

ECE 445  
SENIOR DESIGN LABORATORY  
DESIGN DOCUMENT

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# Early proposal for ECE445

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# 1 Introduction

## 1.1 Problem

Modern air travel involves the constant movement of passengers within airport premises, often burdened with personal belongings and luggage. While airports strive to provide convenience, the process of moving from the check-in area to the departure gate can be challenging for passengers, especially those carrying heavier bags or many bags. This challenge is particularly relevant given the increasing trend of passengers bringing additional luggage, with weights ranging from 2 to 3 kilograms. Although the total weight might still be under the restriction of 50 lbs, the increased amount of bags will add difficulties for people to hold with two hands.

## 1.2 Solution

The proposed solution for this problem is the development of a leg-wheeled robotic system designed to accompany airport passengers with their luggage. The primary objective is to enhance the passenger experience by offering a reliable and autonomous companion capable of carrying bags weighing 2-3 kilograms. This robotic system will intelligently follow passengers with the help of camera and vision control algorithms as they traverse the airport, providing a hands-free and effortless solution to the burden of carrying personal items. In instances where passengers face challenges, such as staircases, the robot's unique legged design allows it to overcome obstacles that traditional wheeled robots cannot. This robustness ensures smooth navigation in a variety of airport environments.

## 1.3 Visual Aid

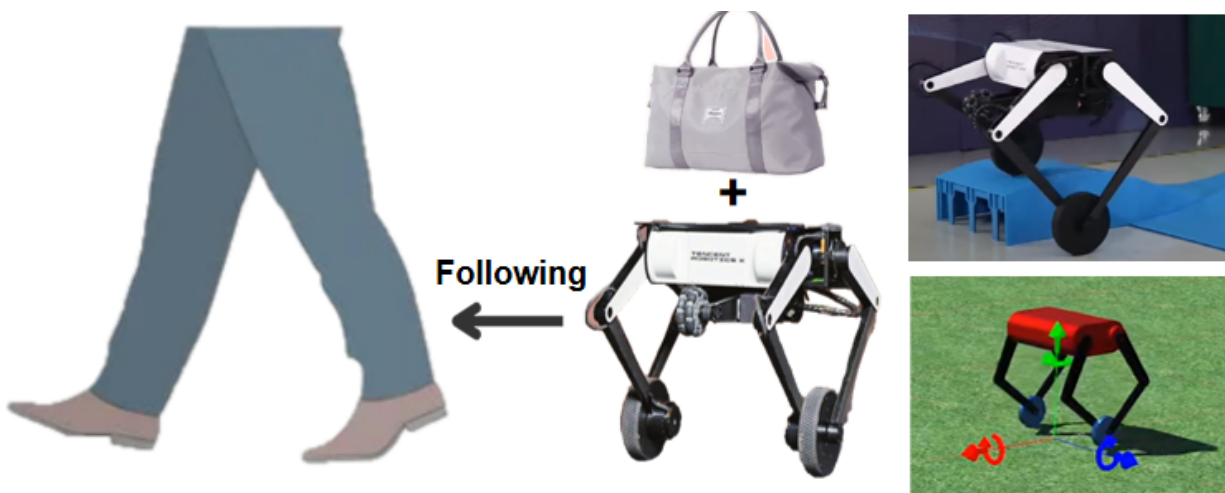


Figure 1: Overall Work Flow

## 1.4 High-level requirements list

1. The luggage weight must be around 2-3 kg.
2. the overall size of the robot needs to be around 500mm×500mm.
3. The distance between the legs and the robot should be within 1m throughout the whole process.

## 2 Design

As shown below, our design contains the following part: Power unit, the control unit, the planning unit, sensor unit and motor unit. The control unit is the central unit of our system, where the microcontroller receives the command and execute by sending signals to different motors. The power unit is responsible for converting the battery voltage from 24v to any voltage needed by different units. The motoe unit consists of four leg motors and two wheel motors.

