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Interactive Conversational AI with IoT Devices for Enhanced Human-Robot Interaction

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2 Abstract

3 *Significance* - The rapid advancements in conversational AI and IoT technologies have opened up new possibilities
4 for human-machine interaction. Despite the progress, a gap exists in integrating these two fields to create more
5 centralized, intuitive, and engaging user experiences. Current integrations typically consist of specialized
6 hardware-software pairs that do not fully leverage the capabilities of advanced conversational models, thereby
7 limiting their applicability. This research proposes a general solution to bridge the capabilities of various IoT
8 devices with the oversight and control abilities of AI language models, enhancing the potential for more versatile
9 and natural IoT-AI-human interactions.

10 *Aim and Approach* - This research presents the design and development of an IoT system operated by an AI
11 language model and conversationally managed by humans to operate robots. Based on this setup, the initial goal is
12 to create a framework for interactively controlling a robotic arm. The approach involves using a Raspberry Pi as a
13 central control system and ChatGPT API to manage conversations and execute given commands.

14 *Results* - The developed IoT-AI system demonstrated efficient and reliable human-robot interaction where the
15 user can entertain a conversational interaction with the robotic arm. It effectively captures user voice inputs,
16 processes them through advanced AI models, and generates appropriate commands for the robotic arm, achieving
17 an average voice-to-motion latency of 5.5 s. An example of commands are “engage arm”, “move right 20” (i.e.
18 move the robotic arm to the right of 20 cm) combined with more conversational commands such as “can you
19 hear me?”, “what’s your name?”. While some latency and voice recognition challenges exist, the overall
20 performance confirms the viability of using conversational AI for natural and intuitive robotic control.

21 *Conclusions* - This research successfully integrates conversational AI with IoT devices, resulting in a more user-
22 centric and efficient human-robot interaction. The system highlights the significant potential of precisely
23 translating natural language commands into robotic actions, enhancing user experience and operational efficiency.

24 **Keywords:** Artificial Intelligence; Intelligent Communication; Conversational AI; IoT; Human Machine
25 Inter4action; Human Robot Interaction keyword.

26

27 1. Introduction

28 The robotics industry is increasingly incorporating *Artificial Intelligence* (AI) and *Internet of Things* (IoT)
29 technologies, leading to faster deployment, superior exteroceptive awareness and better *Human-Machine*
30 *Interaction* (HMI). Conversational AI, particularly with the introduction of *Large Language Models* (LLMs) like
31 OpenAI’s GPT series, has demonstrated remarkable capabilities in understanding and generating human-like
32 responses [1]. These models can engage in meaningful dialogues, answer questions, and even assist in various
<https://doi.org/>

tasks, making them a powerful tool for enhancing HMI [2]. Meanwhile, IoT devices have become increasingly ubiquitous, enabling seamless integration, connectivity and data exchange between various devices and systems [3]. The IoT ecosystem has expanded to include a wide range of devices, from smart home appliances to industrial sensors and robots, creating a vast network of interconnected devices [4].

Despite these advancements, a gap exists in integrating these three fields to create more centralized, intuitive, and engaging user experiences. Current integrations are often specialized as software hardware package pairs and do not fully leverage the capabilities of advanced language models, limiting their broader applicability [5]. For example, many IoT devices rely on mobile apps or web interfaces for control and monitoring, which can be cumbersome and require users to learn specific commands or navigate complex menus [6]. Additionally, the lack of a unified solution or platform for managing multiple IoT devices can lead to a fragmented user experience and increased cognitive load [7].

In this context, conversational systems are usually combined with IoT systems and, moreover, with robotic devices, however the usual setting is more focused on home applications or on pure conversational mode where the device answer to the end-user command and execute action in a daily life environment. Not so much has been developed in terms of designing conversational system where the operator can interact with industrial devices and specify kinematics details in terms of position and orientation such as the operator effectively impart precise commands.

This research explores a general solution to bridge the capabilities of various IoT devices with the oversight and control of AI language models, enhancing the potential for more versatile and natural IoT-AI-based human-robot interaction and control. By leveraging the power of conversational AI, users can interact with IoT devices using natural language, making the experience more intuitive and accessible. Moreover, integrating multiple devices under a single AI-driven platform can facilitate the user experience and enable more complex and coordinated tasks [8].

This work aims:

- to present the design and development of an IoT system operated by an AI language model and controlled conversationally by humans.
- The approach involves using a Raspberry Pi as a central control unit and a ChatGPT model to manage conversations and execute given commands. The Raspberry Pi is a popular choice for IoT projects due to its accessible cost, flexibility, and extensive community support [9].
- Using the ChatGPT API, the system can leverage the state-of-the-art language understanding and generative capabilities of GPT-3.5, enabling more natural, safe and context-aware interactions [10].

Based on this configuration, the goal is

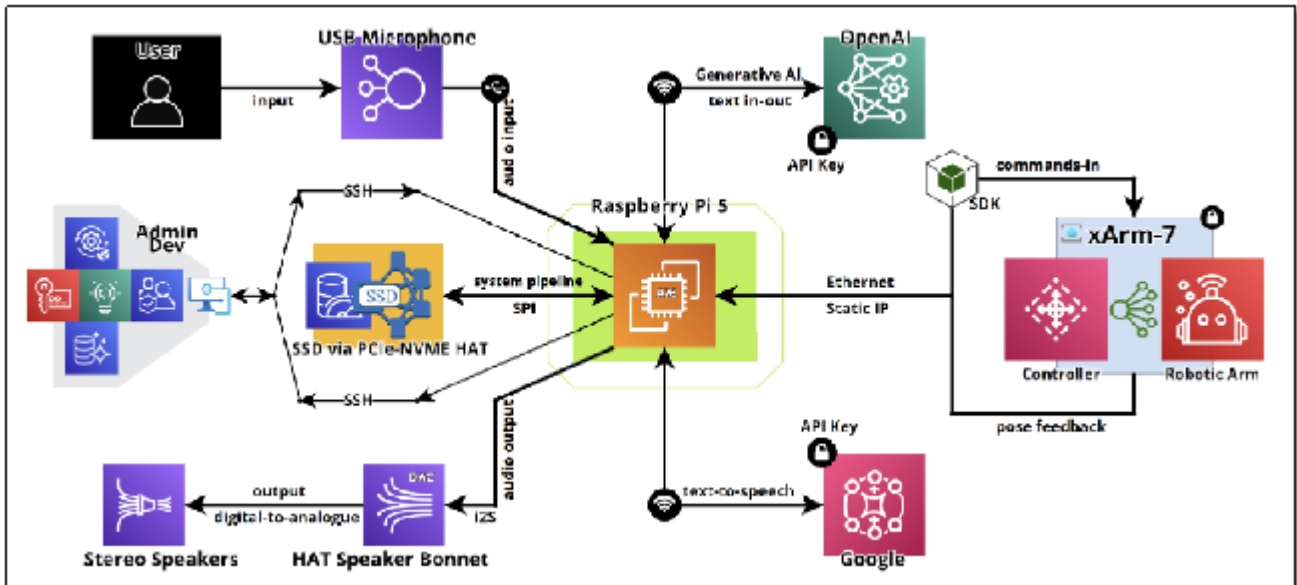
- to design a framework for interactively controlling a robotic arm. Robotic arms have been widely used in industrial settings for many tasks, such as assembly, packaging, and quality control. However, their adoption in smaller-scale applications has been limited due to the complexity of programming and control [11].
- By integrating a robotic arm with conversational AI, this study seeks to make robotic control more affordable and user-friendly, enabling novice users to perform complex tasks and providing greater freedom to define and automate robotic actions.

The integration of conversational AI with IoT devices has been explored in various contexts, such as smart homes [12], healthcare and industrial automation [13]. These studies have demonstrated the potential benefits of using natural language interfaces for controlling and interacting with IoT devices, improving usability and accessibility. However, most of these implementations rely on rule-based or limited-domain chatbots, lacking the flexibility and generalization capabilities of large language models like GPT-3.5. Rule-based chatbots are limited by their predefined set of rules and responses, making them less adaptable to new situations and user needs. On the other hand, large language models like GPT-3.5 can generate more diverse and contextually appropriate responses, enabling more natural and engaging conversations [14].

