

# From 2D to 3D Mixed Reality Human-Robot Interface in Hazardous Robotic Interventions with the Use of Redundant Mobile Manipulator

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**Abstract:** 3D Mixed Reality (MR) Human-Robot Interfaces (HRI) show promise for robotic operators to complete tasks more quickly, safely and with less training. The objective of this study is to assess the use of 3D MR HRI environment in comparison with a standard 2D Graphical User Interface (GUI) in order to control a redundant mobile manipulator. The experimental data was taken during operation with a 9 DOF manipulator mounted in a robotized train, CERN Train Inspection Monorail (TIM), used for the Beam Loss Monitor robotic measurement task in a complex hazardous intervention scenario at CERN. The efficiency and workload of an operator were compared with the use of both types of interfaces with NASA TLX method. The usage of heart rate and Galvanic Skin Response parameters for operator condition and stress monitoring was tested. The results show that teleoperation with 3D MR HRI mitigates cognitive fatigue and stress by improving the operators understanding of both the robot's pose and the surrounding environment or scene.

## 1 INTRODUCTION


In the environment where there are risks for human operators such as presence of radiation or magnetic fields, or lack of oxygen in underground/underwater areas, the robotic operations can be indispensable. Nowadays, the most commonly used interfaces to control robots in radioactive scenarios are 2D GUIs with keyboard/joystick inputs and camera feedback. However, thanks to the development of sensors, communication, electronics and faster computation, 3D interfaces, which show the world as we see with our eyes, can bring multiple advantages in terms of additional information available to the operator and making the operation more efficient.


To describe the purpose of the research on the Mixed Reality Human-Robot Interface at CERN, first a specific project and the teleoperation task have to be explained. One of the tasks executed with the aid of robots at CERN is to verify Beam Loss Monitors (BLMs) signal condition with a radioactive source ap-


proached to the monitors in the Large Hadron Collider (LHC) tunnels. Its complexity lies in the need of full perception of the configuration of the robot, robot's position in the surrounding area, approach to the device and collision avoidance, which all are crucial during the intervention.


### 1.1 Motivation

At CERN, an ongoing project is to verify that each of 4500 BLMs located in the LHC is functioning correctly. Currently, these measurements are performed manually by an expert who brings a radioactive source, held via a tool that they hold, close to the monitor (BLM), and checks that the device is responding correctly. This methodology has a few drawbacks. It is time-consuming due to the number of devices, and due to the difficulty of the approach. Some of the BLMs are located next to a pathway (Figure 1), but others can be hidden behind the magnets or equipment. Another disadvantage is that the expert operator will absorb some radiation. Therefore, it was proposed to replace the manual measurements via a robotic system. Specifically, the project is to use the Train Inspection Monorail (TIM) (Di Castro et al., 2018b) as a platform to transport a robotic manipulator which can reach most the the BLMs in

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the Large Hadron Collider (LHC) tunnels. An illustration of the robotic task is shown in Figure 1, where the BLM robotic manipulator end effector approaches a BLM installed on the magnet dipole in the LHC. The manipulator is attached to the TIM (Figure 4) platform which travels on a rail mounted on the tunnel ceiling. In order to have enough range and approach flexibility, a redundant robotic manipulator with 9 degrees of freedom has been designed (Figure 1). The operation is ultimately planned to be executed either semi-autonomously via teleoperation, or fully autonomously. However, the use of the robot presents multiple challenges, including:

1. Collisions and self-collisions due to limited perception of the environment and robot's pose;
2. Manipulator redundancy and singularities;
3. Limited bandwidth and coverage of connectivity;
4. Targets (BLMs) not being visible at the beginning of the approach and not precisely located in the design model.