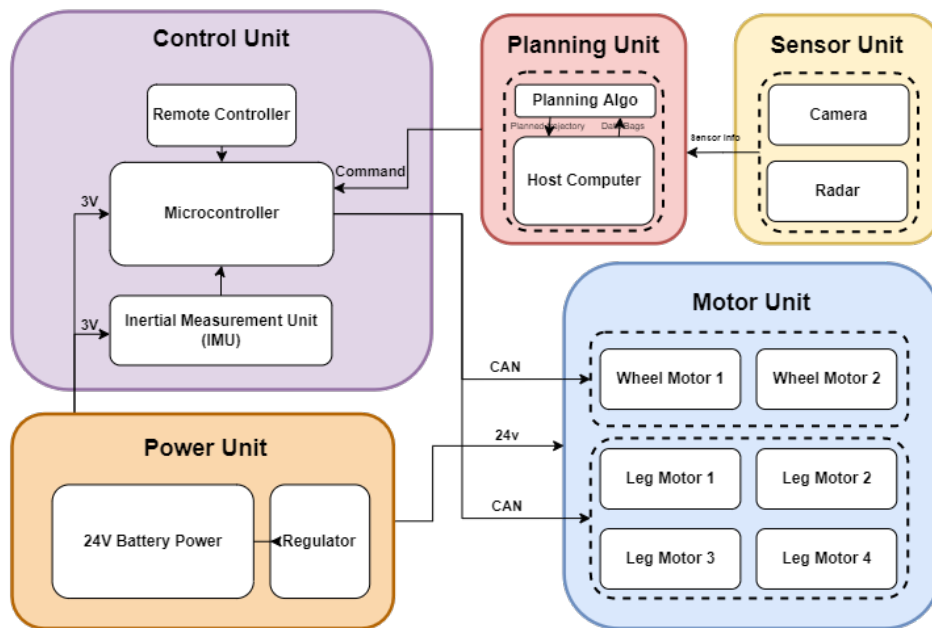


Figure 2: Top Level

### 2.1 Mechanical Structure

For the design of the balancing robot, we mainly consider aspects such as size and stability. We determined that the overall size of the robot needs to be around 500mm×500mm, so it can carry a normal-sized handbag. In terms of stability, we mainly focus on the leg joints. We found that many wheeled leg robots exhibit a splaying of the feet, which is due to gaps in their leg joints causing the robot's lower legs to bend outward under high

torque. Our solution is to increase the diameter of the cylindrical shaft of the leg joint to suppress the splaying phenomenon.

