

Dynamic Spoon Positioning and Parkinson's Disease Stage Prediction

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I. PROBLEM STATEMENT

Parkinson's disease is a neurodegenerative disorder that significantly impacts motor function, causing symptoms such as tremors, rigidity, and bradykinesia (slowed movement). These motor impairments can severely hinder individuals' ability to perform daily activities, including tasks as basic as eating with a spoon. The tremors associated with Parkinson's disease can make it challenging for individuals to control the movement of their hands and arms, leading to difficulties in gripping utensils and bringing food to their mouths. Consequently, affected individuals may struggle to maintain independence and quality of life, as simple actions like feeding oneself become arduous and frustrating.

This issue underscores the profound impact of Parkinson's disease on individuals' autonomy and highlights the importance of developing effective interventions to alleviate motor symptoms and enhance functional abilities. Occupational therapy, medication management, and assistive devices like weighted utensils or adaptive dining equipment can offer some relief and support individuals in managing daily tasks. However, ongoing research and efforts to improve treatment options are essential to address the complex challenges faced by individuals living with Parkinson's disease and enhance their overall well-being.

II. ALTERNATIVE APPROACHES

A. Possible mechanisms

1) *Considering only two-axis rotation (Assume tremors in x-axis are negligible):* The self-stabilizing spoon is designed with two degrees of freedom (2-DoF) to suppress vibrations occurring in the vertical (z-axis) and horizontal (y-axis) axes. The design focuses on mitigating the highest oscillating tremors observed during hand tremor patients' activities, particularly in the y and z axes. As a result, oscillations in the x-axis, such as the vibration of the elbow and wrist inward circular rotation, are deemed negligible for this application.

The spoon's movement is controlled by two motors: one for providing movement in the z-axis and another connected to the same motor shaft to provide movement in the y-axis. The connection between these motors and the spoon enables coordinated movement, ensuring precise positioning control during the eating process. This design approach effectively suppresses vibrations while the hand holding the spoon moves from the plate to the mouth during eating.

a. Using two servo motors

The self-stabilizing spoon aims to enhance control and stability during use using two servo motors, one for each degree of freedom (DoF). Due to the servo response limitations, it's challenging to mitigate high-frequency tremors using this method. This is because servos have inherent response times and mechanical constraints that may limit their ability to react quickly enough to suppress rapid oscillations or tremors effectively.

b. Using two micro DC motors

Using two micro DC motors for each degree of freedom in the self-stabilizing spoon can be more effective in cost, flexible, and simpler compared to using servos. It allows for customization, precise control, and cost savings while keeping stability and functionality. [1]

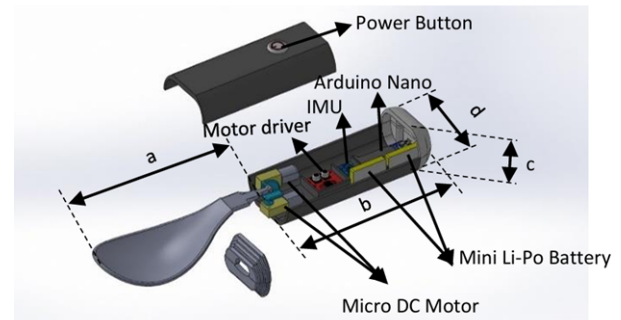


Fig. 1. Method of using two micro DC motors

2) *Considering all three axis rotation* : Taking into consideration rotation along all three axes, the self-stabilizing spoon counteracts movements across all dimensions, ensuring stability and precision during use. By incorporating control mechanisms that address rotations in the x, y, and z axes, the spoon can effectively compensate for tremors and other involuntary movements experienced by users

a. Use three servo motors each corresponding 3 axis
Using three servo motors, each corresponding to one axis, in the self-stabilizing spoon design results in mechanical instability due to the concatenated setup of the servos. This configuration introduces mechanical complexities and challenges in maintaining stability, potentially leading to sub-optimal performance and reliability

b. Use gear motors
Using gear motors with a suitable gear system can provide smoother mitigation of hand tremors and stabilize the self-stabilizing spoon more conveniently compared to using servos. Gear motors offer higher torque and smoother motion, making them well-suited for applications requiring precise control and stability.

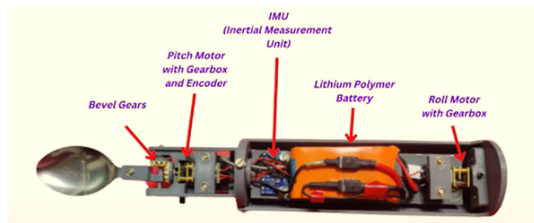


Fig. 2. Method of using gear motor

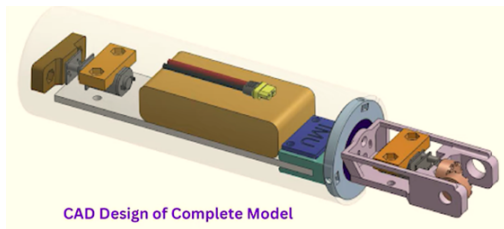


Fig. 3. CAD design of complete model

c. Use an intelligent servo system and tri-axis linkage System

Incorporating high-precision motors and a tri-axis linkage system combined with intelligent servos provides an optimal solution for stabilizing the spoon in all three axes. The high-precision motors offer accurate control and smooth operation, ensuring precise positioning of the spoon. The tri-axis linkage system enhances stability by distributing forces evenly across all axes, minimizing vibrations and tremors.

