen methodologies (see Section 2) allows for answering of the (sub)research questions. First, the results of the questionnaire survey are described (see Section 4.1) and key insights into the air quality monitor data collection are presented (see Section 4.2) to answer SQ1. Then the developed prototype will be presented in section (see Section 4.3) which addresses SQ2 and the results from the evaluation sessions will be summarized in (see Section 4.4) to address SQ3.

### 4.1 Survey analysis

The following section presents the outcomes of the survey conducted to assess various aspects related to occupants' activity, IAQ awareness, satisfaction, perception, and health impacts among Lab42 building occupants. The responses show that most occupants are located in the atrium of the building, not particularly aware of the IAQ, and perceive the IAQ as acceptable based on the large open area and planters, meeting satisfactory IAQ levels.



**Figure 3: Likert-scales of IAQ awareness, perception and satisfaction of the questionnaire survey with occupant count**

**4.1.1 Activity and occupancy.** The first set of questions of the survey focussed on activity and occupancy. On average, occupants who filled in the survey used the Lab42 building *3 times a week* for various activities ( $f=X$ ). As opposed to 1 day a week, 4 days a week, 2 days a week with a small number of occupants using the building 5 days a week. Most occupants from the sample size were located on the *ground floor* ( $f=X$ ) and the *first floor* ( $f=X$ ) as opposed to the 2nd floor. Both the first floor and ground floor are considered the 'open area' and part of the atrium of the building. This is by design of the building where the lower floors have more co-working spaces to be used as informal open learning spaces whereas the upper floors are more designed as meeting rooms and private working offices. Many occupants described the overall occupancy in the space as *not too crowded* ( $f=X$ ) with a smaller percentage explicitly stating the space was crowded or not crowded at all.

**4.1.2 Awareness, perceived and satisfaction.** The second set of questions were three Likert scales about perceived IAQ, awareness of IAQ, and satisfaction with IAQ. Over half of the occupants are *not particularly aware* of the IAQ in their current space, either very unaware ( $f=X$ ), unaware ( $f=X$ ), or neutral ( $f=X$ ) the minority of the occupants are aware or very aware. Indicating that in general occupants are not very aware of the IAQ if they are directly asked about it. However, once occupants are asked about their perceived IAQ and satisfaction the majority of the occupants perceive the IAQ as *acceptable* ( $f=X$ ) or *good* ( $f=X$ ) and almost all occupants consider the IAQ as satisfactory by being *satisfied* ( $f=X$ ) or *very satisfied* ( $f=X$ ) with the IAQ.

**4.1.3 Health and cognitive symptoms.** The third set of questions were to indicate if users suffered from health or cognitive symptoms based on the IAQ. The majority of participants answered *none* to both the health ( $f=X$ ) and cognitive ( $f=X$ ) questions. A small percentage experienced health symptoms such as headaches and feeling noiziating and a larger percentage experienced cognitive symptoms such as trouble with focus or tiredness. The results of this section of the survey are inconclusive since it's difficult to determine if these symptoms are specifically related to the air quality.

<sup>16</sup><https://www.microsoft.com/nl-nl/microsoft-365>

<sup>17</sup><https://atlasti.com/>

**4.1.4 Open-ended air quality description.** The most notable finding of the open question is that the occupants who filled in the not mandatory question describing their perception of IAQ mention specifically the openness of the atrium space:

P11: [...] think it is good, [...] although I must say that this is mostly based on the large amount of open space in the building"

With some of the occupants mentioning the 'high ceilings' of the atrium specifically.

P8: [...] feel like in this building the air quality is really good, mainly because of the impression the high ceilings give"

P13: "I like the air quality. This may also be because I sit close to the door and the ceiling is high."

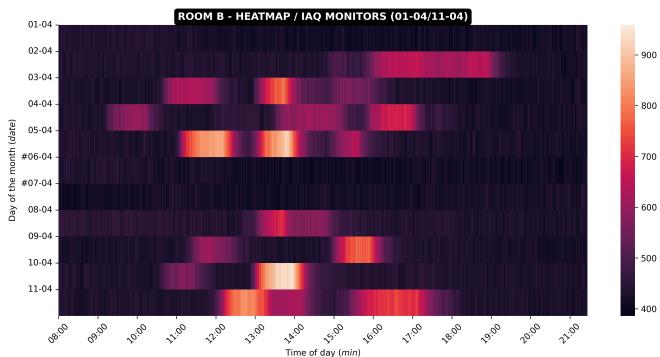
Another notable attribute is that many occupants describe contributing to the perception that the IAQ is sufficient are the hanging planters and greenery that is present within the atrium.

P16: [...] I also see green plants around me, of which I think they are real!"

P14: [...] and the hanging plants that are present.

## 4.2 Air Quality Monitors

The gathered data logs are exported from the devices and analyzed with a focus on CO<sub>2</sub> concentrations since this is the main IAQ parameter that influences air quality negatively within indoor environments. The process of breathing accumulates CO<sub>2</sub> and the air quality within a space is heavily influenced by the occupancy within a room. Analyzation of the data logs shows occupancy patterns of a 'typical meeting', scheduled meeting patterns for the case study rooms and more notably the development of CO<sub>2</sub> concentrations within both meeting rooms regularly where they regulary exceed optimal CO<sub>2</sub> concentration thresholds above 600ppm.



**Figure 4: Heatmap of ten days of data logs from Room B showing the peaks of CO<sub>2</sub> concentrations monitored**

**4.2.1 Single meeting CO<sub>2</sub> development.** A sample of CO<sub>2</sub> concentrations in a single meeting is shown in (see Figure 5). The lineplot shows the development of a 'regular' 1-hour meeting within the room. The plot are the CO<sub>2</sub> concentrations over time in minutes with a x-axis line of 600ppm indicating the maximum 'ideal' threshold. Two coloured lines on the y-axis indicate the start and end time of the meeting. The observations show that after 15 minutes

of the meeting started the CO<sub>2</sub> concentrations reach suboptimal levels and continuou to rise towards 950ppm level where it stabilizes as the 'maximum value' of the meeting. As stated before, continuous exposure to CO<sub>2</sub> concentrations especially between 800ppm - 1000ppm and even above are considered 'bad' and can impact cognitive functions. After ending of the meeting the concentrations slowly start to decrease to the baseline of 450ppm when occupants leave the meeting room at the end time.

**4.2.2 Regular day CO<sub>2</sub> development.** The visualization (see Figure 5) shows the spikes of CO<sub>2</sub> concentrations during a sample day where multiple meetings occurred. Again, the x-axis plots the CO<sub>2</sub> concentrations and this time the y-axis shows a full day with opening hours of the building. Based on similar plots of randomly sampled days the data shows most meetings occur between late in the morning (11:00) and usually end late in the afternoon (17:00) where after no more meetings are planned. That's roughly two hours after opening of the building and roughly four hours before closing of the building. There are outliers, on some days meeting occur early in the morning straight after opening time, and occasionally a (longer) meeting that is longer and spans longer in the evening.

**4.2.3 Meeting schedule CO<sub>2</sub> development.** A heatmap of ten days of CO<sub>2</sub> concentration monitoring (see Figure 5) shows that it's common that two or three meetings occur on a single day and typically spans one hour. The majority of the meetings go beyond the 600ppm CO<sub>2</sub> concentrations. Based on the lineplots and heatmaps it is assumed that the 'larger' Room B is more frequently used and reaches higher CO<sub>2</sub> concentrations but those results are not definite since it heavily relies on context and the dates and time periods that spanned the data collection and the monitors were installed.

## 4.3 Prototype

Based on the requirements, data physicalization design principles, and concept models exploration a final high fidelity (hi-fi) version of the prototype was developed that functioned as a proof-of-concept of the physical design solution as a feasibility study and utilized in the user study for evaluation.

**4.3.1 Concept description.** *Bluebird* is a hanging kinetic type sculpture inspired by organic nature materials and the shapes of hanging planters that encode the environmental properties of indoor air quality data fostering the relationship with nature. It is meant to be hung from the ceiling in small to medium rooms and changes based on real-time air quality monitor data engaging the occupants within the room into considering the level of air quality. Strings (plant branches) either become longer or smaller simulating the growth of a plant. Movements of the leaves indicate the freshness of air and movement. The overall design philosophy of the shapes and forms uses the notion of calm technology to minimize interruption cost [12]. A unique characteristic of the prototype as opposed to existing (commercially available) solutions is that it shows predictions and history, so not only feedback on the current situation when the situation of high CO<sub>2</sub> concentrations already occurred.