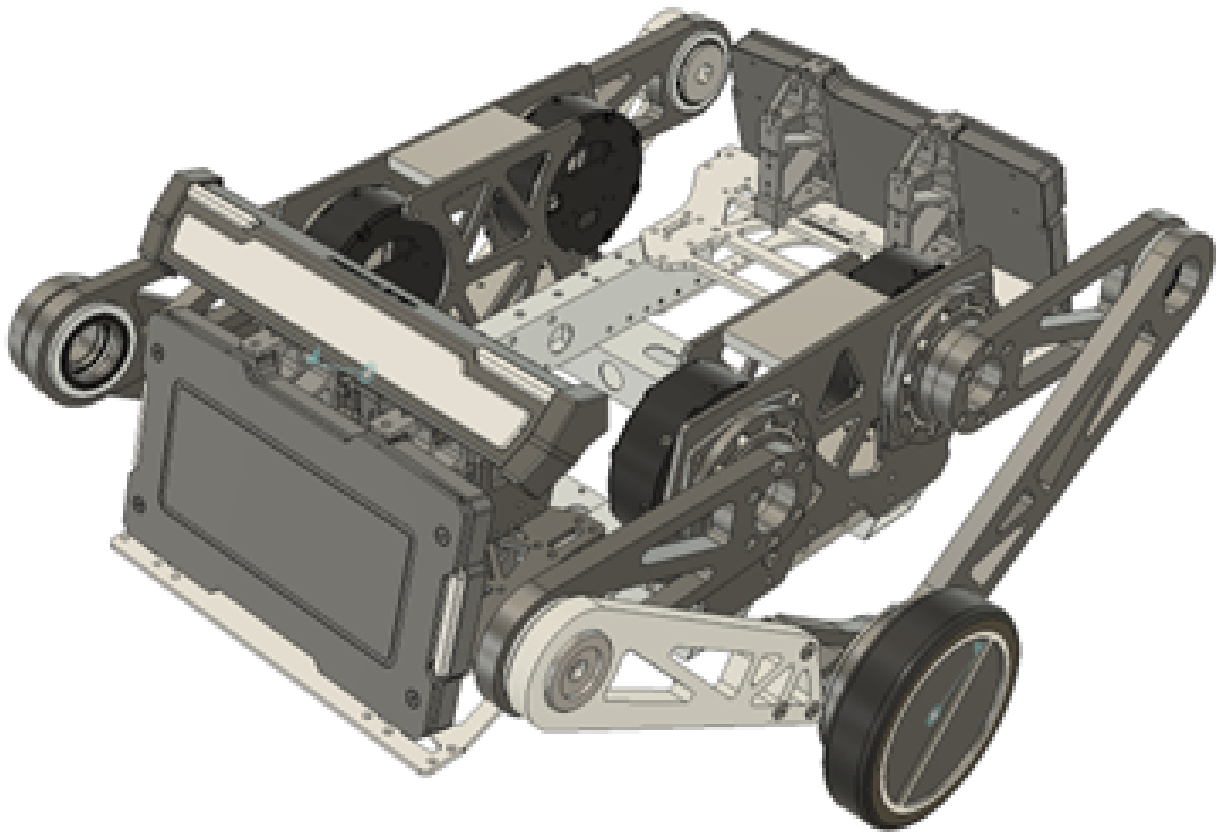


Figure 3: Overview for prototype 1

## 2.2 Mechanical System

We assume the weight of our balance robot is 20kg. At the hip joint, we use Unitree Technology's A1 joint motor, which has a peak torque of 33.5 Nm, meeting our requirements for joint motors.

At the leg joints, we use CNC machined aluminum parts and bowl group bearings for joint fixation. This method of fixation, compared to using screws, allows for a larger joint shaft diameter, effectively reducing the wobble in the leg joints. It also minimizes the parts number we need.

At the wheel joints, we use Xiaomi's Cyber Gear motors, along with KP035 robot joint bearings to share the load of the wheel motors.

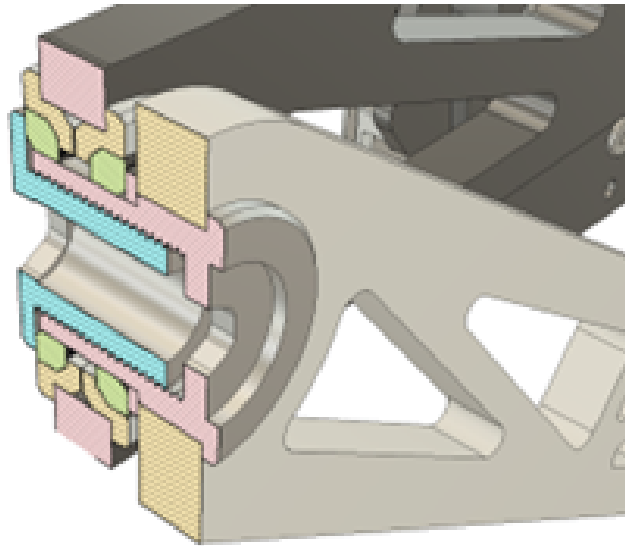


Figure 4: Leg joint cross-section view

In terms of materials, our final robot uses carbon fiber materials because they have a smaller mass compared to other materials at the same strength. We also adopt topology analysis to reduce as much weight as possible.