This research builds upon the existing literature by leveraging the state-of-the-art conversational AI capabilities of ChatGPT3.5-Turbo model and integrating it with a modular IoT architecture. The proposed system aims to provide a more natural and intuitive way of interacting with robotic devices, enabling users to control them through voice commands and engage in meaningful dialogues. The generalization capabilities of large

84 language models are explored to handle a wide variety of user inputs and adapt to new situations, improving the
 85 overall user experience.

86 The structure of this research is as follows: The subsequent section, Methodology, will evaluate the
 87 architectural design of the IoT-AI voice interaction and control system. It will justify the integration of each
 88 hardware and software component while analyzing their capabilities and functionality. The Results section
 89 comprehensively evaluates the system's functionality, latencies, and user experience and discusses various
 90 issues, limitations, and potential solutions. The Conclusions chapter re-evaluates the accomplishments and their
 91 significance while setting goals for future improvements. The paper ends with Appendix 1, which presents the
 92 instructions to setup Raspberry Pi device to migrate booting from SD card to booting from SSD.
 93



94
 95 **Figure 1.** The IoT AI Voice Interaction and Control System Architecture

96 **2. Materials and Methods**

97 The following Section presents the main system architecture and components of the proposed system.

98 **2.1. The Core Processing Unit - Raspberry Pi 5**

99 **Enhanced Processing Power**

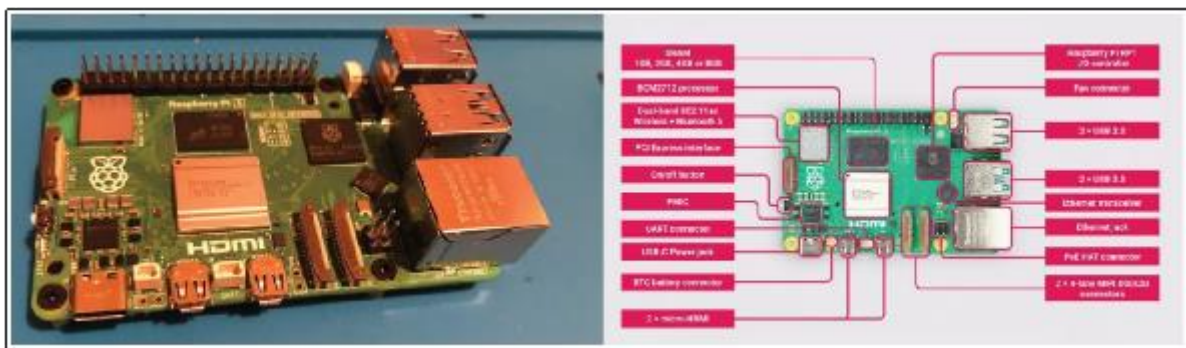
100 The Raspberry Pi 5 serves as the computational core of this IoT system (Fig. 1). It was chosen for its
 101 advanced capabilities, explicitly addressing the need for real-time processing and efficient data management and
 102 for its rapid deployment features. The device is powered by a Broadcom BCM2712, featuring a 64-bit quad-core
 103 ARM Cortex-A76 CPU running at 2.4GHz and offers a significant increase in CPU performance compared to its
 104 predecessors (Fig. 2). This substantial computing power is important for the project as it ensures real-time data
 105 processing from multiple peripheral devices and fast API-based data exchanges, enabling efficient handling of
 106 complex operations at low latencies. Its high clock speed and multiple cores are advanced architecture support
 107 that enhances parallel processing capabilities, allowing the system to efficiently manage simultaneous tasks and
 108 interactions across various devices and applications. These characteristics allow the integration of more complex
 109 functionalities and improved system adaptability, both crucial for maintaining high performance as project
 110 requirements expand and evolve.

111 **Graphics and Display Capabilities**

114 Although not essential for this work, Raspberry Pi 5 is equipped with an impressive 800MHz VideoCore VII
 115 GPU and support for dual 4Kp60 HDMI outputs, empowering the board to handle advanced graphical tasks and
 116 display outputs simultaneously. These GPU resources have the potential to be integrated into multi-threading
 117 processing configurations, thereby improving overall performance of the system. During the initial setup phase
 118 of the operating system, the video output option proved vital, simplifying the installation process by providing
 119 access to the GUI desktop control via the two micro-HDMI ports (2).

120 **Memory Capacity**

121 The version of Pi-5 used in this research is configured with 8GB of LPDDR4-3200 SDRAM. This synchronous
 122 dynamic random-access memory (SDRAM) is engineered to operate at a lower operating voltage and higher data
 123 rate, which reduces power consumption and increases the bandwidth between the memory and the processor to
 124 3200 Mbps. Although 8GB of RAM is enough for this use case, the device capacity can be effectively augmented
 125 by swapping SSD space as virtual memory. In the current settings, the SDRAM direct access to data bits over the
 126 memory bus is superior for read-write operations and provides almost instantaneous executions. As a future
 127 improvement, the project will integrate SSD swap space into the functionality of the system as a fallback
 128 mechanism for cases when the SDRAM reaches full capacity. This integration can leverage the non-volatile
 129 storage advantage of SSDs, ensuring that data is retained even when the power is off. This configuration allows
 130 for efficient memory management and enhances the overall performance and reliability of the system.
 131
 132



133 **Figure 2.** The Raspberry Pi 5 Pi Ports Layout with no components attached
 134

135 **Enhanced Storage Solutions**

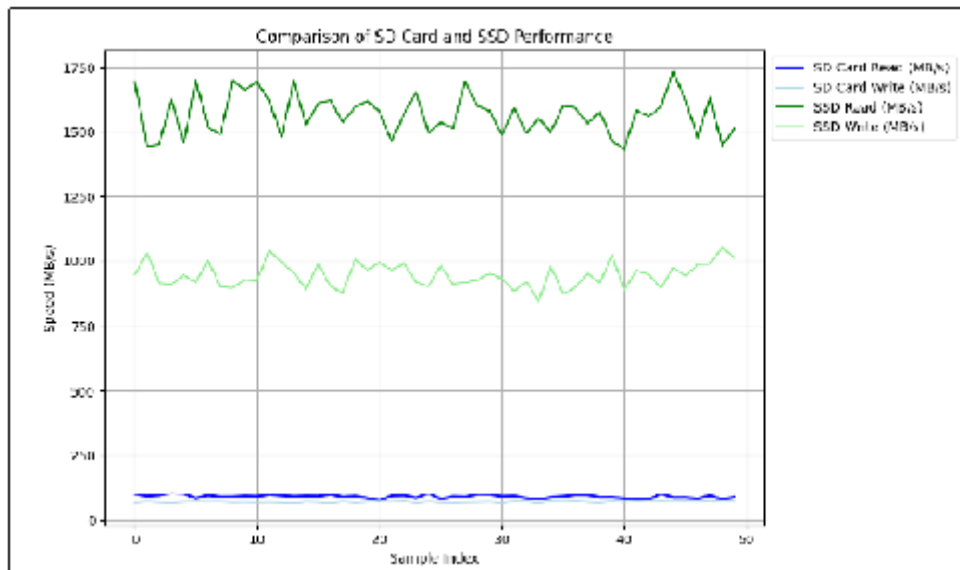
136 The Raspberry Pi 5 is configured by default to utilize the latest SDR104 micro-SD cards for storage and
 137 booting, featuring an SD card slot that supports the UHS-I (Ultra High Speed) standards. This slot is capable of
 138 theoretical peak speeds of up to 104 MB/s for read operations and up to 90 MB/s for write operations. However,
 139 consistently achieving these maximum speeds depends on the card quality and can often be challenging,
 140 rendering them suboptimal for the objectives of this project. To address these limitations, this research has
 141 leveraged the device's single-lane PCIe 2.0 interface to significantly enhance storage and performance
 142 capabilities. By employing a PCIe-based SSD HAT (Hardware Attached on Top) interface, the system has adopted
 143 a Kingston 256GB SSD NVMe M.2, optimized for PCIe Gen3, as its primary boot and storage device. This
 144 configuration leaps the read/write speeds to approximately 2100/1200 MB/s, substantially improving the
 145 original setup (Fig.3). The only difficulty with this upgrade is that it requires advanced knowledge of Linux
 146 system configuration and setups to transfer the OS boot from the SD card to the solid-state drive. The commands
 147 for such a transfer are documented in-depth in Appendix 1.
 148