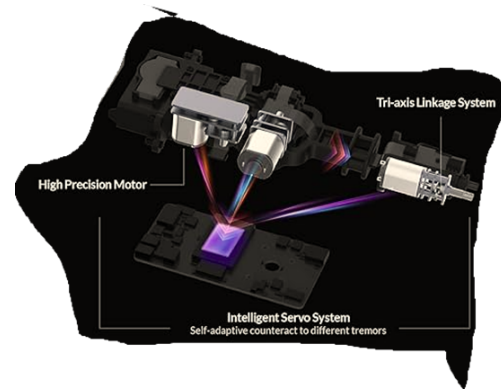


Fig. 4. Method of using intelligent servo system

3) *Mass balancing and spring system* : The conceptual design of the spoon cooperates with the use of spring stiffness to control spoon vibrations. The spring is positioned to support the connection of the spoon and can extend with the string on both sides of the spoon, as depicted in Figure 5. This setup allows for effective damping of vibrations by leveraging the properties of the spring. [2]

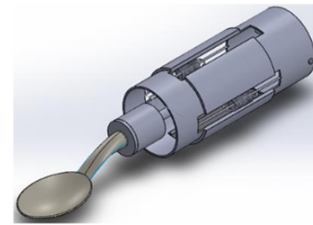


Fig. 5. Method of using mass balancing and spring system

B. Possible Control Techniques

1) *PID Control*: PID (Proportional-Integral-Derivative) control is a widely used feedback control method that adjusts a system's output based on the error between the desired setpoint and the actual output. It combines proportional, integral, and derivative terms to achieve stability, accuracy, and responsiveness.

2) *Advanced PID*: Advanced PID techniques enhance traditional PID control by incorporating features such as anti-windup mechanisms, adaptive tuning, feedforward control, and filtering. These enhancements lead to improved performance, stability, and robustness in challenging control scenarios.

In the context of a self-stabilizing spoon for individuals with hand tremors, these advanced techniques are particularly valuable. Patients may exhibit varying degrees and types of tremors, which can change over time or in different situations. Constant PID values may not be suitable for all scenarios due to these variations.

Anti-windup mechanisms help prevent integrator windup, which can occur when the control system reaches its limits. This is especially important in applications like the self-stabilizing spoon, where the system may encounter physical constraints or saturation.

Adaptive tuning allows the PID parameters to be adjusted dynamically based on the observed system response. This enables the control system to adapt to changes in the patient's tremors or environmental conditions, ensuring optimal performance over time.

Feed-forward control can be used to compensate for known disturbances or inputs, such as the weight of food on the spoon or sudden movements by the user. By predicting and preemptively counteracting these disturbances, feedforward control can improve the stability and responsiveness of the spoon.

Filtering techniques can help reduce noise and vibration in the sensor signals, improving the accuracy of the feedback used by the control system. This is essential for maintaining stability and precision in the presence of erratic or unpredictable tremors.

3) *Model Predictive Control (MPC)*: Model Predictive Control (MPC) is an advanced control strategy that utilizes a dynamic model of the system to predict future behavior and optimize control inputs over a finite time horizon. MPC considers future system states and constraints to proactively adjust control actions, making it suitable for complex, nonlinear systems.

In the context of a self-stabilizing spoon for individuals with hand tremors, MPC offers several advantages. It allows the control system to anticipate and react to future movements, enabling smoother and more precise adjustments to counteract tremors. By considering constraints such as motor limits and stability requirements, MPC can generate control signals that optimize performance while ensuring safety and stability.

Additionally, MPC's ability to incorporate time-varying models and adapt to changing conditions makes it well-suited for applications where tremor characteristics may vary over time or in different situations. This adaptive nature allows the self-stabilizing spoon to maintain optimal performance despite variations in tremor intensity or frequency.

4) *Data-Driven Control*: Data-driven control methods utilize machine learning techniques and data-driven models to develop control strategies directly from data, without explicit mathematical models. These approaches leverage input-output data pairs to infer control actions, making them suitable for systems with unknown dynamics or complex behaviours.

In the context of a self-stabilizing spoon for individuals with hand tremors, Data-Driven Control can offer several benefits. It allows the control system to learn from real-world data collected during usage, enabling it to adapt and optimize control strategies based on observed tremor patterns and user interactions.