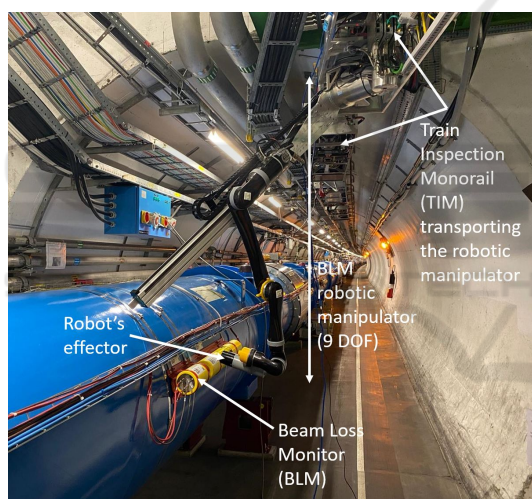


Figure 1: Approach with the BLM robotic manipulator in the LHC tunnel.

## 1.2 State of the Art

The CERNTAURO robotic framework developed at CERN for autonomous and supervised teleoperations in harsh environments is presented in (Di Castro et al., 2018a). The system was tested in tens of real interventions and demonstrated efficiency and flexibility in the executed tasks. The extension of the system with cooperative teleoperation and multi-robot interface is explained in (Veiga Almagro et al., 2020). The cooperative behaviour was tested with the CERNTAURO project at CERN and with the TWINBOT project in an underwater scenario and proved that

one operator can handle an intervention with multiple robots in a safe way. Furthermore, a preliminary study of Virtual Reality Interface for guiding underwater robots in the TWINBOT project (de la Cruz et al., 2020) was carried out and feasibility and usability tests of the VR HRI module were done. A depth estimation vision system based on tracking metallic objects was tested with the CERN HRI is described in (Almagro et al., 2019). It presents an operator-supervised method with AR elements to facilitate teleoperated manipulation tasks. The difficulty of dealing with reflections from metallic surfaces was solved.

The subject of hyper-redundant robots is discussed in (Andrés Martín Barrio, 2020) where the author discusses the problems with modelling and control when teleoperating such robots. Different problematic aspects are discussed, including those related to redundancy, such as inverse kinematics solutions, pose awareness and human-robot interfaces. They found that immersive human-robot interfaces provided significantly better efficiency, situational awareness and visual feedback. The impact of the use of a set of "interaction tools" was also measured. They concluded that the use of a physical VR controller had a relatively high efficiency, however the use of gestures and voice commands had better performance.

Another study (Chacko and Kapila, 2019), which focused on AR solutions, presented how visual feedback from a camera can be merged with additional information from object recognition algorithms, decreasing the workload of the operator. The small measured workload and simplicity indicated potential advantages that could be applied in the experiments presented in this paper.

The telepresence can be affected by many factors such as latency, frame of reference, field of view and frame rate. These parameters can lower the performance and create issues. How vision and interaction fidelity affected spatial cognition and workload in immersive interfaces is studied in (Almeida et al., 2020). The results give recommendations how telepresence improvement techniques impact the operator's effort.

## 1.3 Paper Structure

Section 2 presents the overall architecture of the CERN robotic systems and the "2D" and "3D" Human-Robot Interfaces. Section 3 describes the experiments undertaken with the interfaces and operator monitoring sensors. Finally, Section 4 summarizes the work, results from the experiments and presents a road-map for future developments.

## 2 SYSTEM DESCRIPTION

The overall architecture of the robot’s control system is presented in Figure 2. The system is composed of two subsystems. The first is a robot with its configuration of physical devices connected to a compact computer with a Linux operating system. The computer runs the CERN Robotic Framework, which is a C++ set of programs that operate devices and communicates with the external world, including the processes responsible for real-time control of motors, arms, sensors and cameras. The second sub-system is the operator’s side, composed of the Human-Robot Interface in the form of either the 2D CERN Robotic GUI (developed with WPF technology in C#) or the 3D Mixed Reality GUI (developed in Unity, in C#), both running on a Windows machine. In the diagram in Figure 2, the part of the system which has been newly developed for this research is highlighted in bold.

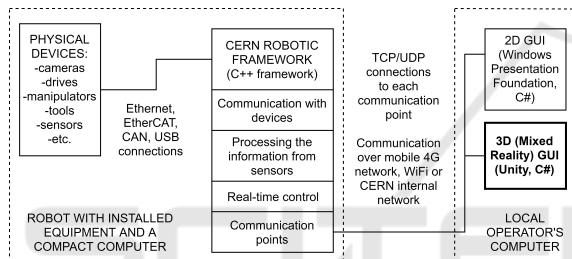


Figure 2: Architecture diagram of the robot control.