149 **Connectivity Enhancements & Power Management**

150 One of the main reasons for selecting the Raspberry Pi 5 for this study is its comprehensive networking
 151 capabilities, including both wired and wireless options (Fig. 4A). It incorporates a Gigabit Ethernet interface that
 152 supports Power over Ethernet+ (PoE+), compliant with the IEEE 802.3ab standard. This ethernet setup utilizes
 153 Cat5e or higher twisted pair cables and RJ45 connectors. This setup ensures a theoretical maximum data
 154 transmission rate of 1000 Mbps, making it ideal for data-intensive tasks where signal integrity is crucial, as these

155 cables are inherently resistant to electromagnetic interference. Complementing its wired capabilities, the Pi 5
 156 also offers dual-band wireless networking in accordance with the IEEE 802.11ac (Wi-Fi 5) standard. It operates
 157 on both 2.4 GHz and 5 GHz frequency bands, making it adaptable to various applications. The 5 GHz band
 158 provides increased data rates up to 1300 Mbps and reduced interference, suitable for high-bandwidth
 159 applications like streaming or intensive API data exchanges. Meanwhile, the 2.4 GHz band delivers a maximum
 160 data rate of 450 Mbps, offering extended range and compatibility with older devices. Additionally, the Pi 5
 161 supports Bluetooth 5.0, which includes enhancements like faster speeds and greater ranges compared to
 162 previous versions, as well as Bluetooth Low Energy (BLE) for efficient communication with low-power devices.

163 Moreover, the Raspberry Pi 5 is supplied with a 5V/5A DC power input via USB-C with Power Delivery
 164 support, which enables the device to handle higher power loads necessary for running advanced power-hungry
 165 applications (Fig. 4B). The integration of a real-time clock with an external battery backup further enhances the
 166 system utility, especially in environments where time-synced data logging is crucial.
 167



168
 169 **Figure 3.** SD Card vs SSD, Read and Write Performance
 170

171 This robust combination of wired, wireless, and Bluetooth connectivity options makes the Raspberry Pi 5
 172 the most suitable IoT device to serve as the core processing unit for this project. The Ethernet connection is used
 173 to establish direct, high-speed, and low-latency control with the xArm-7 robotic arm. Wireless connectivity
 174 enables the Pi 5 system to maintain a permanent, stable internet connection, supporting data exchanges between
 175 three APIs: voice-to-text, OpenAI response generation, and text-to-voice. Additionally, the wireless connection
 176 facilitates access to the system via SSH for a developer-supervising computer unit. The Bluetooth connectivity is
 177 intended to be used to exhibit control via AI-interaction of a nearby drone. In addition, there is also the
 178 perspective for future expansion of the system include leveraging the three unused USB ports (two USB 2.0 and
 179 one USB 3.0) to connect and control three more IoT devices in a similar manner.

180 From a connectivity standpoint, as an IoT board, the Raspberry Pi 5 is demonstrating to be well-equipped to
 181 handle diverse networking scenarios, connecting seamlessly with other IoT or Edge devices, handling demanding
 182 data transfers or versatile wireless communications, including low-energy options.
 183

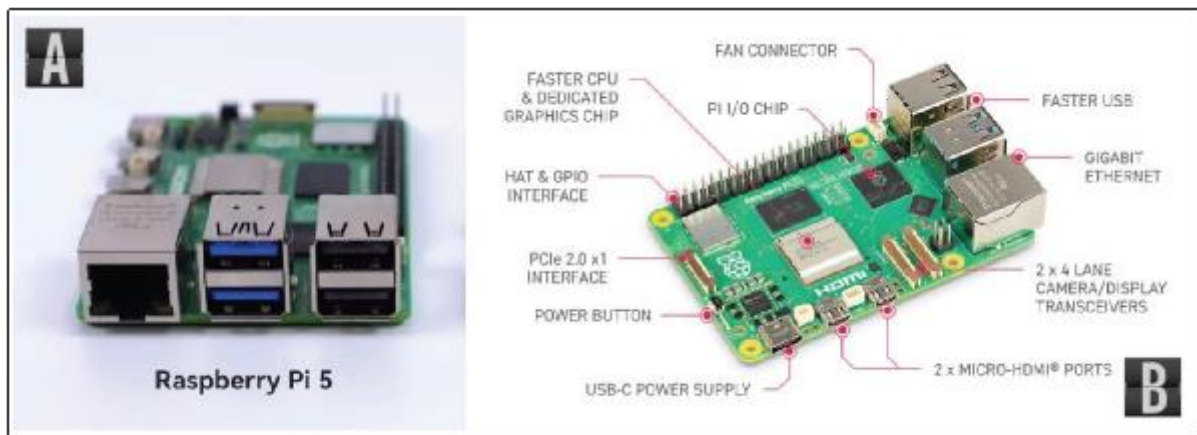
184 **Peripheral Compatibility and Integration**

185 With extensive support for various peripherals, the Pi 5 can easily connect with a wide range of devices. The
 186 device includes two USB 2.0 ports suitable for general peripheral connections with a maximum theoretical
 187 throughput of 480 Mbps (Fig. 4A). Additionally, it includes two USB 3.0 ports, essential for high-speed data
 188 transfers, supporting speeds up to 5 Gbps. These high-speed interfaces are vital for this application that demands
 189 rapid data communication with external devices. The board also offers an extensive array of GPIO (General

190 Purpose Input/Output) pins, enabling direct interfaces with various sensors and actuators (Fig. 5A). This
191 capability is fundamental for the customization of the system to easy integrate with specialized hardware
192 components, supporting the scalability and functional expansion of this IoT project.
193 In the system architecture developed in this study, one of the USB-3 ports is used to connect the voice-in user
194 input lane via a 360-degrees microphone, to capture omnidirectional voice commands.
195

196 **Ecosystem, Community Support and Linux-based OS**

197 In addition, Raspberry Pi 5 is integral to a dynamic ecosystem encompassing many HAT modules, bonnets
198 and peripherals, enhancing its adaptability across various applications. These HATs provide diverse
199 functionalities such as augmented I/O capabilities, sophisticated power management, sound-capturing devices,
200 environmental sensing, and precise motor control, enabling customization for many specialized tasks. The
201 ecosystem is further enriched by an array of compatible display and camera modules alongside extensive third-
202 party hardware options. The engineering community surrounding the Raspberry is highly active, offering
203 extensive documentation, tutorials, and a collaborative forum environment facilitated by the Raspberry Pi
204 Foundation. This global network of developers, enthusiasts, and educators contributes a wealth of open-source
205 resources, project guides, and software tools, making it an invaluable asset for both troubleshooting and
206 innovation in hardware and software development.
207



208 **Figure 4.** The Raspberry Pi 5 Connectivity (panels A and B)

209 Another key strength of Raspberry is its support for various operating systems, primarily Linux-based,
210 which offer stability, security, and extensive customization options. Among these, Raspberry Pi OS x64 Desktop,
211 based on Debian 12 "Bookworm," is used during this research (Fig. 5B). The advantages of using a Linux-based
212 OS include robust security features, extensive community support, and a vast repository of software packages. Pi
213 OS Desktop provides a user-friendly interface while leveraging the stability and security of Debian 12, making it
214 ideal for both development and deployment in IoT applications.
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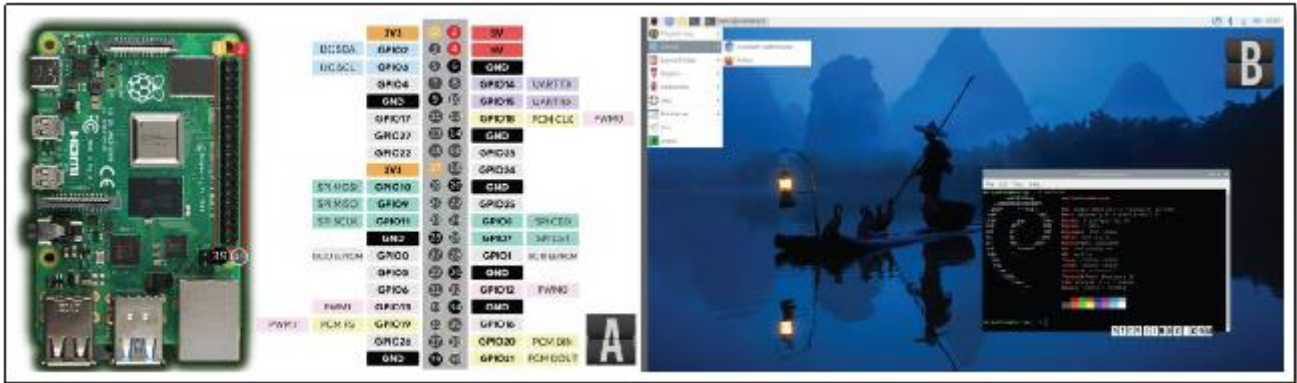


Figure 5. The Raspberry Pi 5 GPIOs (panel A) and the Raspberry Pi OS Bookwork (Debian 12) (panel B)

Furthermore, this project utilizes Python programming language, which is deeply integrated with the Linux-based Raspberry Pi OS, promoting efficient script execution and system management. Python's compatibility with the Debian system, combined with its extensive library ecosystem, supports the development of complex applications and simplifies the interaction with the hardware peripherals connected to the Pi device.