By analyzing data from sensors embedded in the spoon, such as accelerometers or gyroscopes, Data-Driven Control algorithms can identify patterns and correlations between tremors and system responses. This information can then be used to develop control policies that effectively mitigate tremors and improve stability during use.

Furthermore, Data-Driven Control methods can continuously update and refine control strategies over time as more

data becomes available, allowing the self-stabilizing spoon to adapt to changes in tremor characteristics or user behaviour. This adaptive capability enhances the effectiveness and reliability of the spoon in assisting individuals with hand tremors.

C. Motors

1) *Micro DC Motors*: : Micro DC motors are compact and affordable, making them suitable for applications like the self-stabilizing spoon. They offer simplicity, efficiency, and adequate torque for small-scale projects. However, they may lack precise control compared to servo motors, and their speed and torque characteristics may vary under different loads.

2) *Micro Servo Motors*: Micro servo motors provide accurate positioning and low power consumption, making them suitable for self-stabilizing spoon. However, their limited range of motion and relatively low torque may be a drawback for some applications.

3) *Stepper Motors*:: Stepper motors offer precise positioning and high torque, making them suitable for the self-stabilizing spoon. However, they can be more complex to drive and may produce audible noise during operation.

4) *Coreless Motors* : Coreless motors feature reduced inertia and higher responsiveness, making them suitable for dynamic motion control tasks in the self-stabilizing spoon. However, they may have limitations in terms of maximum torque and speed compared to other motor types.

5) *Intelligent Servos* : Intelligent servos offer advanced features such as built-in controllers, feedback sensors, and communication interfaces, which can enhance the functionality and control capabilities of the self-stabilizing spoon. However, they may be more expensive and complex to integrate compared to traditional servo motors.

D. Microcontrollers

1) *ARM Cortex-M Series Microcontrollers*: ARM Cortex-M series microcontrollers are suitable for running advanced control systems like PID, MPC, and data-driven control in applications such as the self-stabilizing spoon. They offer sufficient processing power, memory, and peripheral integration to implement complex control algorithms effectively while maintaining low power consumption and cost-effectiveness. In terms of cost, ARM Cortex-M series microcontrollers are generally affordable, making them accessible for a wide range of applications.

2) *Arduino Mega or Arduino Due*: Arduino Mega and Arduino Due boards may have limited processing power and memory compared to ARM Cortex-M series microcontrollers, making them less suitable for running advanced control systems like MPC or data-driven control. However, they can still handle simpler control algorithms like PID with appropriate optimization and resource management. In terms of cost, Arduino boards are relatively inexpensive, making them popular choices for hobbyist projects and prototypes.

3) *Texas Instruments MSP430 and Tiva C Series Microcontrollers*: Texas Instruments MSP430 and Tiva C series microcontrollers offer low power consumption, high performance, and a rich set of integrated peripherals, making them suitable for running advanced control systems in applications such as the self-stabilizing spoon. They provide sufficient processing power and memory to implement complex control algorithms effectively. In terms of cost, Texas Instruments microcontrollers may have a slightly higher price point compared to Arduino boards, but they offer advanced features and capabilities that justify the investment.

4) *ESP32 Family of Microcontrollers*: ESP32 microcontrollers offer Wi-Fi and Bluetooth connectivity, making them suitable for IoT applications like the self-stabilizing spoon. While they may have sufficient processing power and memory for running advanced control systems, their focus on connectivity features may limit their suitability for real-time control applications compared to other microcontroller platforms. In terms of cost, ESP32 boards are generally affordable.

E. Communication Methods

1) *Bluetooth Low Energy (BLE)*: Bluetooth Low Energy (BLE) is suitable for applications like the self-stabilizing spoon, offering low power consumption and compatibility with smartphones and other devices. BLE enables wireless communication between the spoon and a mobile app, allowing users to monitor and control the device easily. However, BLE has a limited range compared to other wireless technologies.

2) *WiFi*: WiFi connectivity allows for high-speed data transfer and remote control capabilities in the self-stabilizing spoon. It enables real-time monitoring and adjustments through a local network or the internet, providing users with greater flexibility and convenience. However, WiFi consumes more power compared to BLE and may not be suitable for battery-powered applications without proper power management.

3) *Near Field Communication (NFC)*: NFC technology enables short-range communication between devices, making it suitable for applications where proximity-based interactions are required. In the context of the self-stabilizing spoon, NFC can be used for authentication, pairing, or data exchange with NFC-enabled devices such as smartphones. However, NFC has a limited range and bandwidth compared to WiFi and BLE.

4) *RFID (Radio-Frequency Identification)*: RFID technology uses radio waves to identify and track objects, making it suitable for applications like inventory management or authentication. In the self-stabilizing spoon, RFID tags could be used to identify different users or customize settings based on individual preferences. However, RFID requires dedicated reader devices and may not offer real-time communication capabilities like BLE or WiFi.