**4.3.2 Experimental set-up.** The prototype was installed *in situ* within one of the monitored meeting rooms inside of the building. We derived four relevant dimensions to describe the prototype based on the literature; *properties, environment, interaction, representation* [4, 21, 43].

- **Properties:** The technology-assisted physicalization uses explicit visual variables such as size, position, timing and movement where occupants visually see the strings becoming larger (height) and leaves moving to change the visual arrangement (movement) all based on the temporal frequency of CO<sub>2</sub> concentrations.
- **Environment:** The design uses associative design metaphors through visual hints of shapes and movement and uses organic shapes and forms resembling shapes found in nature (shape and form). It is a medium to large scale (50 - 150cm) physicalization. The physicalization is semi-public placed within the context of an open building.
- **Interaction:** The artifact is a tool for communicating environmental data assists with understanding information and encourages reflection and self-reflection. The design includes indirect interaction where the physicalization changes based on occupant activity.
- **Representation:** The dataset is dynamic from a real-time stream of environmental data using building sensors using categorical data as output calculating differences in CO<sub>2</sub> concentration values.

**4.3.3 Electronics and components.** A controller device running on an Arduino Uno R3 <sup>18</sup> microcontroller with an MKR Motor shield is used <sup>19</sup> to control six 360° MG90S type Micro Servo Motors <sup>20</sup>. Attached to these motors are pulleys with paracord rope simulating the growth of the hanging planter so that the string can be moved up and down. All electronics are integrated at the back of a wooden board, enabling the device to act as a stand-alone device making it movable and modular to be installed in other spaces.

**4.3.4 Crafting technologies and materials.** The strings, leaves, and housings of the electronics and mechanical hardware are digitally-fabricated using additive manufacturing (3D Printing) using a Fused deposition Modeling (FDM) technique using Polylactic acid (PLA) plastic filament in various colors. The electronics enclosures and plant models were modeled using computer-aided design (CAD) software. A digital fabrication technique commonly found in data physicalization prototypes [4]. To create leaves representing textile or fabric custom properties were defined within the 3D printing software (Slicing) to remove top and bottom layers and create a thin layer of infill.

**4.3.5 System Architecture and software.** The microcontroller uses custom firmware written in Arduino code <sup>21</sup> (similar to C++) that receives real-time data from the air quality monitors using the LoRaWAN <sup>22</sup> communication protocol to control the mechanics of the prototype (see Appendix L). This arrangement of hardware is

<sup>18</sup><https://store.arduino.cc/products/arduino-uno-rev3>

<sup>19</sup><https://store.arduino.cc/products/arduino-motor-shield-rev3>

<sup>20</sup><https://www.towerpro.com.tw/product/mg90s-3/>

<sup>21</sup><https://www.arduino.cc/reference/en/>

<sup>22</sup><https://lora-alliance.org/about-lorawan/>

commonly found in Internet of Things (IoT) architecture set-ups and follows the notion of Edge Computing with a (1) sensing, (2) networking, (3) processing, and (4) application layer [22, 33]. Some custom library functions are written in to calculate the movements of the string. The current ( $C_{\text{current}}$ ) and previous  $C_{\text{previous}}$  CO<sub>2</sub> concentrations are stored on which a difference number is calculated. The difference number is mapped to a movement time  $t_{\text{movement}}$  in milliseconds using a multiplication factor. Based on a negative or positive integer the servo motors spin either clockwise (growing) or counterclockwise (shrinking) the ropes.

## 4.4 Evaluation

The prototype-led evaluation sessions (see Section 3.2) were held to assess the understanding of the data physicalization with a focus on how occupants perceive the data embedded in the physical representation, usability test the prototype for design improvements and suggestions and gain insight into its effectiveness.

**4.4.1 Usefulness and aesthetic impressions (engagement).** All participants (see Appendix T) indicated during the usability test or through their scores that they enjoyed viewing the data physicalization and gained valuable insights about indoor air quality from its display in the meeting room. They also reported a high likelihood of taking preventive action based on these insights. Opinions on the materials and aesthetics were mixed: *P2* suggested adding more strings for granular data, while others found the current number sufficient. *P3* proposed more variation in the leaves' shapes and densities for aesthetics, but this was not a shared view. *P2* and *P4* also recommended that the wooden board and materials be better integrated into the room's interior, either by hiding it in the ceiling or by covering it to match the room's color scheme.

*P4*: "I also think the leaves are too artificial, I would prefer more organic materials. [...] The wooden board feels off [...]"

**4.4.2 Perceived data and learnability (understanding).** Almost all participants, except for *P5*, indicated that the prototype's learnability on initial view is high. They noted that without clear instructions, the physicalization is too abstract in conveying information about indoor air quality, as reflected in generally low scores for statement S2 (see Appendix V) from the survey. Design recommendations mostly evolved around helping occupants better understand the



**Figure 5: Photograph of the prototype installed in the room during an evaluation session with a participant**

physicalization with better onboarding for example in the form of a scannable QR code or text instructions on the wooden board.

*P1: [...] on initial view it's a bit of a puzzle what IAQ properties it communicates. But once you understand it and learn it I assume it will have a long-term behavior change effect."*

**4.4.3 Design Improvements and recommendations (effectiveness).** Participants suggested numerous design improvements and recommendations during usability testing. These suggestions, coded and categorized, primarily aimed to increase the physicalization's overall effectiveness (see Appendix U). P1, P2, P3, P5 emphasized that the positioning of the physicalization within the room significantly impacts its effectiveness for all occupants. Additionally, P2, P3, P4 recommended color-coding or labeling the leaves indicating the history, current, and future predictions of CO<sub>2</sub> concentrations to make this property more apparent.

*P3: "I feel like the positioning within the room is important. [...] You want the physicalization visible to all occupants within the room. Putting it next to the door or one wall makes people sit with their back to it."*

## 5 DISCUSSION

An examination of the grounded theory research design and methodologies utilized in this study combined with an interpretation of both qualitative and quantitative findings, reveals several comparative findings, study limitations, and opportunities for future research.

### 5.1 Findings in context

Comparing the findings of the existing literature (see Section 2) with the results of this study (see Section 4) shows that general findings from the literature are supported. A key distinction lies in the human-centered design approach of this study, which incorporated feedback from occupants throughout the iterative research process. The findings from one methodology informed decisions on subsequent approaches in the study (see Section 3). Furthermore, it is important to note that these comparative studies vary significantly in their context (e.g. outdoor environments) and lab settings (e.g. households).

**5.1.1 Occupant awareness and IAQ monitor.** Occupant awareness of indoor air quality (IAQ) is generally low (SQ1) due to its inherent properties, making it difficult to detect through human sensory perception. Occupants often judge indoor air quality based on visible attributes within the environment, which usually do not positively influence air quality [45] [14]. Building activity, occupancy, and crowdedness significantly impact the accumulation of CO<sub>2</sub> concentrations (SQ2), the primary factor of suboptimal air quality in indoor environments [19] [17], especially in smaller spaces like offices and meeting rooms [57].

**5.1.2 Prototype development and evaluation.** The additional step undertaken in this study was the creation of the prototype which extends beyond the scope of previous related studies. The prototype's development employed techniques and manufacturing methods commonly used in data physicalization projects [3, 24], while its evaluation followed methodologies frequently applied in

HCI research [40, 43]. Evaluation sessions indicated an increase in understanding and self-reflection regarding data insights and revealed several design improvements for the prototype. However, no significant effect or success rates were measured of the prototype's ability to help occupants take preventive action for long-term behavioral change.

### 5.2 Limitations

The data collection, design and validation process showed several strengths but also had some limitations that should be noted. The primary limitations encountered during this study were the reproducibility of the evaluation sessions, monitoring validity prototype scalability and generalizability of findings to other buildings.