This robust combination of a versatile hardware platform, supportive community network, flexible operating system options, and integrated programming environments justifies that the Raspberry Pi 5 is a complete solution for this research and, overall, remains an important resource for educational and prototyping initiatives in technology and engineering fields.

2.2. The Adafruit Speaker Bonnet & 3W Stereo Speakers

The *Adafruit Speaker Bonnet* was selected as the primary audio output device for this development, specifically tasked with broadcasting the conversational AI's text-to-speech responses through its stereo speakers (Fig. 6, panels A & B). Its function is to enhance audio interactivity within IoT systems by delivering high-quality audio directly from the *Raspberry Pi*. This device is equipped with a built-in digital class-D amplifier, capable of driving up to 3 Watts per channel into 4-ohm stereo speakers. This setup ensures robust and clear audio output, which is paramount for delivering interactive commands and user feedback. Operating based on the *I2S* (Inter-IC Sound) digital sound interface; the bonnet guarantees high-fidelity audio by transmitting data via a digital communication link from the Raspberry Pi. This method provides cleaner and more reliable audio performance than traditional analogue outputs, which are often prone to noise and distortion. The bonnet design facilitates easy installation onto the Raspberry Pi via *GPIO* pins while providing access to all pins. This semi-HAT device optimizes the use of the *I2S* interface, reducing connectivity complexity and maximizing audio data throughput. Such integration ensures minimal latency, enabling instantaneous audio responses that are mandatory for interactive applications in IoT settings.

The project also incorporates stereo-enclosed speakers, chosen for their compatibility with the Adafruit Speaker Bonnet and suitability for the research interactive audio output requirements. These devices can deliver clear and high-fidelity sound, an essential feature for interactive user communication in various environments. The speakers are designed to handle 3 W of power with a 4 Ohm impedance. These characteristics ensure that the audio remains loud and clear in various settings, from noisy industrial locations to interactive public spaces, enhancing the system ability to provide uninterrupted audio feedback and instructions. Their connectivity with the Adafruit bonnet is a plug-and-play setup designed for reliable and quick installation.

The Adafruit Speaker Bonnet with the 3W stereo speakers are used in the project to make audible notifications and deliver voice feedback from AI-driven processes. The output setup provides efficient and compatible integration with the Raspberry Pi 5 hardware layout, making it fast to incorporate into software and rapid to deploy. This approach improves user engagement and system accessibility, making the IoT concept more intuitive and effective.

255



256 **Figure 6.** The Raspberry Pi 5 platform with the Adafruit Stereo Bonnet on top (panel A); the Adafruit Bonnet with
257 the 3W Speakers (panel B); all the Raspberry Pi 5 attachable components (panel C)

258 2.3. USB-3 Microphone 360

259

260 In this IoT project, a USB Conference Microphone is employed, featuring omnidirectional condenser
261 technology to capture high-quality audio from all directions (Fig. 7B). This omnidirectional pickup pattern is
262 invaluable in environments with multiple simultaneous interactions, ensuring comprehensive audio coverage.
263 The microphone is equipped with sophisticated noise reduction algorithms that enhance audio clarity by
264 filtering out background noise, a feature essential for robust voice recognition and processing in varied
265 environmental conditions. Additionally, the microphone offers plug-and-play compatibility with the Raspberry Pi
266 5 OS, significantly boosting its adaptability and enabling effortless integration and deployment without the need
267 for additional drivers. Furthermore, the microphone offers a plug-and-play functionality aligned with the
268 Raspberry Pi 5 OS (Debian 12). These aspects enhance its adaptability, facilitating swift integration and
269 deployment into the system without necessitating additional driver installations. This seamless integration was a
270 key factor in choosing the device, which proves to be important in maintaining the system operational reliability
271 and simplifying the software development around it.
272

273 2.4. Robotic Arm - UFactory xArm-7

274 In this research architecture, audio user commands are processed by generative AI and transmitted to the
275 UFactory xArm-7 Robotic Arm (Fig. 7, panel A). Functioning primarily as an edge device, the robot processes data
276 and executes commands locally, which is fundamental for low latency and real-time processing in automation
277 tasks. Its control box, equipped with processors and controllers for real-time decision-making, exemplifies its
278 edge capabilities.

279 The xArm-7 is a *7-Degrees-of-Freedom* (DoF) robotic arm designed for versatility in industrial automation,
280 research, and education. It features a modular design, high precision, and repeatability, making it ideal for pick-
281 and-place, assembly, testing, and human-robot interaction. With seven rotational joints, it offers extensive
282 motion range and flexibility, allowing complex task execution from various angles. The arm's 3.5 kg payload
283 capacity and 700 mm reach enable it to manipulate a wide array of objects and tools. Additionally, the arm
284 achieves repeatability accuracy of ± 0.1 mm, ensuring consistent performance in repetitive tasks, while its
285 maximum joint speed of $180^\circ/\text{s}$ supports efficient and rapid movements. Its modular nature facilitates
286 maintenance and customization, as users can interchange end effectors or integrate sensors and peripherals
287 tailored to specific needs.

288



Figure 7. The xArm 7 UFactory Robotic Arm (panel A) and the 360° USB Microphone (panel B)

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290
291

Power Management

292 A dedicated control box serves as the central hub for power management, communication, and control. It
293 connects to the robot via a specialized communication cable and offers ports for external devices connectivity
294 such as Ethernet, USB, and digital I/O. Safety features include an emergency stop button and a power switch. The
295 control box manages the xArm-7's power supply, ensuring stable and reliable operation. It converts AC input
296 (100-240V, 50/60Hz) to DC power, supplying 48V DC to servo motors and 12V DC to control electronics. It also
297 incorporates protection mechanisms like over-voltage, over-current, and short-circuit protection alongside
298 intelligent power management functions such as soft-start and soft-stop to prevent power surges and ensure
299 smooth operation. The system also monitors the temperature of the power supply and motors, initiating safety
300 shutdowns if temperatures exceed safe limits. Moreover, the xArm-7 is compatible with various control systems,
301 including xArm Studio software, ROS, and programming languages like Python and C++ through SDK packages.
302 In addition, the control box enhances communication between the arm and the control system, facilitating an
303 easy integration into existing setups and custom application development. Safety features like collision
304 detection, force limiting, and emergency stop functionality ensure safe operations in collaborative environments.

305 These aspects have facilitated the integration of the robot into the current study. The Raspberry Pi is
306 connected to the control box via an Ethernet cable and sends movement commands to the robotic arm using the
307 xArm-Python-SDK. These commands, as established earlier, are mapped to specific user voice inputs but are
308 ultimately decided by the generative AI model. This model has the authority to filter out commands and can also
309 choose not to execute them if the robot reaches its motion constraints.

2.5. OpenAI ChatGPT3.5-Turbo as Generative AI

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The project's strategic choice of using OpenAI's ChatGPT is primarily driven by the need for sophisticated natural language understanding and generation capabilities within an interactive robotic control system. The built system showcases how ChatGPT is integrated to process user commands, enabling specific robotic actions and general dialogue interactions.

Advanced Language Processing & Contextual Understanding

317 ChatGPT excels at understanding and generating natural language, making it an ideal choice for interpreting
318 complex user commands, programming logic, and queries. These features are crucial in applications where users
319

320 interact with robots through speech, as they enable the robotic system to comprehend instructions that vary in
321 linguistic structure, tonality, and complexity through the AI model.