III. SYSTEM IMPLEMENTATION

A. Overall view of the System

Initially, a prototype was built using two servo motors as the actuation mechanism, a PID controller for control, and an

Arduino Uno as the microcontroller. This setup was used to assess the system's behaviour. However, the prototype only responded to movement in two axes and did not adequately address high-frequency tremors.

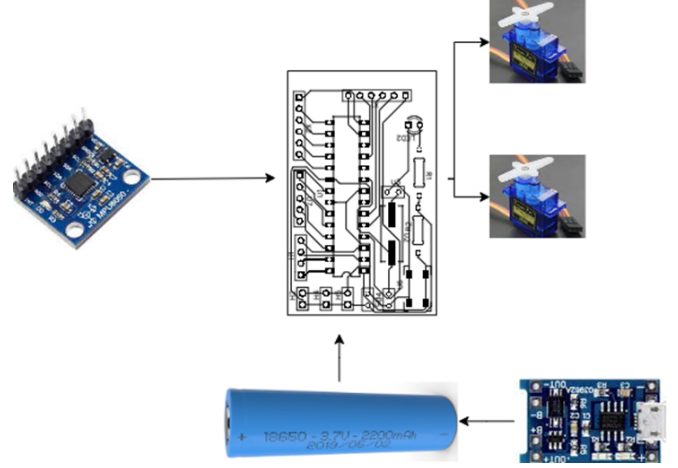


Fig. 6. Block diagram of the initial prototype

The system comprises an MPU6050 sensor, which includes an accelerometer and gyroscope, designed to detect hand movements indicative of Parkinson's disease and track orientation relative to gravity. An Atmega328P serves as the microcontroller for processing data and making decisions, subsequently transmitting the information to two servo motors. Illustrated in the above figure, the project's operational concept initiates with input from the MPU6050 sensor, which reads data upon tilting. This data is then forwarded for processing by the microcontroller, directing the servo motors to stabilize the assistive device, thereby functioning as its output.

B. Basic Working Principle

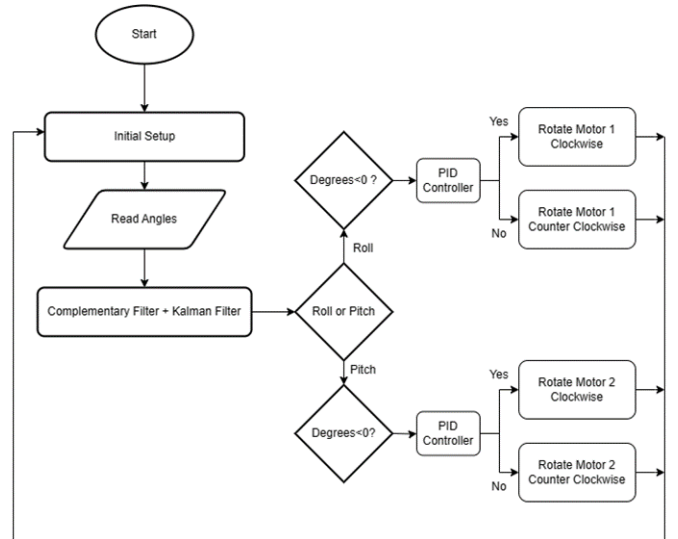


Fig. 7. Functionality of the system

Concerning the diagram above, the system's functionality can be outlined as follows. Initially, the system undergoes an initial setup phase before repetitively reading angle values. These values are then processed through complementary and Kalman filters to reduce noise and fuse data. The filtered angle data is then analyzed to discern whether it indicates a roll or pitch movement. Based on this information, the system determines the direction of motion, whether it is left or right, upward or downward. Depending on the type of movement and the magnitude of the angle value, the system decides to rotate either Motor 1 or Motor 2 clockwise or counterclockwise, ensuring that the spoon remains horizontal at all times. Without a PID controller, the spoon may struggle to effectively regulate its output to achieve the horizontal set point. To avoid these scenarios, PID controllers are used for both the X and Y axes.

C. Hardware Setup

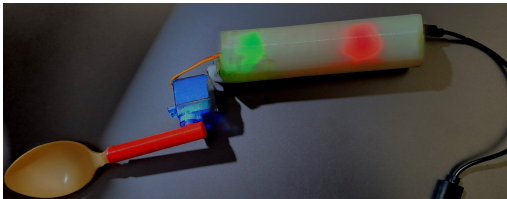


Fig. 8. Hardware implementation of the system

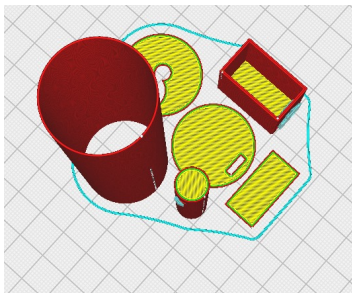


Fig. 9. 3D Model Of the System

In assembling the prototype, acrylic was chosen for the housing and support due to its availability and affordability. Servo motor supports were attached to the housing using screws, repeated for the two servo motors utilized in the project.