### 2.1 2D CERN Robotic GUI

Currently, the operational control of the robots at CERN is performed with the CERN Robotic GUI, which is an application connecting directly to the robot via WiFi, using CERN’s internal network or via a VPN running of the 4G mobile network. The user has the ability to:

- Customize the robot’s configuration for a mission;
- Control the movement of a robot’s base (i.e. the omnidirectional platform shown in Figure 3, monorail train shown in Figure 4);
- Control a robotic manipulator in joint and Cartesian coordinate systems (base and tool references);
- See video streams from different types of cameras (RGB, depth, thermal) and record them;
- Control tools (i.e. gripper) and have sensor feedback (i.e. force sensor);
- Perform semi-autonomous tasks like unfolding the manipulator, approaching a defined/recorded position;

- Control the robot with different input devices (keyboard, gamepad, space mouse).

The architecture of the core of the CERN Robotic GUI has been fully described in the Section IV in (Lunghi et al., 2019).

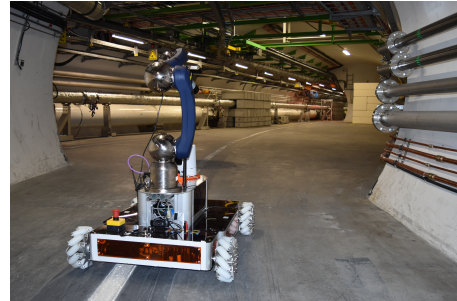


Figure 3: Omnidirectional robotic platform with an installed arm.



Figure 4: Train Inspection Monorail which can haul specialized wagons i.e. with a manipulator.

A control view with the robot’s control inputs and views from the cameras is shown in Figure 5. On the left vertical ribbon, there are tabs to switch between different views to control the robot’s base, arm, cameras, state machine and change the settings of the application. For the arm control, in the upper right corner, the two control modes (joint and Cartesian) can be toggled. In the lower right corner, different input devices (keyboard, space mouse or gamepad) can be selected. In the area on the bottom, the current input device panel is presented. In the upper left corner, there is the cameras selection tool, which streams are placed in the upper and center parts of the window.

### 2.2 3D Mixed Reality GUI

The Mixed Reality Human-Robot Interface for controlling robots with real-time feedback has been developed and experimentally tested. At CERN, operators are using mouse and keyboard control input on weekly basis for robotic interventions. Whilst these inputs devices are not novel, they are very reliable, well-understood and give the operator full trust and

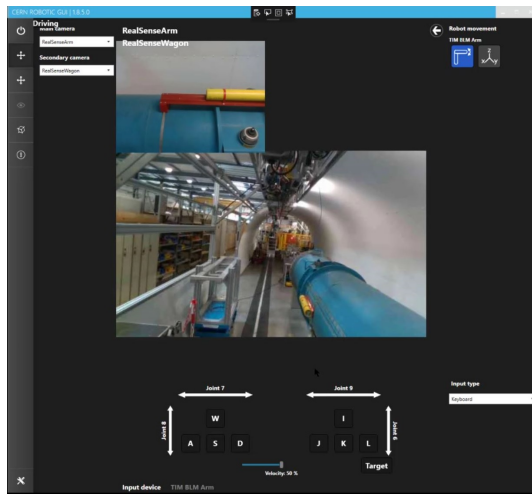


Figure 5: CERN Robotic GUI control view with an arm’s control and cameras view, keyboard control.

high-resolution control options. Other input devices such as gesture recognition and voice control and very interesting to further study to understand their applicability in real-case scenarios, but are not the subject of this research paper. The main functionalities that have been already implemented are:

- Visualization of the robot’s pose in relation to a modelled environment visible from any perspective;
- Planning of the next position and sending a command to move when it’s ready;
- Real-time control of the robot and its manipulator;
- Camera streaming in the 3D scene.