322 The algorithm developed during this research configures ChatGPT to handle different contexts by setting up
323 specific modes such as `XARM_MODE`, `DIALOGUE_MODE`, and `DRONE_MODE`. This kind of flexibility allows
324 the AI to tailor its responses based on the operational context and recent discussions, enhancing the user
325 experience and the system's effectiveness. For example, in `XARM_MODE`, ChatGPT focuses on generating clear
326 and direct commands for robotic arm operations without accepting unfamiliar directives or other deviations,
327 whereas in `DIALOGUE_MODE`, it shifts to engaging in general discussions, providing information as requested,
328 based on the vast knowledge of the model used.

329

330 **Real-time Interaction**

331 Robotic systems, particularly those involved in assembly or assistance that need to perform operations
332 around or in collaboration with humans, must operate in fast to be effective. Integrating AI models that can
333 process natural language quickly allows these systems to understand and execute commands without significant
334 delays. This immediacy ensures that the robots can respond to changes in their environment or to instructions
335 quicker, which is vital when working alongside humans who operate at a natural, often unpredictable pace. This
336 type of integration can help AI-assisted robotic systems understand contexts and instructions better than they
337 currently do, in a more human-like manner. Such features can allow for more intuitive interactions, reducing the
338 learning curve and improving the efficiency of joint operations.

339 This represents an evolutionary use case of advanced human-robot bonding, offering the perspective of
340 better robotic systems compliance, resulting in robots being more aligned with human needs and behaviors,
341 thereby making their integration into Human-Centric environments smoother and more natural.

342

343 **Development Integration, Scalability & Customization**

344 OpenAI provides a well-documented API that facilitates easy integration of ChatGPT into existing systems.
345 The built system demonstrates how the client model is defined, initialized and used to generate responses to
346 user inputs. This ease of integration reduces development time and complexity, allowing developers to focus on
347 other critical aspects of the system. Furthermore, the capabilities can be extended or customized through
348 different settings and parameters provided by the OpenAI API. This allows the algorithm to be adapted for future
349 enhancements or applications, ensuring the system remains versatile and scalable.

350 Overall, the choice to use OpenAI ChatGPT in this project is justified by its superior language processing
351 abilities, extensive customization options, and ease of integration with the hardware and the other APIs, all
352 essential for creating an interactive and responsive robotic control system that strives for intuitiveness and
353 efficiency.

354 **2.6. Google Text-to-Speech Engine**

355 The choice of Google Text-to-Speech (TTS) Engine for this project is decided by its proven reliability and
356 extensive language support, making it an ideal solution for interactive systems that require verbal output.
357 Google's TTS technology is known for its high-quality voice synthesizer, closely mimicking human speech
358 patterns, providing a natural and engaging user experience. This factor is essential for this type of application,
359 where user interaction represents a central role, as it enhances the system's accessibility and usability across
360 diverse user groups. Furthermore, Google TTS supports multiple languages and dialects, allowing for scalability
361 in global applications. The ease of integration provided by the *gtts* Python library, which interfaces seamlessly
362 with Google's TTS API, significantly reduces development complexity and accelerates deployment timelines.

363 In the system architecture, the TTS is used as a precursor of the output, processing the AI-generated text
364 responses via an API. This results in a synthesized voice mp3 audio file that is subsequently played through the
365 speakers using the `mpg321` command-line audio player.

366 **2.7. Google Voice Recognition Engine**

367 Sufficient Implementing Google's Voice Recognition Engine through the *SpeechRecognition* library offers
368 several critical benefits for this research. Google's engine is renowned for its accuracy and robust performance in

369 diverse acoustic environments, which are a priority for reliable speech-to-text conversion in real-time
370 applications. The engine's ability to recognize and process various languages and accents enhances its versatility,
371 making it suitable for multi-lingual environments, which are future improvement objectives for this current
372 project.

373 Additionally, Google's advanced AI and natural language processing algorithms effectively handle colloquial
374 phrases and complex sentence structures, ensuring that user commands are interpreted correctly and efficiently.
375 The integration with *Python's SpeechRecognition* library also provides a straightforward implementation path
376 that complements the project's need for fast development cycles and robust performance.

377 The voice recognition API engine facilitates data exchanges through the system input channel. The USB-
378 connected omnidirectional microphone captures any audio in 3-second recording batches in .wav format. These
379 batches are sent to the *Google SpeechRecognition API*, which returns text transcripts that are further processed
380 and sent to the OpenAI API for AI responses. These technologies support the core functionality of the system and
381 ensure that it remains adaptable and forward-compatible with any future upgrades, emerging needs and
382 technologies.

383 3. Results & Discussion

384 The IoT-AI system developed in this research has been evaluated for its operational efficiency and reliability
385 in facilitating human-robot interactions. Following the above methodology, an operator interact with a USB
386 microphone providing audio input which are processed by the Raspberry Pi board. The board is connected to a
387 stereo speaker for mutual conversation and to the Text-to-speech Google API. An ethernet cable provides
388 connection to the robotic arm (Figure 1). Although this development is not designed to generate real-time robot
389 control commands, the latency is sufficiently low to ensure reliable and safe human-robot interaction. The voice
390 input segment of the pipeline, comprising the microphone and the voice-to-text API, effectively records user
391 commands. However, it sometimes requires users to repeat commands due to hardware limitations, variations in
392 voice tonality, accents, or other phonetic challenges. These challenges may also arise if users are uncertain when
393 to start or stop speaking. To address this, integrating a visual signaling system, such as an on/off LED, could help
394 synchronize user interactions with the algorithm more effectively.

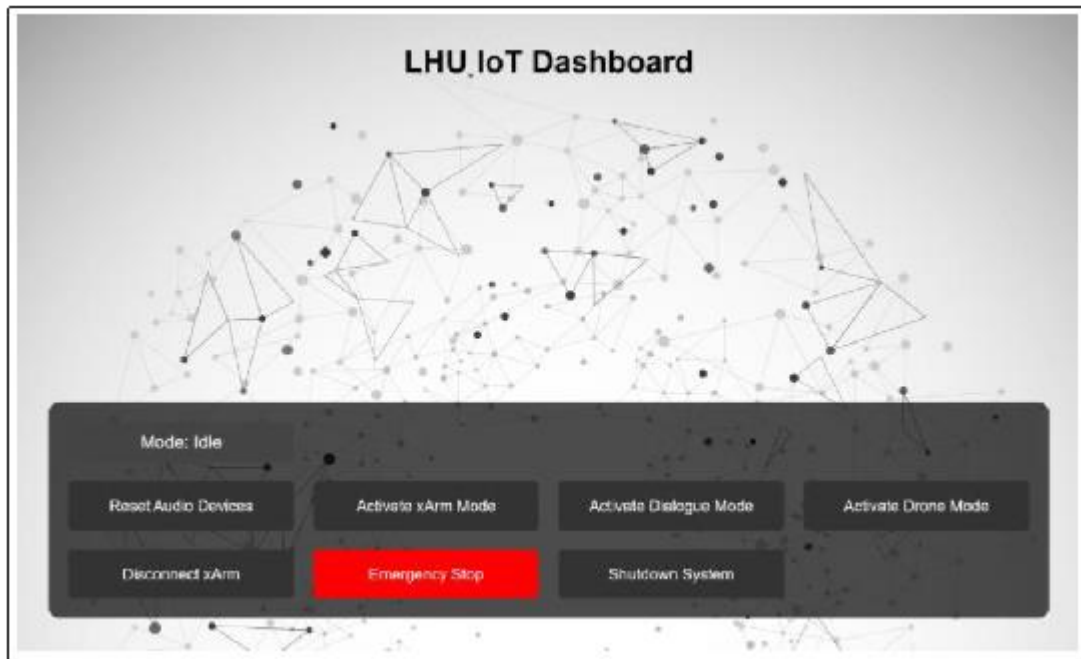
395 Furthermore, the AI has demonstrated its capability to accurately classify responses and generate
396 appropriate commands for the robotic arm. The xArm executes these commands sequentially, ensuring that each
397 movement is carried out precisely and safely. This methodical execution confirmed the robot ability to interact
398 closely with human operators, assisting without compromising safety. Such features make the robot particularly
399 useful in environments where direct human collaboration is necessary, enhancing both the efficiency and safety
400 of operations.