We are also using topology to minimize our robot's weight and maintain the parts' strength at the same time. The following is the topology optimization result in Fusion 360. By using this techniques, we are able to reduce around 30 percent of the robot's weight.

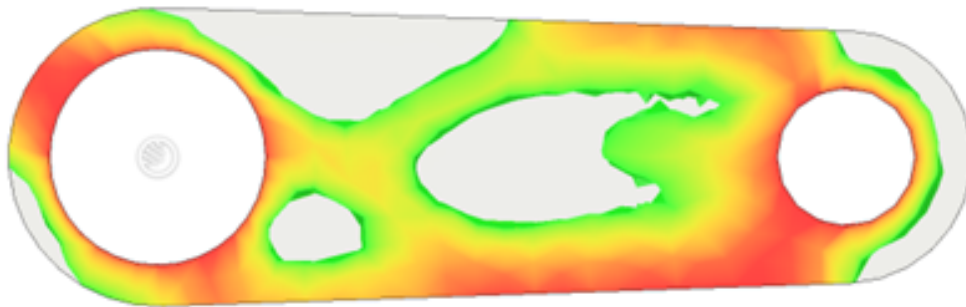


Figure 5: Upper leg topology result

This is the picture of the current robot legs. We are testing our design first using acrylic boards due to their low cost. In the final version we plan to use carbon fiber boards for lighter weight and higher material strength.

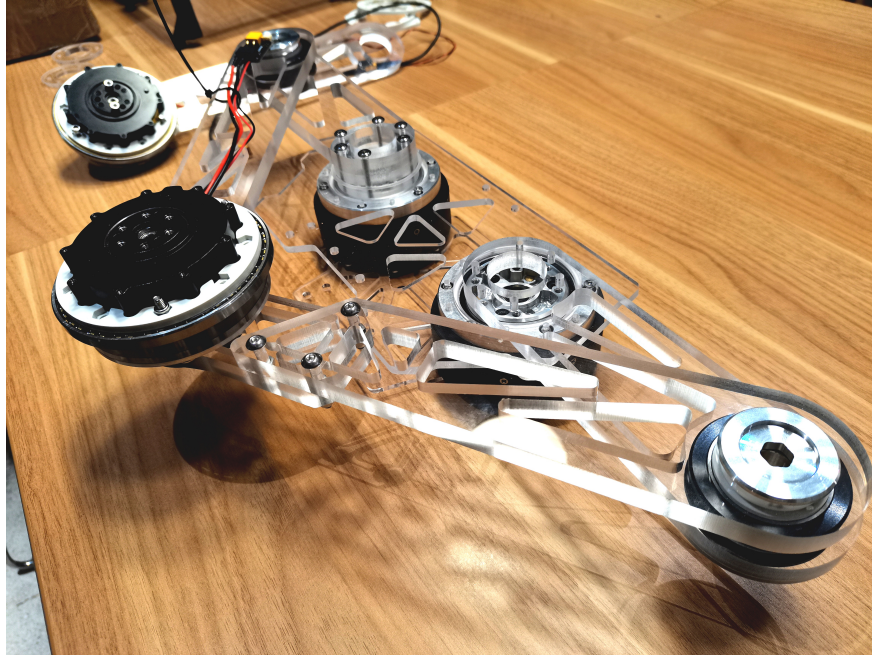


Figure 6: Robot Leg

## 2.3 Electrical System

### 2.3.1 Micro-controller Board

We are using STM32F407IGH6 for our microcontroller board. This is a new product developed by ST in 2011 following the ARM Cortex-M4 architecture. Compared with the previous products, the STM32F4's new integrated FPU unit and DSP instructions greatly enrich the functions of the STM32 chip, and at the same time, the STM32F4's main frequency has also been improved. The main frequency can reach up to 168Mhz (can have 210DMIPS running speed), making the STM32F4 in floating point computing or DSP processing ability greatly improved, with a very wide range of application prospects.