**5.2.1 Evaluation reproducibility.** Grounded theory is a well-established research method, but greater care and effort should have been taken for investigator and theory triangulation. Some concepts may have been missed during the ideation phase since only the main researcher was involved in the prototyping. During evaluation sessions, the lack of four-eyed principles left room for researcher and interviewee biases. The small sample size, although it reached saturation, limited generalizability and demographic diversity. A more varied interview setting, such as different-sized meeting rooms or personal office spaces, could have tested usability in diverse contexts. The same group of participants was used for both interviews and the user study, potentially biasing their evaluations. And, while this study used similar approaches to others, including HCI evaluation and SUS metrics, the methods were slightly adapted, impacting the reproducibility and the validity of standardized quantitative results.

**5.2.2 Prototype scalability.** The prototype used in user studies is a proof of concept but requires further optimization. Concessions were made due to limitations in hardware availability and technical data constraints. Design improvements are prevalent, acknowledging that there is no universally perfect way to display air quality data. The prototype's current appearance can influence its effectiveness as users might perceive it as non-finished. A significant limitation is the inability of the current setup to explore long-term intervention strategies due to the need for testing over an extended period.

**5.2.3 Building generalizability.** The methodologies employed within Lab42 and its specific context may limit generalizability to other buildings and environments with different characteristics. The building's unique environmental properties (furniture, room allocation) contribute to this context. This also means there is an inherent bias in the user group, despite voluntary and random survey and interview distribution, convenience sampling for participant recruitment may introduce bias toward higher-educated university students and staff members present in specific areas of the building causing a higher attrition rate which may not be representative of a larger population.

**5.2.4 Data collection validity.** Care was taken using standardized high-quality sensors and the well-defined data collection procedures ensured reliability, monitoring within meeting rooms primarily focused on environmental properties like CO<sub>2</sub> concentrations,

lacking explicit data on occupancy. Adding more context to interpret occupant behavior and CO<sub>2</sub> concentration patterns, as well as considering the effects of existing mechanical ventilation, could enhance the data collection phase.

### 5.3 Future work

Future research should prioritize enhancing the design and communicative properties of the prototype along with implementing a more structured lab environment to gather quantifiable results on its effectiveness and its support in long-term preventive action among occupants. We envision enhancing the prototype to communicate additional sensory properties, such as using fabric to convey humidity through organic materials, and color-coding of the leaves to better show predictions and exalt the smell of fresh air. Incorporating more material-driven feedback could deepen engagement and foster embodied and multi-sensory experiences.

Evaluating the prototype's efficacy beyond initial impressions requires addressing validity and control measures for concrete effectiveness assessments, possibly through broader behavioral data collection in daily life scenarios possibly by incorporating window sensors to track occupants' window usage during meetings. To ensure the generalizability of findings, replication across diverse environments is essential. Replicating the study in multiple buildings with diverse occupants would strengthen the generalizability of results, given the unique characteristics of Lab42, including its architecture and occupant demographics.

## 6 CONCLUSION

The limited research on occupants' subjective comfort needs and the potential of visualizing IAQ data for building occupants is addressed in this study. Using a mixed-methods approach, it examines occupants' awareness of IAQ, correlates this with air quality monitoring data, and explores how physically communicating these properties can increase data insights and serve as an intervention strategy. Findings reveal occupants' general unawareness of IAQ, often judging it based on visual aspects of the indoor space. Monitoring CO<sub>2</sub> levels in meeting rooms indicates frequent suboptimal thresholds, posing health and cognitive risks. The developed prototype and its evaluation suggest a positive attitude toward interpreting IAQ data and taking preventive actions, albeit with preliminary indications lacking statistical significance and long-term effectiveness results.

Limitations include the specific context of the university building affecting generalizability and the methods used to evaluate the prototype limiting the reproducibility and quantifiable metrics. Future research should verify findings in diverse settings with a more rigorous long-term lab environment and enhance the prototype's design and aesthetics for multi-sensory interaction possibly enhancing the effectiveness of its physicalization properties. Ultimately this study establishes a foundation for future research within the niche of data physicalization addressing the research gap in understanding occupants' behavior to take preventive actions based on their indoor environment. It contributes to Human-Building Interaction by integrating computing technologies into built environments, assisting building staff and responsive architecture in optimizing space design to enhance occupants' overall comfort.

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## Appendix A ACKNOWLEDGEMENTS

My sincere gratitude to all the participants who generously contributed to this research by dedicating their valuable time to respond to the questionnaires voluntarily, as well as the participants who willingly tested and interacted with prototypes created for this research for their feedback and evaluation through interviews. Additionally, I thank everyone who supported me in the data gathering and prototyping phase by providing hardware, testing, and debugging code.

Special appreciation goes to Shruti Rao Ph.D. Candidate (University of Amsterdam) for her constructive feedback and suggestions, which further expanded this research, and internal supervisor Dr. Hamed S. Alavi (University of Amsterdam), for his invaluable guidance and thought-provoking questions throughout the project. Also, my sincere appreciation to all the reviewers of this research, particularly drafts of this paper, for their insightful comments and contributions.

## Appendix B ETHICAL CONSIDERATIONS

Before user studies and data gathering were conducted, an application to the Ethics Committee for Information Sciences (ECIS)<sup>23</sup> was made. No ethical issues were raised and the committee gave positive advice before the start of the research. All individuals participating in the questionnaire and evaluation process were obliged to confirm their voluntary involvement by carefully reading and submitting consent forms, with the assurance that they retained the right to withdraw from participation at any point without the need for explanation.

Participants were informed about the goal of the study and the structure of the interviews. Participants were not (financially) incentivized to take part in the studies. To uphold confidentiality and privacy, questionnaire participation occurred anonymously, and all evaluation interview data underwent anonymization following the conclusion of the evaluation sessions. Interacting with occupants within the building and interacting with participants of the usability tests of the prototype adhered to the principles outlined in the University of Amsterdam Code of Conduct<sup>24</sup> and Campus rules and Policies<sup>25</sup>.

## Appendix C DOMAIN EXPERT VALIDITY AND PILOT TESTS

Before conducting the questionnaire survey, data gathering process, and interview evaluation procedures, domain experts from the Informatics Institute<sup>26</sup> and the Digital Interactions Lab (DIL)<sup>27</sup> at the University of Amsterdam reviewed the methodology procedures. Draft versions of the questions and techniques were sent out to the supervisors and researchers from the lab for feedback internally. Then the questionnaire survey and evaluation interview procedure were pilot-tested and after several iterations more widely distributed to occupants and open for participation. The research was presented during two internal 'lab meetings'. First, a brainstorming workshop was held with the concept diagrams of the prototype for expert review and second, the final proof-of-concept prototype was presented for feedback and design improvements.

## Appendix D DATA STORAGE AND ARCHIVAL

During the research phase data collection methods, storage, and archival followed the Central guidelines for research data management (RDM)<sup>28</sup> from the University of Amsterdam. All occupant data was anonymized before publishing and nothing that can be considered personal data is collected. Data is stored on cloud service providers provided by the University of Amsterdam such as Research Drive<sup>29</sup>. Only the principal researcher and supervisor(s) in possession of the encryption methods and passwords can view the unstructured exported data from the questionnaires, monitoring devices, and interviews. Only aggregated datasets and data outputs for the purpose of visualization are published and can be publicly viewed.

## Appendix E PROTOTYPE BUDGET AND COSTS

Some of the hardware components and materials were bought specifically for the creation of the prototype. These costs were declared to the Digital Interactions Lab (DIL) and deducted from the lab budget. All other components were already in possession of the researcher. The author(s) has no affiliation with any of the hardware companies and organizations mentioned in this paper and received no other financial support for the creation of the prototype.

## Appendix F SOURCE CODE AND DATASETS

In the spirit of Open Access Research<sup>30</sup>, to support reproducibility, mitigate a lack of transparency, and enable future work in this research field the aggregated datasets, notebooks, and prototype source code in this research are publicly available on a GitHub organization with the working title 'viszlab' using the MIT License. Several code repositories for different parts of the research can be accessed and publicly viewed. The README file of each repository describes the contents and how to perform the technical set-up: <https://github.com/viszlab/>

<sup>23</sup><https://ivi.uva.nl/research/ethical-code/ethical-code.html>

<sup>24</sup><https://www.uva.nl/en/about-the-uva/policy-and-regulations/>

<sup>25</sup><https://extranet.uva.nl/en/content/a-z/house-rules-and-code-of-conduct/house-rules-and-code-of-conduct.html>

<sup>26</sup><https://ivi.uva.nl/>

<sup>27</sup><https://uva-dilab.com/>

<sup>28</sup><https://rdm.uva.nl/en/introduction/rdm-introduction.html>

<sup>29</sup><https://rdm.uva.nl/en/looking-after/storage/storage.html>

<sup>30</sup><https://uba.uva.nl/en/support/research/open-access/open-access.html>

## Appendix G FLOORPLAN AND LAB SET-UP

A floorplan diagram (see Figure 6) providing an overview of the technical lab setup of the small (Room A) and large (Room B) meeting rooms used for indoor air quality monitoring. The floorplan indicates the position the monitors are installed and the position of doors and windows.