401 The source algorithm of the developed system can be found on [GitHub](#). An overview of the main set-up is
402 shown in Figure 8.

```
1 import subprocess
2 import speech_recognition as sr
3 import openai
4 import os
5 from gtts import gTTS
6 import time
7 import signal
8 import sys
9 from xarm.wrapper import XArmAPI
10 from pydub import AudioSegment
11 import re
```

403 **Figure 8.** Initialization of the system where speech-recognition and x-arm robot device are set to mutually
404 interact – details of the overall code are reported at the following link on [GitHub](#)

405 This access allows further insight into the system capabilities and invites collaboration and feedback to
 406 refine the system further.
 407



408 **Figure 9.** Control Dashboard GUI running on Pi via Flask Server

409 3.1. System Functionality Overview

410 This IoT-AI-based human-robot interaction and control system integrates three primary computational
 411 structures, streamlining complex tasks through a configuration of hardware, software and data flow interactions:

412 1. Main Control Structure - Raspberry Pi 5 Core Unit

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 414
 415 The Raspberry Pi 5 acts as the central control hub. It leverages its hardware capabilities to interface with
 416 peripheral devices critical for input and output processes necessary for interaction. There is also a control
 417 dashboard available to user on the local network, which contains the essential commands of the system (Fig. 9).
 418 These peripherals and connection capabilities are:

- 419
- 420 • **Microphone:** Captures user voice inputs, converting spoken commands into digital data for processing
 421 by the Google Voice Recognition API.
- 422
- 423 • **Stereo Speakers:** Outputs AI-generated responses through Google Text-to-Speech API, facilitating real-
 424 time communication between the user and the system.
- 425
- 426 • **Internet Connectivity:** A stable Wi-Fi connection is essential for accessing cloud-based API services
 427 which handle various stages of data processing and response generation (input speech-to-text, text-to-
 428 text AI-response, output text-to-voice).
- 429
- 430 • **Process Flow:**
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- 432 A. **Speech-to-Text:** Utilises the Google Voice-Recognition API through the SpeechRecognition library
 433 to transcribe spoken words captured by microphone into text.
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- B. **AI Response Generation:** The OpenAI API processes the transcribed text, utilising the ChatGPT-3.5-Turbo model. This model operates in three distinct modes:
 1. **Xarm Mode:** Generates commands for controlling the robotic arm based on user input.
 2. **Dialogue Mode:** Engages in general conversation, providing information based on user prompts input.
 3. **Drone Mode:** Still under development – Generates commands for drone control, enhancing the system's applicability to various robotic platforms.
- C. **Text-to-Speech:** The Google Text-to-Speech API converts the AI's textual responses back into audible speech, ensuring the communication loop is maintained and user is always aware of the robotic arm incoming motions.
- D. **Control Dashboard:** Although still under development, there is a control dashboard accessible to users on the local network, incorporating the essential commands of the system. This dashboard utilizes the Flask library to facilitate straightforward management and operation directly from a web browser (Fig. 8).

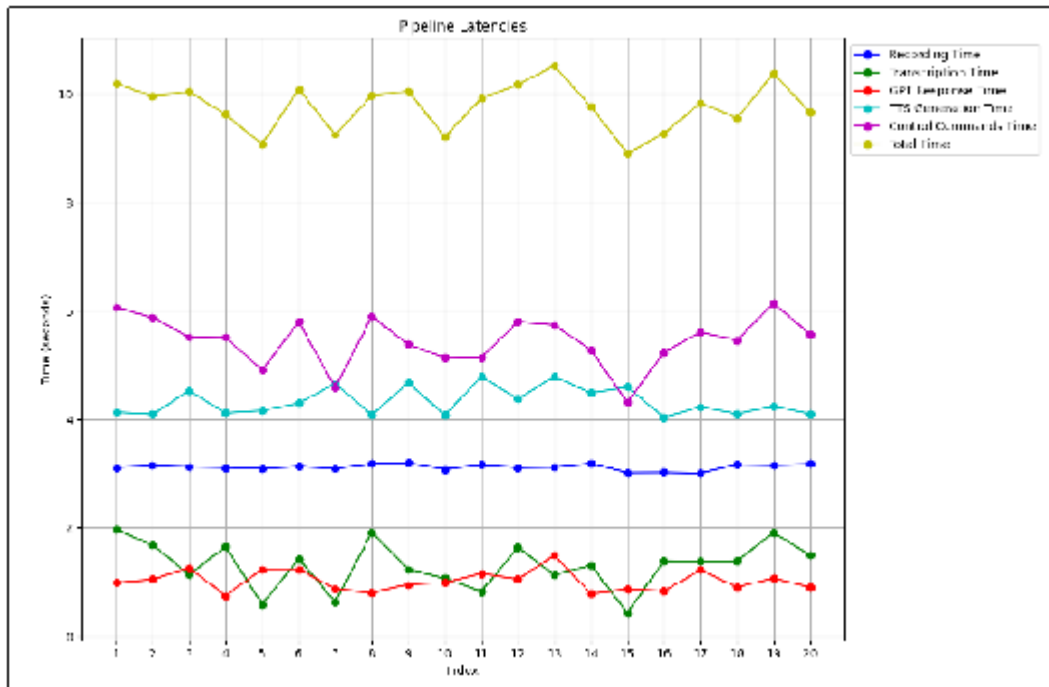


Figure 10. Latencies through the system pipeline

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2. Admin System

- This overview system focuses on development, updates, and system monitoring, providing necessary oversight and administrative capabilities.
- **Network Security:** Utilizes SSH (Secure Shell) for secure communication between the admin computer and the Raspberry Pi 5, safeguarding system integrity through encrypted connections that require authentication.

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3. Edge Device - Peripheral Control Device: xArm-7 Robotic Arm

- **Connection:** The xArm-7 is linked to the Raspberry Pi via Ethernet, allowing for robust and reliable command and control signals.
- **Functionality:** Serves as a direct-action endpoint within the system, executing physical tasks based on processed commands from the Raspberry Pi generated through the interaction pipeline.

This architecture supports the primary goal of creating a responsive and interactive environment but also ensures that the system remains adaptable and scalable. By integrating advanced AI with practical robotic execution and thorough administrative oversight, the system architecture shows that it is able to handle complex interactions and perform a wide range of tasks efficiently and securely.

An example of the resulting set of possible commands that the conversational interaction allows between the operator and the robotic arm are: "What's your name?", "Zora, do you hear me?" and so on; when interacting with the robot the user can set commands such as "Zora, engage arm" and then can move the arm with commands such as "move right 20" (i.e. move the robotic arm to the right of 20 cm), "move arm left 40", "move down 10"; following the reception of the command Zora will verbally confirm execution and re-iterate the command reporting explicitly the unit of measurement of the displacement, such as "moving the x-arm right by 20 cm".

3.2. Latencies Analysis

The system has been tested in laboratory condition and a set of preliminary trials have been performed where the end-user delivered a set of vocal commands to the robotic arm. In xArm mode, the average latency for a robot command to reach the robotic arm is approximately 5.5 seconds. This latency consists of a 3-second audio recording of the user input, followed by approximately 1.5 seconds for the speech-to-text API to return a transcription and about 1 second for generating a response via the AI-GPT model. Figure 10 shows the main pipelines latencies where the *Recording Time*, the *Transcription Time*, *GPT Response* and *TTS Generation Times* and well as the *Control Commands* and *Overall Time* are reported. On average the system has to comply with 0-1 s of *Recording and Transition Times* followed by a 2-6 s of *Recording*, *TTs* and *Control Commands Times*. Additionally, during server peak hours, the Google APIs (speech-to-text and text-to-speech) may experience significant delays, potentially increasing response times by up to 5 seconds each TTS and STT. Possible solutions to protect the latencies of the system and even improve it could be:

Upgrading to Google paid services: Opting for the paid versions of Google's services could offer stable API responses, with even faster and more consistent processing times.

Exploring alternative technologies: testing other speech recognition and processing services could uncover more efficient options. Technologies such as IBM Watson, Microsoft Azure Speech, and Amazon Transcribe might offer enhanced features or superior performance. Additionally, offline models like eSpeak, Mycroft Mimic, or the Festival Speech Synthesis System could provide enhanced privacy, reduced latency, and improved performance.