In the Figure 6 a planning mode is used to first position the arm (the transparent model) for the best approach, and then launch the movement in joint control. In Figure 7, real-time control is used with immediate commands and feedback reading. The operator can select which joint to move.

The second possible mode is real-time control where the command is send immediately to the robot to execute and the current positions are read constantly from the robot. In Figure 7 the operator can select a joint marked in red and change the angle to approach the target.

Apart from joint coordinate system control, the end effector can be steered in the Cartesian world or tool coordinate systems. In Figure 8 there are 3 illustrations, the first depicts a gizmo that can be moved and rotated by dragging it with a mouse, the second shows a gizmo that controls only the rotation and the third shows translation motion only. As the manipulator consists of 9 joints (a redundant system), it was concluded that only the inverse kinematics (IK) con-

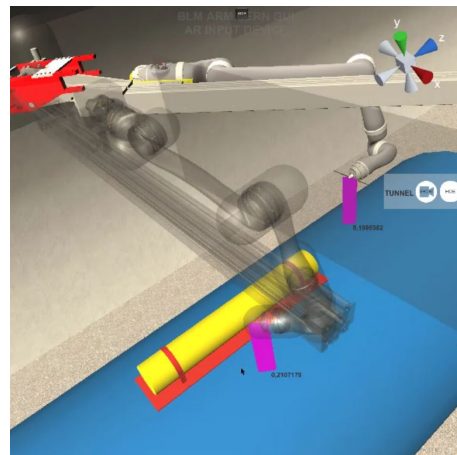


Figure 6: VR control of the arm in the planning mode.

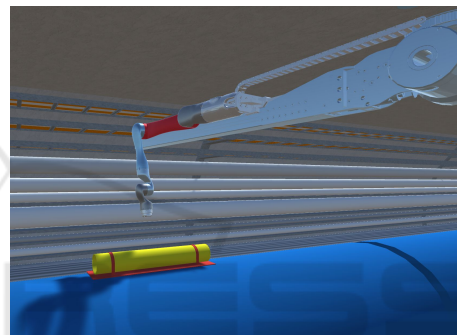


Figure 7: VR control of the arm in the real-time control mode, the active joint is marked in red.

trol of the last 6 joints is needed, while the first 3 joints can be controlled in joint space. This limits the complexity and decreases the computational time of the IK algorithm, while still allowing the operator enough workspace to complete the task.

The arm can be controlled with the use of the interactive markers presented in the scene (Figure 9), presenting the direction of the joint movement, its angle and clickable controls.

### 3 EXPERIMENTS

An experiment was conducted to evaluate the use of the 3D environment and its effect on the operator’s workload and efficiency compared to the use of the standard GUI with the 2D interface. In the 3D environment, the operator could see not only the streams from cameras but also the real-time model of the the robot and the offline environment that was prepared before the intervention. The model of the robot was placed in the environment according to measurements of the setup. In this experiment, there was no

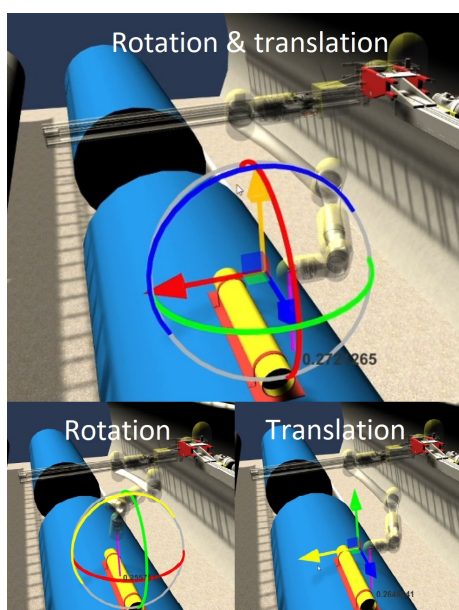


Figure 8: Inverse kinematics control with a gizmo that can be dragged with a mouse.