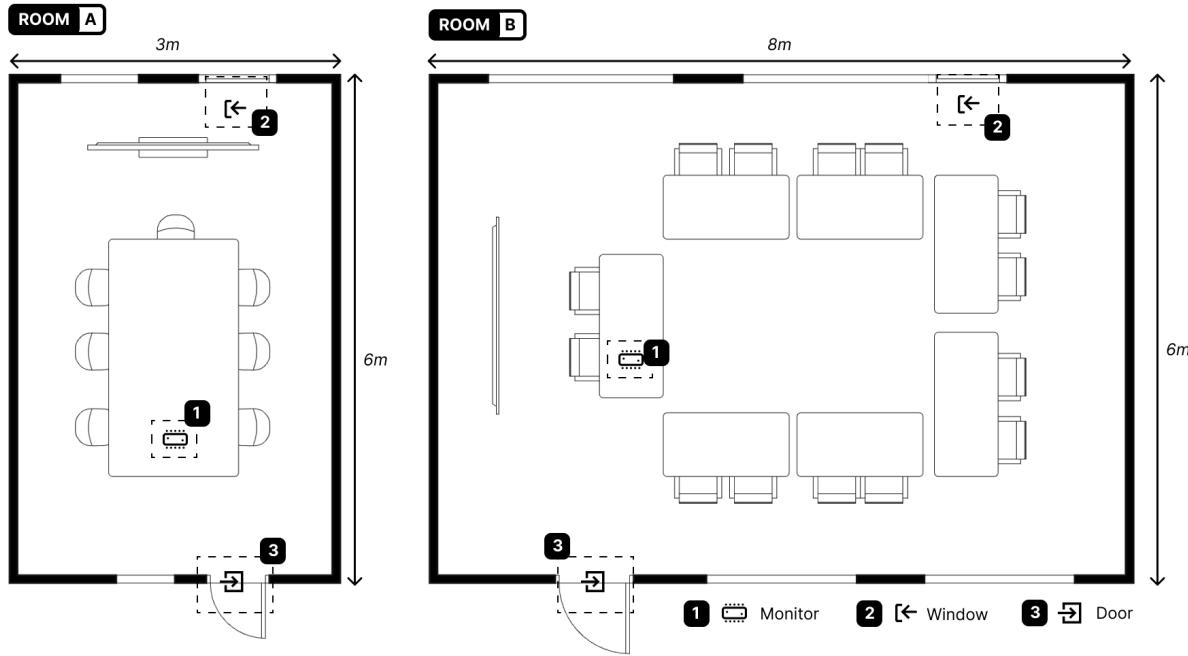


Figure 6: Floorplan of Room A and B, monitors installed as of manufacturer specifications

## Appendix H MEETING ROOM IMPRESSIONS

Photographs of the small (Room A, see Figure 7) and large (Room B, see Figure 8) meeting rooms taken from the viewpoint of the entrance of the door. It shows the default interior design set-up of the rooms and the position of the chairs and tables.



Figure 7: The 'smaller' (18m<sup>2</sup>) space labeled Room A



Figure 8: The 'larger' (48m<sup>2</sup>) space labeled Room B

## **Appendix I BUILDING IMPRESSIONS**

Photographs of the Lab42 building interior and exterior. The buildings's layout is strategically organized into different zones, each serving various functions, ranging from quiet individual work to spaces that allow for collaborative work. Lecture halls, learning rooms, and open learning spaces make up the two lower floors, with the upper four being primarily assigned to the university academic staff, meeting rooms, and external offices. The overarching interior theme in the design revolves around 'tech' and 'nature' aiming to cultivate a fresh, light, and warm comfortable ambiance.



(a) Placeholder



(b) Placeholder

**Figure 9: Placeholder**



(a) Placeholder



(b) Placeholder

**Figure 10: Placeholder**



(a) Placeholder



(b) Placeholder

**Figure 11: Placeholder**

## Appendix J PROTOTYPE IMPRESSIONS

Photographs of the prototype-creating phase showing the manufacturing of the pulley mechanism (see Figure 12), fabricating the leaves (see Figure 13) and mounting the electronics (see Figure 14) for the high fidelity data physicalization prototype.



(a) Cleaning and sanding the 3D printed pulleys



(b) Attaching pulleys to servo motors using motor arms

Figure 12: The pull-up and down mechanism of the hanging planter strings



(a) FDM 3D printer printing the textile leaves



(b) Attaching the leaves with fishing line

Figure 13: Hanging planter strings attached to the paracord



(a) Pulley mechanism installed with rope guides



(b) Attaching the electronics to the wooden board

Figure 14: Rear view of the prototype with all components mounted

## Appendix K SYSTEM ARCHITECTURE OF THE PROTOTYPE

System architecture diagram (see Figure 15) which shows the Internet of Things (IoT) architecture of the prototype following the notion of edge computing using a 1) sensing layer, 2) networking layer, 3) processing layer and 4) application layer.

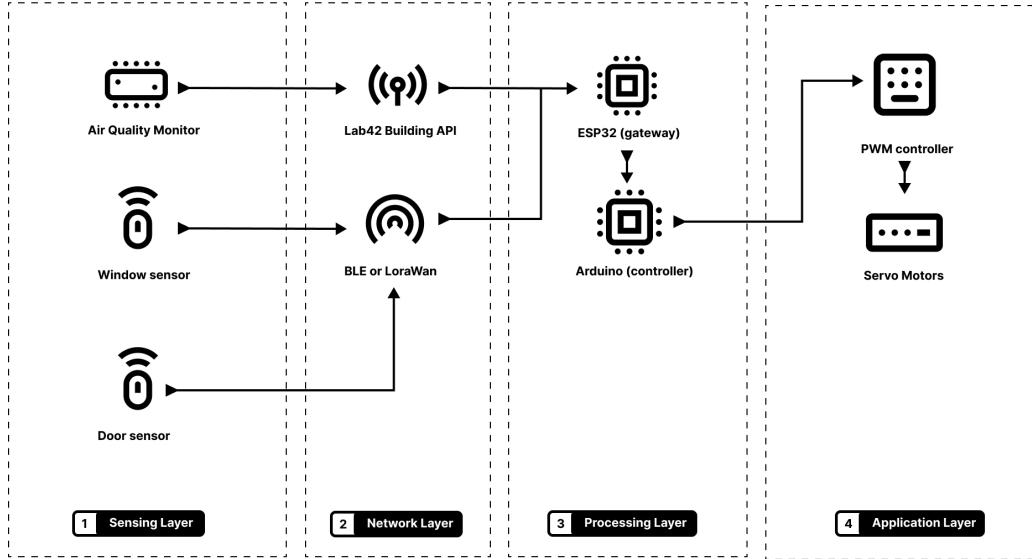


Figure 15: System diagram that shows the technical set-up of the prototype

## Appendix L LAB42 API SAMPLE DATA

Screenshot of the internal Lab42 building API documentation (see Figure 16). The API offers access to reliable and detailed sensor data installed throughout the Lab42 building at Science Park. Designed as a research resource for university employees and students. The available sensors in a specific room can be gathered through a Room ID and data can be requested based on a specific date and timeframe.

**L42 Building API Documentation** 1.0 OAS 3.0

Welcome to the Science Park L42 Sensor Data API

Provided by the Digital Interaction Lab at the University of Amsterdam, this API offers exclusive access to sensor data collected from the L42 building at Science Park. Designed as a research resource for university employees and students.