To ensure wire organization, holes were created beside the housing for servo wires to enter, connecting to pins on the ATmega 328p. Details regarding servo motor connections will be provided later. Powering the project is facilitated by an 18650 battery positioned within the housing.

The servo motor connections involve linking the signal wires of the servo motors to pins 8 and 9 on the Arduino Nano, while ensuring appropriate power and ground connections to the Arduino Nano or an external power supply. Concurrently, for the MPU6050 sensor, the SDA (Serial Data)

pin is connected to pin A4, and the SCL (Serial Clock) pin is connected to pin A5 on the Arduino Nano. Additionally, the VCC (Power) pin of the MPU6050 sensor is linked to the 5V pin on the Arduino Nano or an external power source, and the GND (Ground) pin is connected to the ground (GND) pin on the Arduino Nano or a shared ground within the system. These connections establish the communication and power supply necessary for the proper functioning of the servo motors and MPU6050 sensor within the prototype

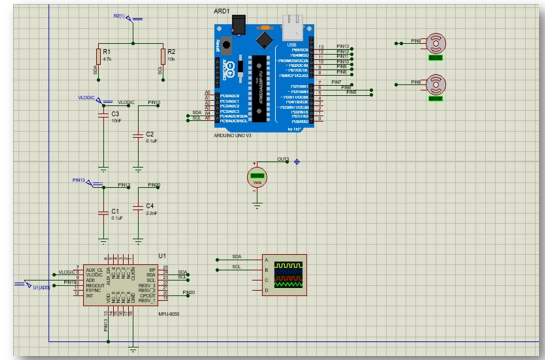


Fig. 10. Circuit Diagram of the System

D. Further implemtation

To address these limitations, several improvements could be considered for further implementation of the spoon. The following methods are chosen for that,

1) *Choosing Better mechanism:* To improve operation, the mechanism chosen is to use two micro DC motors with relevant gearboxes for the operation. These three motors correspond to the rotation of each axis, providing better control and stability for the self-stabilizing spoon. With this setup, the spoon can effectively counteract movements in all three axes, ensuring smoother and more precise operation during use.

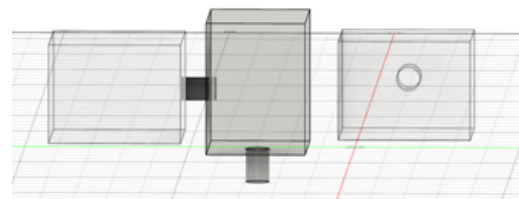


Fig. 11. connection between the three dc motors

2) *Choosing more effective controlling techniques:* For the self-stabilizing spoon, an more advanced PID controller with additional features is a suitable choice for achieving more effective stabilization while considering hardware availability and cost constraints. Here's how an advanced PID controller can be designed and why it is more suitable than a traditional PID controller:

Anti-windup Mechanisms: Traditional PID controllers can suffer from integral windup, especially in systems with large

disturbances or saturation limits. This occurs when the integral term accumulates error beyond the system's limits, impacting stability and responsiveness. To address this, anti-windup mechanisms like integrator clamping or back-calculation are incorporated into the controller. These mechanisms prevent or mitigate integral windup, ensuring stability and responsiveness even in challenging conditions.

Adaptive Tuning: Currently, the self-stabilizing spoon utilizes machine learning and acceleration sign change methods for better stabilization. However, the following approach is deemed more effective. The proposed controller objective is to find the corresponding controller parameters (PID gains) using the Recursive Least Squares (RLS) algorithm as an adaptation mechanism to make the closed-loop transfer function approximate the reference model transfer function. This is achieved by minimizing the error between the reference output and the actual output of the system. By applying the controller transfer function to the error, the control signal is generated. The modified estimation error of RLS is defined as the difference between the control signal and the expected control signal, which represents the model reference transfer function. The RLS algorithm recursively estimates the optimal PID gains by updating the controller parameters based on the error between the expected and actual control signals.

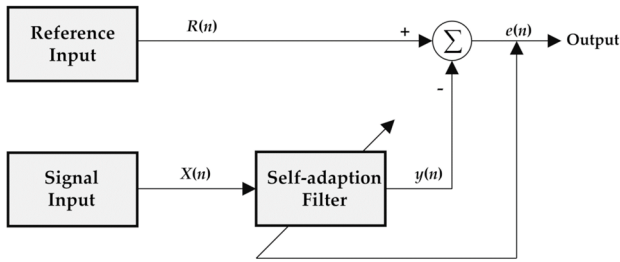


Fig. 12. Self-adaption Filter

The implementation of the Recursive Least Squares (RLS) algorithm on the ESP32 microcontroller can be achieved effectively, provided there is sufficient memory and other computational resources available. This approach offers a cost-effective and convenient way to implement more advanced control techniques for the self-stabilizing spoon.