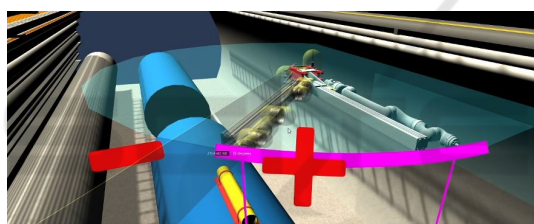


Figure 9: Interactive joint position markers and controls in the scene.

live positioning, 3D point cloud, force feedback nor other collision detection feedback. The experiment also tested the user’s behaviour, to see if he or she would be focused more on the camera feedback or 3D model, and what would be the response to small discrepancies between the real robot’s position and the position in the Virtual Reality related to the external environment. In this paper, we focus on the use of standard inputs such as a keyboard and a mouse to interact with the Virtual Reality environment, as they are readily available and universal. In both 2D and 3D systems, the time delays are minimal and much lower than the limit of 300 ms where the operator would change the control strategy. This behaviour was investigated in the section “Navigation task with time-delay” of (Lunghi et al., 2019).

During the experiment the heart rate and the galvanic skin response (GSR) of the operator were measured and recorded to see how the volatility can be correlated with the events that occur during the operation. It could be a collision, malfunction of soft-

ware or hardware, or network delays. A more difficult position of the arm, collision vicinity or other stress sources could also cause increased stress.

### 3.1 Setup

A mock-up of the LHC tunnel (Figure 10) was used to represent a real scenario where the end effector had to approach the BLM device (yellow cylinder). The manipulator is installed on the TIM robot moving on a rail attached to the ceiling. At the end of the effector there is a camera.

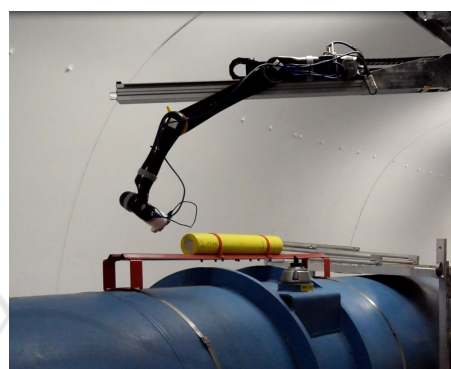


Figure 10: Experiment scene.

In the experiment, the goal was to approach the BLM in 3 different positions of the effector shown in Figure 11 within a specified tolerance of angles with an unrestricted pose of the rest of the manipulator.

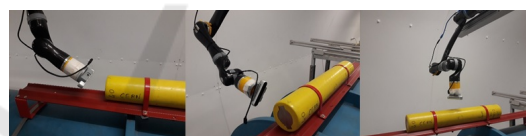


Figure 11: Position goals (from the side, from behind and from above).

The person used a laptop with the GUI in a separate room isolated from the experiment scene (Figure 12). The full cycle of familiarisation training with the GUIs, operating the arm, measurements and feedback was performed by 4 ( $n = 4$ ) people. It was a pilot project with the small number of subjects to understand if indicative results show promise in expanding this area of research. The results can be considered as indicative/early-stage. The subjects were aged 20-35, they were not operating the robots before but they had at least basic knowledge in robotics.

### 3.2 Workload Measurement

The user experience was assessed with the aid of the user’s responses to the NASA Task Load Index (TLX)



Figure 12: Operator's local computer with the open Mixed Reality GUI. The heartbeat and GSR sensors are worn on hands.

workload questionnaires (Hart, 2006) and via open feedback written at the end of the experiment. According to the responses, in the chart shown in Figure 13, there is a weight distribution of the elements contributing to the workload. The Physical Demand has the lowest weight as the control does not require any other activity other than keyboard and mouse operation. The highest weight was given to Mental Demand and its derivatives, as they played a significant role regarding performance and effort - which includes additional Mental Demand.