**auth** Operations relating to user authentication

**rooms** Operations relating to sensor data organised by rooms

**sensors** Operations relating to available sensors and the aggregated data

**Curl**

```
curl -X 'GET' \
  'http://leffe.uva.nl: /rooms/95/data?startTime=2024-05-25T13:00:00.000Z' \
  -H 'accept: application/json' \
  -H 'Authorization: Bearer'
```

**Request URL**

**Server response**

**Code** **Details**

**200**

**Response body**

```
{
  "results": [
    {
      "timestamp": "2024-05-25T13:00:00.000Z",
      "temperature": 21.496482,
      "airquality": 533.821716,
      "daylight": 0,
      "light": 0
    }
  ],
  "pagination": {
    "currentPage": 1,
    "totalPages": 1,
    "limit": 10,
    "totalCount": 1
  }
}
```

Figure 16: Screenshot of the Lab42 building API documentation and sample data output log

## Appendix M AIR QUALITY MONITORS SAMPLE DATA

Sample data logs (see Table 1 and Table 2) of the indoor air quality monitor devices installed in the small and large meeting rooms. These data logs were stored on-device during the data collection phase and exported for analysis. Both devices used the same polling rate but deferred in which sensory readings the device was capable of. Both have data and timestamps, CO<sub>2</sub> concentrations, temperature and humidity which were used for the scope of this research.

Date	Time	CO <sub>2</sub>	Temp	RH	PM1.0	PM2.5	PM10	TVOOC	BP	O <sub>3</sub>
2024/04/03	10:30	647	21°C	39%	0	0	0	255	99.97	0
2024/04/03	10:29	641	21°C	39%	0	0	0	249	99.97	0
2024/04/03	10:28	633	21°C	39%	0	0	0	246	99.97	0
2024/04/03	10:27	635	21°C	39%	1	1	1	242	99.97	0
2024/04/03	10:26	632	21°C	39%	0	1	1	237	99.97	0
2024/04/03	10:25	628	21°C	39%	0	1	1	236	99.97	0
2024/04/03	10:24	617	21°C	39%	0	1	1	232	99.97	0
2024/04/03	10:23	602	21°C	39%	0	1	1	232	99.97	0
2024/04/03	10:22	598	21°C	39%	0	0	0	231	99.97	0
2024/04/03	10:21	591	21°C	39%	0	1	1	228	99.97	0
2024/04/03	10:20	587	21°C	39%	0	0	0	228	99.97	0
2024/04/03	10:19	580	21°C	39%	0	0	0	230	99.97	0
2024/04/03	10:18	580	21°C	39%	0	0	0	232	99.97	0

Table 1: Sample data log of the Aircheq Touch Aero installed in the 'small' Room A

Date	Time	Temp	RH	DewPoint	CO <sub>2</sub>	-	-	-	-	-
10/04/2024	14:17:00	21.019	30.780	3.176	871.000					
10/04/2024	14:18:00	21.039	30.573	3.098	871.000					
10/04/2024	14:19:00	21.019	30.365	2.985	827.000					
10/04/2024	14:20:00	21.049	30.164	2.917	808.000					
10/04/2024	14:21:00	21.059	29.895	2.838	808.000					
10/04/2024	14:22:00	21.059	29.852	2.772	773.000					
10/04/2024	14:23:00	21.059	29.730	2.723	773.000					
10/04/2024	14:24:00	21.079	29.608	2.665	773.000					
10/04/2024	14:25:00	21.059	29.486	2.607	721.000					
10/04/2024	14:26:00	21.059	29.303	2.520	714.000					
10/04/2024	14:27:00	21.049	29.242	2.482	714.000					
10/04/2024	14:28:00	21.079	29.181	2.479	714.000					
10/04/2024	14:29:00	21.059	29.016	2.400	681.000					
10/04/2024	14:30:00	21.089	28.912	2.358	681.000					

Table 2: Sample data log of the Atal ATU-CT ClimaTrend installed in the 'large' Room B

## Appendix N QUESTIONNAIRE SURVEY (POE)

Exported text version of the questionnaire survey created in Qualtrics and distributed using handouts with QR codes.

**Introduction:** Hi! We at the Digital Interactions Lab (DIL) are researching indoor environments, focusing on Indoor Air Quality (IAQ) within smart buildings like Lab42, for a Master Thesis. This survey takes an average of ~3 minutes to complete and comprises questions about your overall comfort and awareness of Indoor Air Quality (IAQ).

**Informed Consent:** The survey is anonymous and collects data on environmental experiences and approximate building location for future research and publication. Participation is voluntary, and if you decide that you do not want to participate after you have completed it, please contact us. Principal researcher: BSc D. de Vries - danny.de.vries@student.uva.nl Supervisor(s): Shruti Rao PhD Candidate - s.rao@uva.nl Supervisor(s): Dr. H. Seiied Alavi PhD - ha.alavi@uva.nl Thank you for your valuable time and for participating in our survey!

**Q1: Location-** Where are you currently located within the Lab42 building? *Multiple-choice, one option possible*

- On the ground floor (the atrium)
- On the first floor (1st floor - in a working space)
- On the second floor (2nd floor - in a working space)

**Q2: Activity** - On average, how often do you use Lab42 per week for various activities? *Multiple-choice, one option possible*

- 1 day a week
- 2 days a week
- 3 days a week
- 4 days a week
- 5 days a week

**Q3: Occupancy** - How would you describe the occupancy in your current space? *Multiple-choice, one option possible*

- Not crowded
- Not too crowded
- Crowded
- Very crowded
- At capacity

**Q4: Awareness Air Quality** - Did you know that poor air quality has been identified to pose health risks and affect cognitive performance?  
How aware are you of the current air quality in this space? *Likert-scale, one option possible*

- 1) Very Unaware 2) Unaware 3) Neutral 4) Aware 5) Very Aware

**Q6: Perceived Air Quality** - How do you perceive the air quality in the current space? *Likert-scale, one option possible*

- 1) Very Poor 2) Poor 3) Acceptable 4) Good 5) Very Good

**Q7: Satisfaction Air Quality** - How satisfied are you with the air quality in the current space? *Likert-scale, one option possible*  
1) Very Dissatisfied 2) Dissatisfied 3) Neither dissatisfied or satisfied 4) Satisfied 5) Very Satisfied

**Q8: Not mandatory** - Would you like to describe in more detail in your own words how you currently feel about the Indoor Air Quality?  
*Open-question, insert text*

**Q9: Health symptoms** - Do you experience any health-related symptoms based on the air quality in this space? *Multiple-choice, multiple options possible, insert text field*

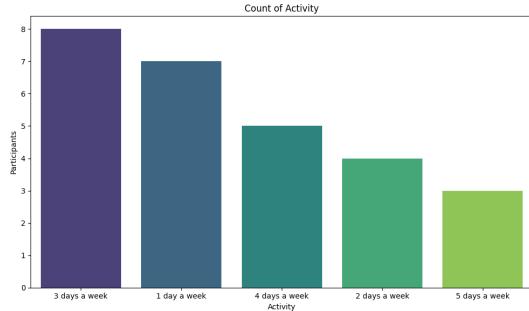
- None
- Headaches
- Trouble breathing
- Feeling nauseating
- Other

**Q10: Cognitive symptoms** - Do you experience any cognitive-based symptoms on the air quality in this space? *Multiple-choice, multiple options possible, insert text field*

- None
- Trouble with focus
- Decreased productivity
- Tiredness
- Other

## Appendix O SURVEY DATA

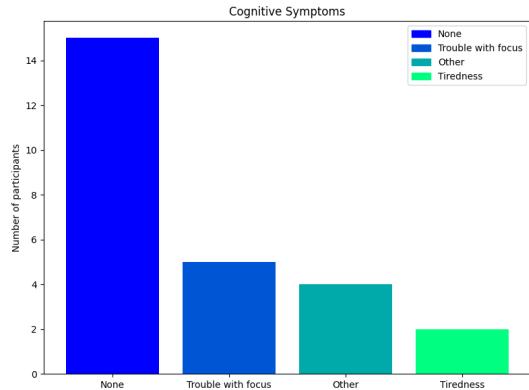
Plots for specific questions of the survey questionnaire data exported from Qualtrics. Bar charts are created to show the distribution of answers for each question (see Figure 17). The Likert scales are plotted as a stacked bar chart to show the scores (see Figure 18).