Optimization of the Recording Process: The current recording process is not fully optimized and improving it could significantly reduce the average 3-second recording time. Additionally, executing the recording process in a separate thread, upgrading to superior hardware, or utilizing more advanced sound-capturing libraries could refine these latency results.

3.3. Future Objectives

Here are some additional future improvements for enhancing human-machine and human-robot interaction of the system:

- *Verbal cues for recording:* Integrate start and end recording verbal cues into dialogue mode to improve user interaction.

- 515
- 516 • *Advanced robotic control*: Expand the robotic control mode to record each motion, allowing for replication
- 517 of sequences, including in reverse, and the ability to combine these sequences to create complex motion patterns.
- 518 This feature can give users greater freedom to define and automate robot actions.
- 519
- 520 • *3D vision integration*: Test the benefits of integrating a 3D vision system with the conversational AI feature
- 521 to enhance situational awareness and interaction capabilities.
- 522
- 523 • *Expansion to other devices*: Expand the IoT-AI control system to include other robotic devices, enlarging its
- 524 scope and applications.

525 4. Conclusions

526 This research successfully demonstrates the feasibility and potential of integrating conversational AI,

527 specifically OpenAI ChatGPT, with IoT devices to create a more intuitive and efficient human-robot interaction

528 system which further highlight the importance of Human-Centric design nowadays [17-20]. The framework

529 effectively translates user voice commands into robotic actions by incorporating the powerful Raspberry Pi 5 as

530 the central control unit and leveraging Google speech recognition and text-to-speech engines. The integration of

531 the xArm-7 robotic arm exemplifies the development capabilities, showcasing how complex robotic tasks can be

532 executed through natural language commands. Given the stage of the prototype we have design and

533 implemented a set of preliminary tests in laboratory condition: nevertheless, a proper validation of the system

534 and further extension of these tests with a comparison vs other benchmarks would be needed. In this context it

535 would also be beneficial to validate the robustness of the system under different conditions, namely in the daily

536 (and industrial) life context where the voice commands may interact and mix with other disturbances and

537 noises. There is also room for testing the efficiency of the system under different languages, tones and accents,

538 since a robust response and clear understanding vs different users is going to be compulsory for the success of

539 such an approach at industrial level and in whatever context the system could be used (see for example vocal

540 commands when using a robot for surgical procedure).

541 The modular design architecture ensures flexibility and scalability, making it adaptable for control over a

542 wide range of IoT or edge devices such as drones, smart home appliances, or various types of assembly and

543 assistive robots. Such adaptability highlights the potential to enhance human-robot interaction across numerous

544 domains, emphasizing safety, responsiveness and reliability in operations, which are critical when robots

545 perform around or in collaboration with humans. Rapid natural language processing by AI models allows these

546 robots to comprehend and act on instructions without delay, which is essential for maintaining pace with the

547 unpredictable rhythm of human activities.

548 Despite its promising performance, the system does face challenges, such as latency during peak server

549 times and occasional inaccuracies in voice recognition. Future research will address these issues by exploring

550 alternative speech recognition technologies, enhancing the recording process, and integrating other feedback

551 mechanisms to improve system robustness and reliability. In this context it is also of interest considering other

552 technologies which could be integrated and combined with the conversational interactions, such as, for example,

553 human movement detection and use of wearable sensors embedded on the end-user body which could further

554 enhance real-time (and intuitive) interaction between the operator and the machine (i.e. the robot in the current

555 scenario) [19-23]. In this context, one of the important characteristics of the proposed system is related to its

556 latency, as we reported along the paper. However, there are other aspects which inherently involve such latency

557 and related to safety, especially in applications where the robotic arm (or another device activated by voice) is

558 interacting with the human body and the actions of the voice operator could affect and damage the interacting

559 body.

560 In conclusion, this research intends to contribute to the field of human-robot interaction, providing a robust

561 framework for integrating IoT devices and conversational AI with robotic systems. It promotes more natural and

562 intuitive interactions, reducing the learning curve and improving the efficiency of collaborative operations. This

563 development describes an evolutionary use case of advanced human-robot bonding, offering the perspective of

564 better robotic systems compliance, resulting in robots being more aligned with human needs and behaviors,
565 thereby making their integration Human-Centric, smoother and more natural.

566 **Supplementary Materials**

567 The source algorithm of the developed system can be found at the following link on [GitHub](#).

568 **Author Contributions**

569 Conceptualization, D.M.; methodology, D.M.; software, D.M.; validation, D.M.; writing—original draft
570 preparation, D.M.; writing—review and editing, E.S.; supervision, H.A.. All authors have read and agreed to the
571 published version of the manuscript.

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576 **Informed Consent Statement**

577 Not applicable.

578 **Data Availability Statement**

579 No applicable.

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583 Computer Science and the Environment, Liverpool Hope University.

584 **Conflicts of Interest**

585 The authors declare no conflict of interest.

586 **Appendix 1 – Instructions to Boot Pi from SSD**

587 Below are the main steps and instructions in order to setup the Raspberry Pi device and migrate the booting
588 of the board from the SD card into the local SSD.

Commands / Tools	Instructions	Comments
<code>sudo apt update</code> <code>sudo apt update</code>	Run these commands to update package lists from the repositories and upgrade the installed packages.	Ensures you have the latest information about available package update & Updates all installed packages to their latest versions
<code>sudo mkfs.ext4/dev/mvme1</code>	Format the SSD in ext4 filesystem (compatible with Linux systems)	Replace /dev/mvme1 with the appropriate device identifier for your SSD (to find out the identifier you can run <code>lsblk</code>)
SD Card Copier tool	Select the SD card as the source device. Select the SSD as the target device.	Use the SD Card Copier tool from Pi OS to copy the SD boot to SSD. In the Raspberry Pi OS menu, this is usually in the Accessories tab.
<code>sudo nano</code> <code>/boot/firmware/config.txt</code>	Edit Boot Configuration by adding: <code>dtparam=nvme</code> <code>dtparam=pciex1_gen=2</code>	If your SSD supports it, you can add <code>dtparam=pciex1_gen=3</code> for faster speed. Raspberry Pi 5 supports it.
<code>lsblk -o NAME,UUID</code>	Find the <i>NVME UUID</i> and take note of it.	the UUID of the NVME partition (usually something like <code>nvme0n1p2</code>)
<code>sudo nano /boot/cmdline.txt</code>	Replace the current <code>root=number</code> parameter with the UUID of the NVME partition	
<code>sudo nano /etc/default/rpi-eeeprom-bootloader</code>	Add the below instructions to set SSD PCIE as primary boot device: <code>[all]</code> <code>BOOT ORDER=0xf41</code> <code>PCIE PROBE=1</code>	Ensure the correct bootloader configuration is set
<code>sudo apt install --reinstall rpi-eeeprom</code>	Reinstall the package <code>rpi-eeeprom</code>	
<code>sudo rpi-eeeprom-update -d -a</code>	Update package <code>rpi-eeeprom</code> and apply the update immediately	
<code>sudo rpi-eeeprom-update</code>	Check for available updates to <code>rpi-eeeprom</code> .	
<code>vgencmd bootloader_config</code>	Check if the <code>f41</code> is in place	
<code>sudo reboot now</code>	Reboot the system to apply the changes	Usually, if all settings are done in the right order, this boot time will be considerably very fast compared to SD booting.
<code>mount grep ' / '</code>	Check if you booted from SSD	