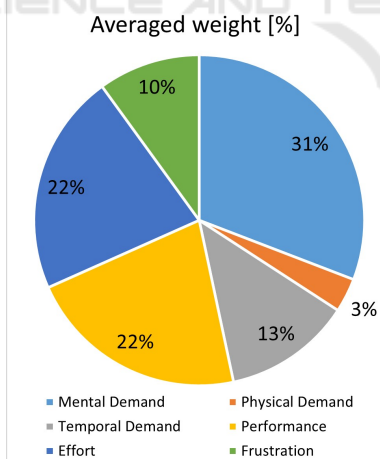


Figure 13: Averaged weights in NASA-TLX questionnaires.

In Figures 14 and 15 the ratings of the workload subscales with marked minimum, maximum and average values from both tests - 2D and 3D GUIs are shown. From these values, it can be deduced that Frustration varied significantly depending on the per-

son and the Physical Demand was low, however the other subscales averaged around the value of 60-70. The biggest difference between 2D and 3D GUIs was in the Mental Demand subscale. It is possible that the mental demand may only have been lower as the users could choose their viewpoint in the scene, but this indicates that the use of a 3D simulated environment with flexibility of viewpoints provides a big advantage to ease of teleoperation.

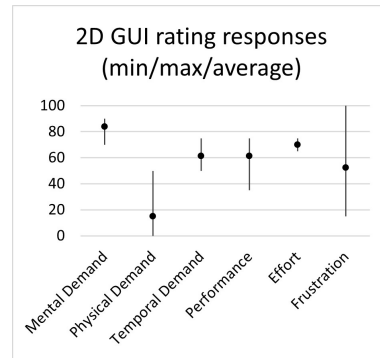


Figure 14: Rating responses for 2D GUI.

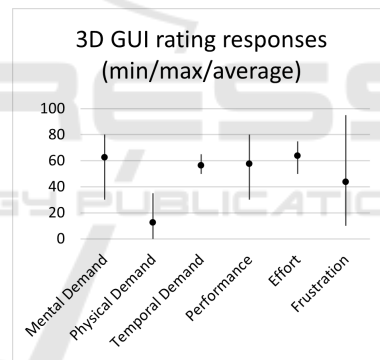


Figure 15: Rating responses for 3D GUI.

Overall, the workload difference between the GUIs was 14% (61 for 3D to 71 for 2D).

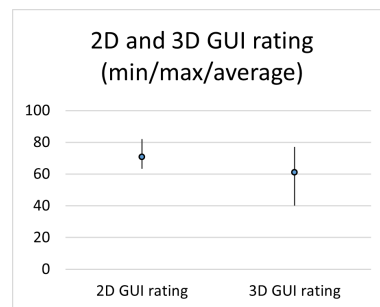


Figure 16: 2D and 3D GUI ratings.

Valuable points can also be drawn from the written feedback:

- In the operation with the 2D GUI, the views from the cameras played a big role. Because the camera axis was tilted to have a view from above, it was not easy to understand the orientation of the end effector with respect to the stream. There was a problem when the arm went out of the camera frame so that the pose of the manipulator was not visible, which sometimes made the operation very difficult if the operator did not remember the previous joint configuration.
- Operators generally focused on the camera views in the 2D GUI and on the model view in the 3D GUI. The use of cameras only helped to prevent collisions when the whole arm was visible in the stream. However, having the model and environment in 3D made the movements much more comfortable, as the scene can be seen from any angle, which according to the feedback, was the biggest advantage of this view. On the other hand, too much trust was put in the model, and if there were any discrepancies between the models and the reality or there was an un-modelled obstacle, there was an increased risk of collision if the camera streams were not checked regularly.
- The experiment focused on the use of the joint coordinate system but, especially in approaching the BLMs, the Cartesian coordinate system control would be more suitable and could make the operation easier.

### 3.3 Galvanic Skin Response Measurement

GSR sensors detect changes in the electrical skin conductance caused by sweat gland activity. The moisture changes the balance of ions in the fluid, which results in measurable changes. Two electrodes were placed on emotionally sensitive locations with high sweat glands density. In this experiment, the sensors were placed on fingers and the device was attached to the wrist (Figure 17).



Figure 17: Shimmer GSR device attached on a hand.