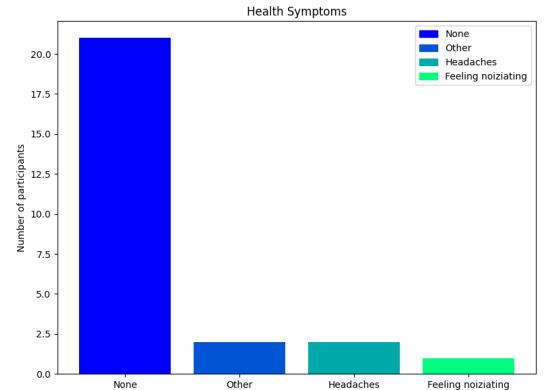
(a) Average use of the building for various activities



(b) Description of occupancy crowdedness

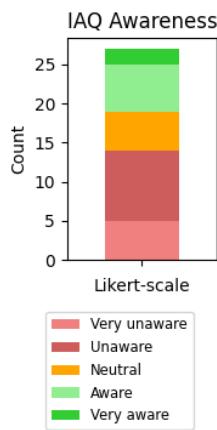


(c) Cognitive symptoms based on the air quality

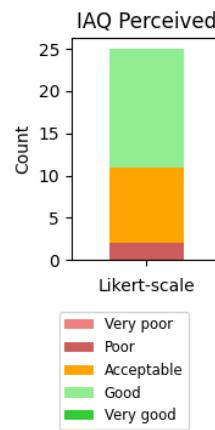


(d) Health symptoms based on the air quality

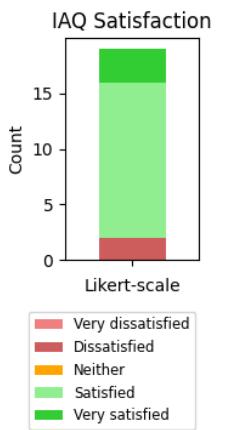
Figure 17: Bar charts of the survey questions about activity, occupancy, health and cognitive symptoms



(a) IAQ Awareness



(b) IAQ Perceived

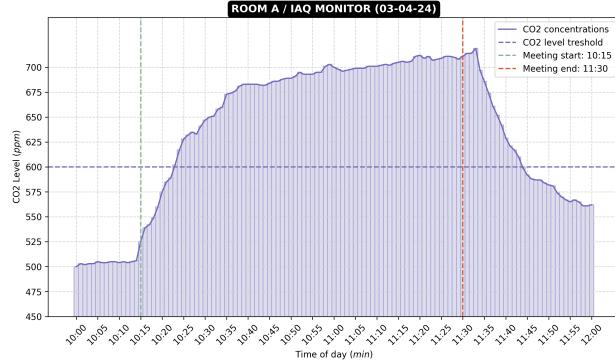
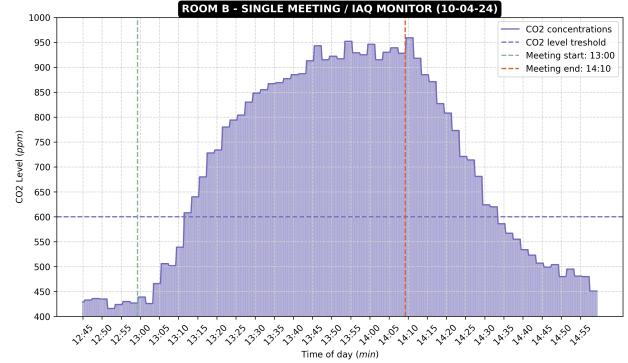
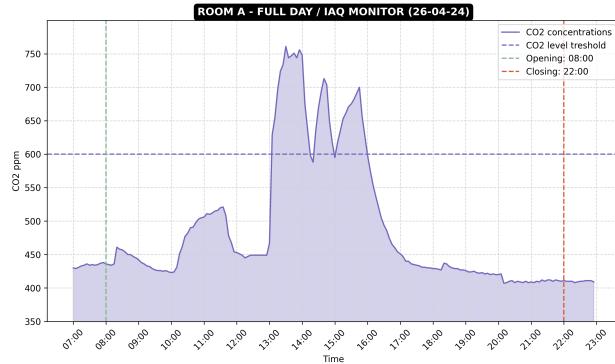
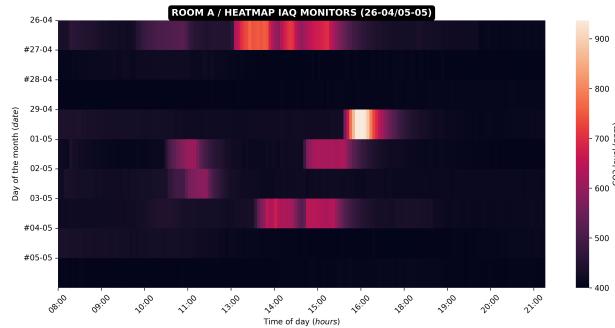


(c) IAQ Satisfaction

Figure 18: Stacked bar charts of the Likert-scales on IAQ awareness, perceived and satisfaction

## Appendix P MONITOR DATA

Plots of the indoor air quality monitor data logs (see Figure 19, Figure 20, Figure 21). All graphs show the CO<sub>2</sub> concentrations in either the small (Room A) or large (Room B) meeting rooms. The plots are subsets of the data logs which show interesting patterns and peaks based on the observed timeframe of the data collection phase.

(a) Single meeting CO<sub>2</sub> concentrations in Room A(b) Single meeting CO<sub>2</sub> concentrations in Room BFigure 19: IAQ monitoring CO<sub>2</sub> concentrations of a single sample meeting based on the start and end time of the meeting(a) A day of meetings CO<sub>2</sub> concentrations in Room A(b) A day of meetings CO<sub>2</sub> concentrations in Room BFigure 20: IAQ monitoring CO<sub>2</sub> concentrations of a sample day meeting based on the opening hours of the building

(a) Heatmap of ten days of monitoring in Room A



(b) Heatmap of ten days of monitoring in Room B

Figure 21: IAQ monitoring heatmap CO<sub>2</sub> concentrations of the sample ten days based on the opening hours of the building

## Appendix Q EVALUATION INTERVIEWS

Semi-structured interview outline for the evaluation sessions conducted in English where the prototype is installed in situ within a meeting room on the sixth floor of the Lab42 building. The questions and structure below served as a guideline for the interviews and follow-up questions were asked based on the responses of the participants.

### **Introduction:**

First of all, thank you for participating in this evaluation study researching indoor air quality and testing the proof-of-concept prototype Bluebird. This evaluation study consists of three parts, 1) a semi-structured interview with questions about your activity within this building and notion of IAQ 2) a usability test of the functioning and perception of the prototype and 3) a score questionnaire rating the prototype on several properties. As a participant you cannot do anything wrong, this is a prototype so only it can malfunction. During the testing I will ask you to think out loud and will occasionally ask follow-up questions. Pilot tests of this evaluation session indicated that it will take ~50 minutes.

### **Informed Consent:**

Your participation will be fully anonymized. If you agree, I will record this meeting for archival purposes and transcription. If you feel uncomfortable at any point during this evaluation session, please feel free to stop it at any point. If you don't want to answer any specific questions feel free to state that you would like to skip and I will move on to the next question.

### **Question-set 1: Demographics and roles**

**Introduction:** First I'm going to ask some questions about your demographics and use of this building.

Description	Questions (open-ended)
Demographics for sample size	<p>Q1: What is your age?</p> <p>Q2: What gender do you identify with?</p> <p>Q3: What is your nationality?</p> <p>Q4: What is your level of education?</p>
Role of the occupant	<p>Q5: What do you do in daily life for work?</p> <p>Q6: How would you describe your role within this building?</p> <p>Q7: Where are you usually stationary located in the building?</p>

### **Question-set 2: Activity and frequency**

**Introduction:** Now on to some questions about your activity within this building and how you use the meeting rooms.

Description	Questions (open-ended)
Frequency of activity	<p>Q8: How often do you use this building for various activities?</p> <p>Q9: For what types of activities do you usually use the building for?</p>
Frequency of meetings	<p>Q10: On average how many meetings do you have per week?</p> <p>Q11: On average how long is a typical meeting you attend?</p> <p>Q12: What locations do you typically use for your meetings?</p>

### **Question-set 3: Notion of Indoor Air Quality (IAQ)**

**Introduction:** Lastly some questions about your notion of indoor air quality as a baseline.

Description	Questions (open-ended)
IAQ awareness	<p>Q11: How aware are you of the current IAQ in this space?</p> <p>Q12: How do you perceive the IAQ in this space?</p>
Cognitive and health	<p>Q13: Have you ever experienced cognitive symptoms related to IAQ in a meeting room?</p> <p>Q14: Have you ever experienced health symptoms related to IAQ in a meeting room?</p>

## Appendix R USABILITY TESTS

For the usability tests, we shifted attention towards the prototype that was installed in the meeting room. In all sessions, the researcher and occupants stood up and walked towards the prototype. The occupants were allowed to touch the prototype and observe its movements.