Feedforward Control: Traditional PID controllers rely solely on feedback from sensors to adjust the control output. In contrast, feedforward control uses additional information, such as predictions of future disturbances or known system dynamics, to anticipate and compensate for disturbances before they occur. By incorporating feedforward signals into the control algorithm, the self-stabilizing spoon can respond more quickly and effectively to disturbances, leading to better stabilization and user experience.

3) *Choosing better micro controller:* The ESP32 microcontroller offers significant advantages over the Arduino Uno for projects like the self-stabilizing spoon due to its more powerful processor, built-in WiFi, and Bluetooth capabilities, and cost-effectiveness. With its dual-core CPUs and higher

clock speeds, the ESP32 enables faster computation and supports the implementation of advanced control algorithms and communication protocols. The integrated WiFi and Bluetooth functionality simplifies hardware setup and reduces overall costs by eliminating the need for additional modules or shields. Additionally, the availability of affordable ESP32 development boards and modules further enhances its cost-effectiveness, making it a preferred choice for applications requiring wireless connectivity, performance, and affordability.

IV. INTEGRATION OF GENERATIVE AI TO THE SYSTEM

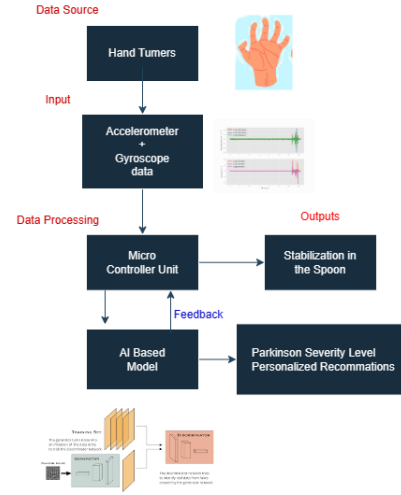


Fig. 13. System Outline with Machine Learning Algorithms

The basic functionality of the system was elaborated under section III. It was noted, during the development process, that the positioning of the spoon can be significantly improved with the use of Artificial Intelligence. Hence, the following approach was followed.

Initially, tremor data was collected from two Parkinson's patients—one with a mild case of the disease and the other with a severe case. Both patients were above 60 years old. The collected data consisted of accelerometer and gyroscope data. Using that data, a model was trained to detect the severity level of the patient holding the device. Once the model was trained, two approaches were available. First, the data read from the microcontroller was to be sent to the model and the response be sent via IoT. Since rapid response is a requirement of the device, that approach was discarded. The second approach was to deploy the model on the microcontroller itself. In this case, the trained model was converted to one that can be run on an ESP32 with the use of TensorFlow Lite. A PID controller was then implemented to stabilize the movement of the spoon. The values for the PID controller constant were chosen depending on the patient's severity level recognized by the model. However, this approach was proven to be erroneous as well. Particularly, the model had not been trained well due to not having a large enough dataset.

The machine learning models SVM (Support Vector Machine), SVC (Support Vector Classifier), and CNN (Con-

volutional Neural Network) were developed and trained for Parkinson's stage classification using the Python programming language. However, significantly accurate results could not be achieved due to the limited availability of data to overcome the issue of data availability, synthetic data is generated using CTGAN and evaluated using the TableEvaluator, but the expected output is not significantly developed.

The following approach was finally adopted. While observing the datasets from the patients, the following pattern was observed: When the tremor levels are more severe, the sign changes in accelerometer values are more frequent. Conversely, when the severity level decreases, sign changes become less frequent. Since accurate output couldn't be obtained using the previously explained machine learning model due to a lack of data, we chose to focus on the rate of sign changes, which resulted in successful outcomes. To achieve this goal, the code was adapted to allow the microcontroller to handle the task itself. Following this adjustment, improvements in stabilizing the spoon based on changes in severity level could be observed.

TABLE I
PID VALUES CORRESPONDING TO DIFFERENT OPERATING MODES

Operating Mode	Axis	Parkinson Stage	Kp	Ki	Kd
Basic Operation Mode	X	No classification method	1.05	0	0
	Y	No classification method	1.1	0	0
With Integrating ML	X	Low	1	0	0
		High	1.1	0	0
	Y	Low	1	0	0
		High	1.2	0	0
With Considering Accel. Change	X	Low	1.02	0	0
		High	1.15	0	0
	Y	Low	1	0	0
		High	1.2	0	0

Here, an advanced PID controller is used, and accordingly, the initial PID values were adjusted automatically based on the advanced PID control system, which is adaptive to the tremor level.

The following figure represents accelerator and gyroscope data of severe Parkinson's patients.