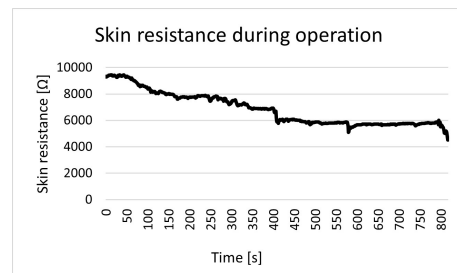


Figure 18: Skin resistance graph.

An example skin resistance dataset recorded during an operation is shown in the Figure 18. The value dropped over time with a few steeper variations, meaning that the glands activated and the conductance increased. This response may be correlated with an increased operator’s stress. However, it was noticed that simply the contact with the electrodes and Velcros causes minimal sweating under them. The other parameter is the force with which the electrodes are pressed to the skin - a higher force causes less resistance. Moreover, small movements of the finger to touch the keyboard or mouse may have provoked noticeable spikes in the signals. Thus, further study is necessary. From the observations and analysis of the recordings, the following conclusions were drawn:

- The electrodes should be worn at least 1 hour under stable conditions to stabilize sweating;
- The use of electrodes with conductive gel attached with an adhesive to a place which does not move may be a solution to eliminate the effects of the motion of the fingers;
- An emotional fast response is clearly visible on graphs for a distinctive event (i.e. unexpected behaviour, collision, high stress) but slowly increasing stress may be harder to deduct.

### 3.4 Heartbeat Measurement

The stress of a person can be correlated with his or her heart rate measured using a photoplethysmograph (PPG) optical sensor (Mohan et al., 2016). The sensor can be clipped on an ear lobe or be integrated in a smart watch. In the experiment the second option was used.

An example heart rate graph recorded during an operation is shown in Figure 19. It is visible that the base frequency is around 70 beats per minute (bpm), however there were moments when the frequency raised up to 100 bpm. It may be interpreted that the person was dealing with more mental load or breathing pattern changed due to the performed task. In a steady state, during a typical work in front of the computer, the heart rate doesn’t vary more than a few

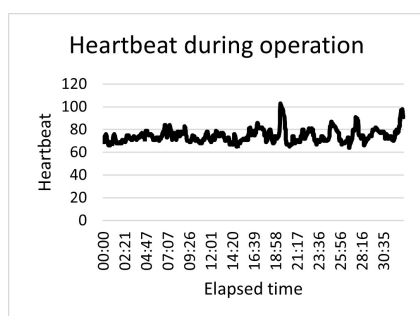


Figure 19: Heart rate graph.

beats per minute, what was checked with the same sensor before the experiment.

## 4 CONCLUSIONS AND FUTURE WORK

This paper describes how a Mixed Reality HRI can be used in a real hazardous scenario where a redundant manipulator is used via teleoperation of an operator to perform an inspection task. It presented the robotic system's architecture and functionalities that were achieved. The comparison of the standard 2D GUI and the 3D Mixed Reality GUI was made in an experiment where the workload and operator's biometric parameters were measured. The main conclusion from this experiment was that the teleoperation with 3D MR HRI mitigates cognitive fatigue and stress by improving robot's pose and scene understanding by an operator.

To allow for Cartesian control using this robot, the pose control problem of the redundant manipulator will be studied and different solutions (Jacobian-based, heuristic) will be tested.

To increase the trust and robustness of the simulated environment, real-time point cloud and environment reconstruction is an important evolution in the Mixed Reality control. Future work will be dedicated to integrate these functionalities.

As the 3D environment has been rendered on a 2D screen, the immersion and experience of the user is much better with larger screens. A bigger scene immersion may be achieved with the use of a VR headset and/or different input devices, which could also be controlled with gestures or VR controllers. However, it requires more preparation and setup from the operator in a real intervention where the access time in the area may be limited. Future work will also integrate and evaluate the effectiveness of these devices when performing common teleoperation tasks at CERN.

Further study and tests will be done to compare

the reading with GSR measurement, heartbeat rate and camera recordings to select the factors that clearly impact the operator heart beat and GSR resistance. If the effect is immediate, the values could be communicated to the operator in the GUI in order to let him or her realize about the body reaction to the performed task.

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