589 **Table 1.** Booting of the board from the SD card into the local SSD

590 Appendix 2 – Assembly and integration of the parts

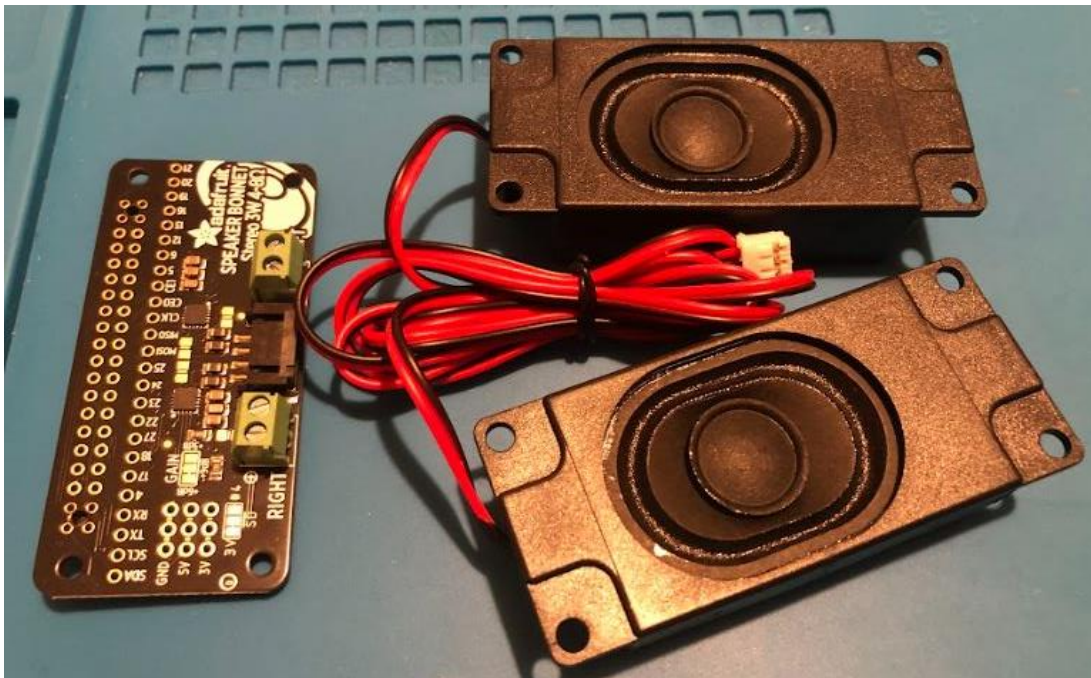
591 Below are reported some details of the main parts of the system (see also Fig. 6)



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593
594

Figure 11. The main parts of the system, including the power supply, speakers and processing unit (namely the Raspberry PI)



595



596

597 **Figure 12.** The Adafruit Speaker Bonnet & 3W Stereo Speakers (top panel) and their assembly (bottom panel)

598 References

- 599 1. Radford, A., Narasimhan, K., Salimans, T. & Sutskever, I., 2018. Improving Language Understanding by Generative Pre-
 600 Training. [Online] Available at: [https://s3-us-west-2.amazonaws.com/openai-assets/research-covers/language-](https://s3-us-west-2.amazonaws.com/openai-assets/research-covers/language-unsupervised/language_understanding_paper.pdf)
 601 unsupervised/language_understanding_paper.pdf [Accessed 2024].
- 602 2. Brown, T. et al., 2020. Language Models are Few-Shot Learners. [Online] Available at:
 603 <https://arxiv.org/pdf/2005.14165> [Accessed 2024].
- 604 3. Gubbi, J., Buyya, R., Marusic, S. & Palaniswami, M., 2013. Internet of Things (IoT): A vision, architectural elements, and
 605 future directions. [Online] Available at: <https://doi.org/10.1016/j.future.2013.01.010> [Accessed 2024].
- 606 4. Al-Fuqaha, A., Guizani, M., Mohammadi, M. & al, e., 2015. Internet of Things: A Survey on Enabling Technologies,
 607 Protocols, and Applications. [Online] Available at: <https://doi.org/10.1109/COMST.2015.2444095> [Accessed 2024].
- 608 5. Piyare, R. & Tazil, M., 2011. Bluetooth Based Smart Automation System Using Android. [Online] Available at:
 609 <http://dx.doi.org/10.1109/ISCE.2011.5973811> [Accessed 2024].
- 610 6. Becerik-Gerber, B. et al., 2022. The field of human building interaction for convergent research and innovation for
 611 intelligent built environments. [Online] Available at: <https://www.nature.com/articles/s41598-022-25047-y> [Accessed
 612 2024].
- 613 7. Masreliez, L., 2021. THE FRAGMENTED SMART HOME: A comprehensive analysis of available interoperable solutions to
 614 connect wireless smart home communications. [Online] Available at: [https://www.diva-](https://www.diva-portal.org/smash/get/diva2:1584387/FULLTEXT01.pdf)
 615 portal.org/smash/get/diva2:1584387/FULLTEXT01.pdf [Accessed 2024].
- 616 8. Capgemini, R.-I., 2019. How organizations and consumers are embracing voice and chat assistants. [Online] Available at:
 617 [https://www.capgemini.com/wp-content/uploads/2019/09/Report-%E2%80%93-Conversational-Interfaces_Web-](https://www.capgemini.com/wp-content/uploads/2019/09/Report-%E2%80%93-Conversational-Interfaces_Web-Final.pdf)
 618 Final.pdf [Accessed 2024].
- 619 9. RaspberryPi, F., 2024. 2024. [Online] Available at: <https://forums.raspberrypi.com/viewforum.php?f=15>
- 620 10. OpenAI, 2023. GPT-3.5 Turbo fine-tuning and API updates. [Online] Available at: [https://openai.com/index/gpt-3-5-](https://openai.com/index/gpt-3-5-turbo-fine-tuning-and-api-updates/)
 621 turbo-fine-tuning-and-api-updates/ [Accessed 2024].

- 622 11. Liu, D. & Cao, J., 2022. Determinants of Collaborative Robots Innovation Adoption in Small and Medium-Sized
623 Enterprises: An Empirical Study in China. [Online] Available at: <http://dx.doi.org/10.3390/app121910085> [Accessed
624 2024].
- 625 12. Guo, X., Shen, Z., Zhang, Y. & Wu, T., 2019. Review on the Application of Artificial Intelligence in Smart Homes. [Online]
626 Available at: <https://doi.org/10.3390/smartcities2030025> [Accessed 2024].
- 627 13. Thakare, V., Khire, G. & Kumbhar, M., 2022. Artificial Intelligence (AI) and Internet of Things (IoT) in Healthcare:
628 Opportunities and Challenges. [Online] Available at: <https://iopscience.iop.org/article/10.1149/10701.7941ecst/pdf>
629 [Accessed 2024].
- 630 14. Roller, S. et al., 2020. Recipes for building an open-domain chatbot. [Online] Available at:
631 <https://arxiv.org/abs/2004.13637v2> [Accessed 2024].
- 632 15. EL Secco, Y Noh, Human-like Robotic Hands for Biomedical Applications and Beyond, *Frontiers in Robotics & AI*,
633 *Biomedical Robotics*
- 634 16. D Bell, EL Secco, Design of a 3D-Printed Accessible and Affordable Robotic Arm and a User-Friendly Graphical User
635 Interface, *Congress on Intelligent Systems*, 195-205
- 636 17. M Innes, EL Secco, An Understanding of How Technology Can Assist in the Epidemic of Medicine Nonadherence with the
637 Development of a Medicine Dispenser, *European Journal of Applied Sciences* 11 (3), 522-550
- 638 18. J Hutton, EL Secco, Development of an interface for real time control of a dexterous robotic hand, using MYO muscle
639 sensor, *Acta Scientific Computer Sciences*, 2023
- 640 19. Bilawal Latif, N Buckley, EL Secco, [Hand Gesture & Human-Drone Interaction](#), *Intelligent Systems Conference*
641 *(IntelliSys)*, 3, 299-308, 2022, DOI: 10.1007/978-3-031-16075-2
- 642 20. D Manolescu, B Mutinda, EL Secco, Human-robot interaction via wearable device - A wireless glove system for remote
643 control of 7-DoF robotic arm, *Academia Engineering*, 2024, *in press*
- 644 21. M Mowlai, M Mahdavamanshadi, I Sayyadzadeh [Adapting Transformer-Based Multi-Style Networks for Human Pose](#)
645 [Prediction with a Custom Data Pipeline in Industrial Human-Robot Collaboration](#), 2024 *Systems and Information*
646 *Engineering Design Symposium (SIEDS)*, 274-279
- 647 22. EL Secco, DD McHugh, N Buckley, [A CNN-based Computer Vision Interface for Prosthetics' application](#), *EAI MobiHealth*
648 *2021 - 10th EAI International Conference on Wireless Mobile Communication and Healthcare*, 41-59, 2022
- 649 23. TS Chu, AY Chua, EL Secco, [A Study on Neuro Fuzzy Algorithm Implementation on BCI-UAV Control Systems](#), *ASEAN*
650 [Engineering Journal \(AEJ\)](#), 12, 4, 75-81, 2022



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