TABLE II
ACCELEROMETER AND GYROSCOPE VALUES OF SEVERE PARKINSON'S PATIENT

Time	AccX	AccY	AccZ	GyroX	GyroY	GyroZ
0.74327831	5860	2764	19852	-1216	12444	3929
0.743297836	1988	-4244	21744	-1200	6995	6911
0.743298924	-332	-4840	13376	-1232	1203	127
0.743300556	-3236	-9612	7960	-1200	-412	2135
0.743301632	488	-3364	14576	-1200	-514	-1605
0.743303264	488	-4112	13840	-1200	-641	-1064
0.743304352	-1232	-7508	11388	-1232	499	685
0.743305972	-1912	-7060	15476	-1232	-1063	495
0.74330706	-9248	-16740	3976	-1200	409	-8034
0.743308692	-12080	-19240	5736	-1216	-1432	-1747
0.743310313	-7992	-12492	5884	-1216	-114	3208
0.7433114	-2496	-5284	15560	-1216	-656	5211
0.743313032	3864	2276	15660	-1216	-785	6188
0.743314109	7724	10048	22620	-1248	-302	4522
0.743315741	10492	16180	24644	-1216	-804	9362
0.743316829	3072	8756	15704	-1248	1195	11442
0.743318449	2708	2264	13136	-1216	845	6386
0.743319537	2108	1612	12380	-1216	-1295	5660
0.743321169	-6684	-10016	12360	-1248	-966	2604
0.743322245	-7904	-11748	16132	-1232	-916	-1113

The accelerations and gyroscope readings obtained by the sensor are continuously stored in the Excel file. From this data,

TABLE III
SYNTHETICALLY GENERATED ACCELEROMETER AND GYROSCOPE VALUES WITH STATUS

AccX	AccY	AccZ	GyroX	GyroY	GyroZ	Status
-2784	7968	16656	-1008	330	-570	high
-752	7132	13968	-960	2190	124	low
1328	8716	15740	-1056	-2455	-2136	high
-3412	-796	6260	-1216	10974	-4703	high
-4092	-404	17900	-1216	-2942	3292	high
-3628	8636	16812	-976	-575	-285	mid
-3556	6956	-13656	-1008	606	968	high
-1724	176	16296	-1216	1069	448	high
-1092	8900	19016	-1024	1120	763	low
1388	12492	-44	-1024	495	-1179	low
-644	2380	5228	-960	-5984	395	high
1092	-10016	17096	-1008	105	753	high
11936	7652	6724	-1024	378	-691	mid
-1440	6672	17924	-1024	-979	536	mid
-196	5548	14148	-1024	480	8244	high
-928	7228	17620	-960	-516	-709	high
-1184	8700	17240	-992	641	693	high

more synthetic data is generated. The synthetic data generation process involves utilizing the Conditional Tabular GAN (CTGAN) model to generate data that closely resembles the original dataset, which comprises accelerometer and gyroscope values along with Parkinson's stage labels. CTGAN builds depend on a generative adversarial network (GAN) framework, where a generator network learns to generate samples that are indistinguishable from the real data. In contrast, a discriminator network learns to distinguish between real and synthetic samples. During training, the generator aims to minimize the difference between the distributions of the synthetic and real data, guided by feedback from the discriminator. This adversarial training process continues iteratively until the generator produces synthetic samples that closely match the statistical properties and distributions of the original dataset. Following training, the CTGAN model generates synthetic samples by sampling from the learned generator network. These generated samples are then evaluated through visual inspection, statistical analysis, and comparison with the original dataset to ensure they capture the essential characteristics and distributions of the real data. Additionally, the original and synthetic datasets undergo preprocessing steps, like data cleaning, scaling, and encoding of categorical variables, to prepare them for input into the Parkinson's stage prediction algorithm.

The total operating time of the spoon was detected using a generative AI-trained model. At the end of the day, a report was generated, which included the starting and ending operating times, as well as the total operating time of the spoon.

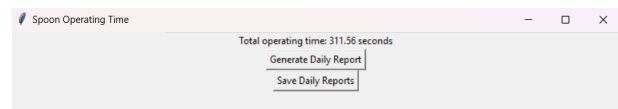


Fig. 14. Graphical user interface window displaying the usage time of a spoon

V. EFFECTIVE USE OF COMMUNICATION TECHNOLOGIES

A. Wireless Connectivity

The ESP32 microcontroller, with built-in Bluetooth Low Energy (BLE) and WiFi connectivity, is an ideal choice for enabling wireless communication in the self-stabilizing spoon. With BLE and WiFi capabilities, users can remotely monitor and adjust settings via smartphones or tablets, enhancing convenience and accessibility.

B. Mobile Application

The development of a dedicated mobile application that pairs with the self-stabilizing spoon via Bluetooth or WiFi enhances user experience by providing real-time feedback on spoon positioning, tremor detection, and customization options.