### **Introduction:**

We will move on to testing the prototype. Please imagine you are an occupant having a meeting in the space (meeting room) we are currently in. As you might have noticed on the wall hanging from the ceiling, a prototype of a physical artifact is hung up.

### **Question-set 1: Understanding of the prototype (learnability)**

**Introduction:** To gather some first impressions I would like to get some description of the prototype based on your view of it.

Description	Questions (open-ended)
Description of prototype	<b>Q1:</b> Could you describe in your own words what the physical artifact is?
Look and feel	<b>Q2:</b> What do you think of the overall design of the physical artifact?
Use of materials	<b>Q3:</b> What do you think of the materials the physical artifact is made of?
Communicative properties	<b>Q4:</b> What properties do you think the data physicalization communicates?

### **Question-set 2: Self-reflection of data insight (memorability)**

**Introduction:** I want to gain insight into how likely you are to take preventative action based on data insights.

Description	Questions (open-ended)
Behavioural change	<b>Q5:</b> How and to what extent do you think your awareness of IAQ changes? <b>Q6:</b> How willingly are you to take preventative action based on the data insights the artifact provides?

### **Question-set 3: Design improvements and further development**

**Introduction:** After interacting with the prototype for a bit. This usability test concludes with suggestions for design improvements.

Description	Questions (open-ended)
Good characteristics	<b>Q7:</b> What do you think is the best aspect of this data physicalization, and why?
Design improvements	<b>Q8:</b> What do you think needs most improvement of the design, and why?
Further development	<b>Q9:</b> Is there anything that you would wish to be considered further development of the prototype?

## Appendix S EFFECTIVENESS SCORES

The occupant and researcher sit down on the table again and the occupant is handed the computer or phone of the researcher to fill in an online statement questionnaire on Qualtrics with Likert scales.

### **Introduction:**

The last part is an online score rating statement and hypothesis about the prototype.

### **Effectiveness scores Rating statements and hypothesis**

**Introduction:** Please rate the following statements based on the five-point scale (likert)

Description	Statements (Likert-scale 5 points 1: Strongly disagree 5: Strongly agree)
Attitude towards using	<b>S1:</b> I enjoyed viewing the data physicalization and interacting with the prototype
Perceived Ease of use	<b>S2:</b> I thought the data physicalization was easy to use and interpret
Learnability of data	<b>S3:</b> I would imagine that most people would learn to use the data physicalization very quickly
Perceived Usefulness	<b>S4:</b> I derived insights into state of the indoor air quality based on the data physicalization
Behavioural Intention	<b>S5:</b> I likely will change my behaviour and take preventive measures based on the data insights

### **Final remarks:**

Do you have any other final remarks you want to share about the prototype? If not, this marks the end of this evaluation session. Thank you so much for your valuable time, insights and feedback. If you want any more information or the published results of this research please contact me.

## Appendix T EVALUATION PARTICIPANT SAMPLE

Sample size and demographics (see Table 4) of the participants who participated with their expertise and building activity.

Participant	Gender	Age	Expertise	Education	Days in building	Working Space
P1	Male	35	HCI/Researcher	PhD	3 days a week	Lab Office Space
P2	Male	28	Software Engineer	Master	5 days a week	Shared Office
P3	Female	30	UX Designer	Bachelor	4 days a week	Open Workspace
P4	Male	32	Data Scientist	Master	2 days a week	Private Office
P5	Female	25	Research Assistant	Bachelor	1 day a week	Lab Office Space

Table 3: Participants sample of the Evaluation Sessions demographics

## Appendix U DESIGN IMPROVEMENTS AND RECOMMENDATIONS

Coding of main design improvements and recommendations (see Table 3) based on the feedback during the usability testing.

Coding	Design Improvements (DI)	Design Recommendations (DR)	Category
DI-1	Light as material and circular data	An instruction board is recommended to help people understand the visualization	Material type
DI-2	Improved color contrast for better readability	Use high-contrast colors for text and background to enhance readability	Visual design
DI-3	Interactive elements for user engagement	Implement interactive features such as clickable icons to engage users	User Interaction
DI-4	Simplified navigation menu	Provide a simplified and intuitive navigation menu for ease of use	Navigation

Table 4: Design Improvements and Recommendations

## Appendix V STATEMENT LIKERT SCORES

Individual results of the statement scores in a table (see Table 5) and bar chart plot (see Figure 22).

Participant	S1	S2	S3	S4	S5	Average Score
P1	3	5	2	4	1	3.00
P2	4	3	4	2	5	3.60
P3	5	2	3	5	4	3.80
P4	2	4	1	3	2	2.40
P5	1	3	5	4	3	3.20
<b>Average</b>	<b>3.00</b>	<b>3.40</b>	<b>3.00</b>	<b>3.60</b>	<b>3.00</b>	<b>3.20</b>
<b>Variance</b>	<b>2.50</b>	<b>1.70</b>	<b>2.50</b>	<b>1.70</b>	<b>2.00</b>	<b>0.19</b>

Table 5: Participant Scores, Averages, and Variance

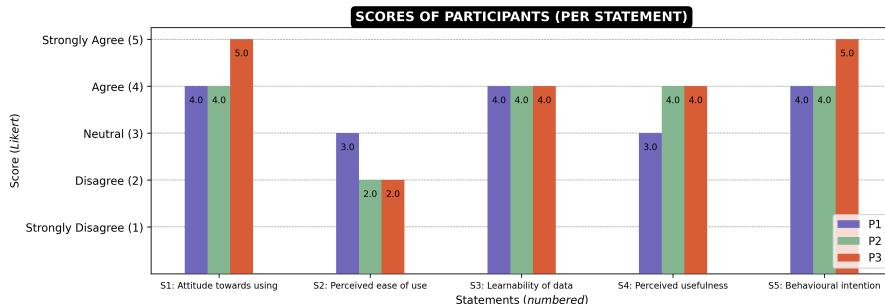


Figure 22: 5-point likert-scales of participants per statement

## Appendix W CONCEPT DIAGRAMS

Design diagrams (see Figure 23, Figure 24, Figure 25) of the brainstormed concepts in medium-fi sketches that show the component breakdown and interaction states.

### Concept-1: Desk Planter (Aspen)

A desk planter or tree in the corner of the room with soil in it. Follows the organic growth of a 'seed' of a flower or tree from seed to sprouts to full flower. The better the air quality the more or faster the plant grows. The movement of the leaves can indicate the wind.

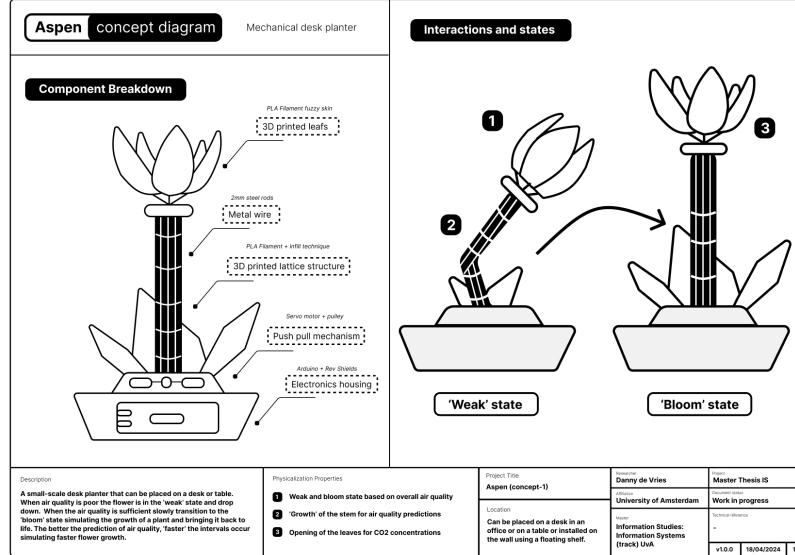


Figure 23: Design diagram of concept one (Aspen)

### Concept-2: Hanging Sculpture (Bluebird)

A hanging planter-type set-up with strings that 'grow' from the ceiling. Fresh air moves the strings. People can walk by, and feel the material (e.g. humidity). Allows most interactivity. Taking inspiration from kinetic sculptures and hanging/floating sculptures.



Figure 24: Design diagram of concept two (Bluebird)

### Concept-3: Wall Kinetic (Crocus)

A moss-like structure on the wall with flower bulbs embedded. The flowers 'open up' based on better fresh air. Taking inspiration from kinetic sculptures.

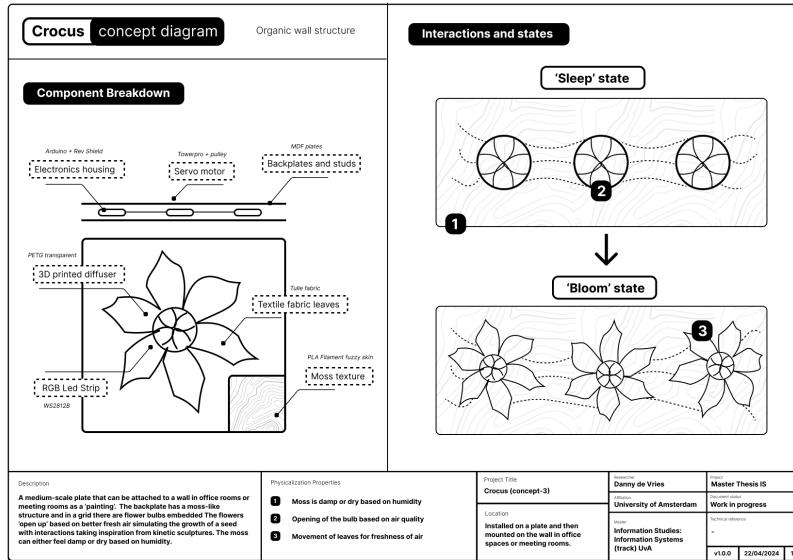


Figure 25: Design diagram of concept three (Crocus)

## Appendix X ACADEMIC SAMPLE CASE STUDIES

In the ideation phase and development of the concept models, an exploration of 10 academic case studies were instrumental in informing the design of the prototype. Table 6 provides an overview of all these case studies.

Nr.	Sample	Author(s)	Year	Venue	Reference
1	Econundrum	Kim Sauvé et al.	2020	ACM	<a href="#">Econundrum</a>
2	Caimform	Maxime Daniel et al.	2019	HAL	<a href="#">Caimform</a>
3	Dataponics	Robert Cercós et al.	2016	DEG	<a href="#">Dataponics</a>
4	Garden of Eden	Thorsten Kiesl et al.	2007	UFG	<a href="#">Garden of Eden</a>
5	Pudica	Olivia Seow et al.	2022	MIT	<a href="#">Pudica</a>
6	ComfortBox	Hamed S. Alavi et al.	2017	IFIP	<a href="#">ComfortBox</a>
7	ComFeel	Ugo Sassi et al.	2020	ACM	<a href="#">ComFeel</a>
8	WindowWall	Patrick Bader et al.	2020	ACM	<a href="#">WindowWall</a>
9	Ambient Influence	Yvonne Rogers et al.	2010	ACM	<a href="#">Ambient Influence</a>
10	Hilo-wear	Shailin Zong et al.	2020	CHI	<a href="#">Hilo-wear</a>

Table 6: Overview of the 10 academic case studies used for the ideation phase and concept models.

## Appendix Y NON-ACADEMIC SAMPLE CASE STUDIES

In the ideation phase and development of the concept models, an exploration of 24 non-academic case studies were instrumental in informing the design of the prototype. Table 7 provides an overview of all these case studies.

Nr.	Sample	Creator(s)	Year	Venue	Reference
1	Birdie Design	Birdie Design	2024	non-academic	<a href="#">Birdie Design</a>
2	Tree of Ténéré	Studio Drift	2017	non-academic	<a href="#">Studio Drift</a>
3	Petal Clouds	ART+COM	2018	non-academic	<a href="#">ART+COM</a>
4	Electro Magnetic Field	Jennifer Allora	2022	non-academic	<a href="#">Arkive</a>
5	Wind 3.0	Studio Roosegaarde	2011	non-academic	<a href="#">Studio Roosegaarde</a>
6	Floralis Generica	Eduardo Catalano	2002	non-academic	<a href="#">Plaza Unidas</a>
7	Flylight	Studio Drift	2013	non-academic	<a href="#">Studio Drift</a>
8	Spectra-2	FIELD.IO	2015	non-academic	<a href="#">FIELD.IO</a>
9	Meadow	Studio Drift	2023	non-academic	<a href="#">Studio Drift</a>
10	Pet Lamp	Álvaro Catalán	2024	non-academic	<a href="#">Pet Lamp</a>
11	Living map	Sigitas Guzauskas	2018	non-academic	<a href="#">Living map</a>
12	Harassment plants	Nazareno Andrade	2022	non-academic	<a href="#">Harassment plants</a>
13	Popsicles of Pollution	Hung Yi-Chen,	2017	non-academic	<a href="#">Popsicles of Pollution</a>
14	Yellow Dust	C+arquitectos	2017	non-academic	<a href="#">Yellow Dust</a>
15	Touching air	Miriam Quick	2015	non-academic	<a href="#">Touching air</a>
16	Physical Weather Display	Ken Kawamoto	2015	non-academic	<a href="#">Physical Weather Display</a>
17	Inequalities Quipu	Ewa Tuteja	2021	non-academic	<a href="#">Inequalities Quipu</a>
18	Summer in the city	Carola Bartsch	2015	non-academic	<a href="#">Summer in the city</a>
19	WeatherWindow	Tim Dye	2014	non-academic	<a href="#">WeatherWindow</a>
20	Point cloud	James Leng	2012	non-academic	<a href="#">Point cloud</a>
21	Tele-present water	David Bowen	2011	non-academic	<a href="#">Tele-present water</a>
22	Real-time Warning	Rodrigo Medeiros	2012	non-academic	<a href="#">Real-time Warning</a>
23	airFIELD	Dan Goods	2012	non-academic	<a href="#">airFIELD</a>
24	Shanghai Spheres	Michael Tait	2018	non-academic	<a href="#">Shanghai Spheres</a>

Table 7: Overview of the 24 non-academic case studies used for the ideation phase and concept models.

## Appendix Z FABRICATION TECHNIQUES

In the ideation phase and development of the concept models, an exploration of 4 academic and 6 non-academic case studies were instrumental in informing the fabrication of the prototype. Table 8 provides an overview of all these case studies.

Nr.	Sample	Author(s)	Year	Venue	Reference
1	FibeRobo	Jack Forman et al.	2023	MIT Media Lab (TGM)	<a href="#">TGM</a>
2	DefeXtiles	Jack Forman et al.	2020	MIT Media Lab (TGM)	<a href="#">TGM</a>
3	Cillilia	Jifei Ou et al.	2016	MIT Media Lab (TGM)	<a href="#">TGM</a>
4	UniMorph	Felix Heiberg et al.	2015	MIT Media Lab (TGM)	<a href="#">TGM</a>
5	Geometric Floating Fabric	Billie Ruben	2020	non-academic	<a href="#">Printables</a>
6	Print On Fabric	Damien Jorrard	2021	non-academic	<a href="#">Thangs</a>
7	Nasa Fabric Mk3	John Bowler	2018	non-academic	<a href="#">Thingiverse</a>
8	Servo Flower	Job Smolders	2018	non-academic	<a href="#">Pinshape</a>
9	Multiuse Flexible Fabric	Posix	2024	non-academic	<a href="#">Printables</a>
10	Leaf Decorative Holder	Trilobyte3D	2022	non-academic	<a href="#">Printables</a>

Table 8: Overview of the 4 academic and 6 non-academic sample case studies used as inspiration for fabrication of the prototype.