C. Data Logging and Analysis

Data logging and analysis capabilities integrated into the self-stabilizing spoon system allow for the collection and examination of valuable usage data. This data includes tremor patterns, meal consumption metrics, and user preferences, providing insights into disease progression and patient status. By analyzing this data, doctors and caregivers can track the progression of the disease, monitor changes in tremor severity, and assess the effectiveness of treatment strategies. Furthermore, this information enables continuous improvement of the device's performance and customization to better meet the user's needs over time.

D. Remote Control and Monitoring

Enabling remote control and monitoring functionalities through the mobile application empowers users and caregivers to manage the self-stabilizing spoon efficiently. Users can make real-time adjustments to the spoon's settings via the app, ensuring optimal performance and comfort during use. Additionally, caregivers can remotely send alerts to the spoon, such as vibrations or LED blinking, to prompt the user to perform predefined tasks like taking medication or eating. This feature enhances user independence and safety while providing caregivers with peace of mind and the ability to offer timely assistance when needed.

E. Firmware Updates

Implementing Over-The-Air (OTA) firmware updates via WiFi or BLE ensures that the self-stabilizing spoon remains up-to-date with the latest features and bug fixes without requiring physical intervention. This capability is essential for addressing any issues or bugs related to the current firmware, ensuring optimal performance and reliability of the device. By leveraging OTA updates, users can easily access and install software enhancements, improving the functionality and usability of the self-stabilizing spoon over time. This ensures a seamless user experience and helps maintain the device's effectiveness in supporting individuals with hand tremors.

VI. ECONOMIC AND TECHNICAL FEASIBILITY

A. Economic feasibility

1) *Low-Cost Components:* Using hardware components that are readily available at low cost adds to the feasibility of the project. It makes the device more accessible to a wider range of users, especially if it's intended for individuals who might benefit from tremor-reducing technology.

2) *Market Analysis:* Furthermore, this device can be feasibly promoted to achieve higher profits, as it costs only about \$20 to produce. Even if it is sold for \$40, the producer can double their profit. Considering current market prices, similar items with fewer functionalities are being sold for over \$200. [3] Consequently, this device presents a significant profitability opportunity.

B. Technical Feasibility

1) *Tremor Reduction:* The claim that the prototype spoon can overcome almost 95% of low tremors suggests a high degree of feasibility. This indicates that the device is effective in its intended purpose, which is a crucial factor for its feasibility and practicality.

Making things clearer is easier with the potential for a step-by-step 3D design process in the next prototype. This shows the ability to adapt and solve problems, which is a common and good way to develop products. Also, successfully putting together circuit parts shows that the basic functions work well and can be trusted. Knowing that the next design could be even better also shows a smart way to deal with problems, as the team is thinking about ways to make things better. This step-by-step method not only lets them make things better with feedback and testing but also saves time and effort by using what they already have. This work makes the project more likely to succeed, promising improvements through these design steps.

VII. POSSIBLE CHALLENGES

To address the major challenges, several improvements to the implementation technique are necessary. Firstly, the spoon's accuracy for high tremors must be enhanced. This can be achieved by upgrading to motors with higher response times. However, acquiring such motors can be expensive, and unfortunately, they are not readily available in Sri Lanka; they would need to be imported, which adds complexity and cost to the project.

Another significant issue is the size of the spoon. To reduce its size, smaller motors like micro linear motors should be considered. However, this solution recalls the challenge of maintaining accuracy for high tremors. This issue highlights the trade-offs involved in improving the device: smaller motors can reduce size but may compromise performance. Finding the right balance between size and functionality will be crucial in overcoming these challenges.

VIII. IMPACT ON SOCIETY AND THE WORLD

This spoon has a profound impact on society, particularly for patients with hand tremors. It provides them with the opportunity to eat without the frustration of food spillage. Beyond Parkinson's disease, individuals with various conditions causing hand tremors can benefit from this spoon's design. Considering Parkinson's disease alone, there are over 10 million people worldwide living with this condition who could greatly improve their quality of life with access to this spoon.

The significance of this impact extends beyond mere convenience. For many individuals with hand tremors, the simple act of eating can be a daily struggle that affects their dignity and independence. By enabling them to eat more comfortably and with greater control, this spoon restores a sense of normalcy to their lives. It enhances their ability to enjoy meals with friends and family, participate in social gatherings, and maintain a sense of autonomy.

Furthermore, the impact of this spoon goes beyond the individual level. It can alleviate the burden on caregivers and healthcare facilities, reducing the need for constant assistance during meal times. This not only improves efficiency but also allows caregivers to focus on other aspects of care, ultimately benefiting the entire healthcare system.

On a global scale, the widespread adoption of this spoon could lead to a significant improvement in the quality of life for millions of people worldwide. It represents a tangible solution to a common and challenging problem faced by many individuals with hand tremors. Through its simplicity and effectiveness, this spoon has the potential to make a meaningful difference in the lives of countless individuals and their caregivers, marking a step forward in inclusive and accessible healthcare solutions.

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