### 2.3.2 Motor Control

We are using the joint A1 motor from Unitree and the wheel motor from XIAOMI. The A1 motor uses RS485 to communicate and the wheel motor uses CAN (Controller Area Network) to communicate. Because our micro-controller board doesn't have RS485 port, so we choose to use UART and a TTL to RS485 converter to control A1 motor.

## 2.4 Embedded Software

To communicate with the peripherals, we use the standard API and the API from HAL. What's more, we decided to use a Real-time operating system to support the multi-threads process. Therefore, we decided to use STM32CubeMX to generate the basic code

skeleton, and use VS Code as our code editor for its powerful add-ons. We choose GCC, GDB and OpenOCD as our toolchain and debug tool.

## 2.5 Control System

As for the control system, since our robot's controlling strategy mainly consists of two parts: the wheel part and the leg part. We plan to use the Linear quadratic regulator (LQR) algorithm for both of them and see what performance looks like. And this process will be tested on matlab simulink and Webot for simulation and later on moved to the real robot.

The forward motion of the car can be decomposed into forward motion and relative rotation (pitch) around the center of mass P of the car body.

### 2.5.1 Wheel model

The force analysis diagram for the left and right wheels of the two-wheeled robot is shown in the figure. The resultant force in the horizontal direction for the robot is the vector sum of the frictional force between the wheels and the ground, as well as the horizontal force acting between the chassis and the wheels. Since parameters (mass, moment of inertia, radius) being the same for both wheels. Let's conduct force analysis using the example of the right wheel:

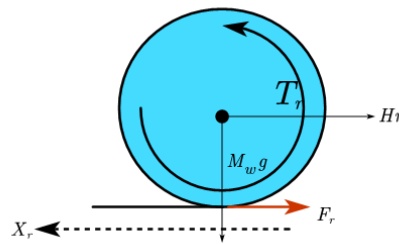


Figure 7: Wheel model

Horizontally, we can derive the equation that:

$$\ddot{x}_r = \frac{F_r - H_r}{M_w} \quad (1)$$

$$\dot{\omega}_r = \frac{T_r - F_r R}{I} \quad (2)$$

Suppose  $\omega_r = \frac{\dot{x}_r}{r}$ , and combine (1) and (2). We can obtain that :

$$\left(M_w + \frac{I}{r^2}\right)\ddot{x}_r = \frac{T_r}{r} - H_r \quad (3)$$



The horizontal displacement of the center O of the car chassis is:

$$x = \frac{x_l + x_r}{2} \quad (4)$$

Therefore, applying equation (3) to the left wheel and combine them together, we could obtain that:

$$(M_w + \frac{I}{r^2})\ddot{x} = \frac{T_l + T_r}{2r} - \frac{H_l + H_r}{2} \quad (5)$$

## 2.5.2 Moving forward and backward

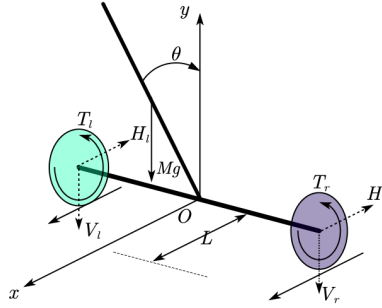


Figure 8: Moving forward and backward

For the vehicle body, according to Newton's second law, we can derive the equation horizontally:

$$H_l + H_r = M \frac{d(x + L \sin \theta)}{dt^2} \quad (6)$$

vertically:

$$V_l + V_r = M \frac{d(L \cos \theta)}{dt^2} + Mg \quad (7)$$

For the vehicle body, according to the rigid body rotation law with a fixed axis, we can obtain the equation:

$$J\ddot{\theta} + T_l + T_r = (V_l + V_r)L \sin \theta - (H_l + H_r)L \cos \theta \quad (8)$$

Combining (6), (7) and (8), we could obtain:

$$\ddot{\theta} = \frac{g \sin \theta - \ddot{x} \cos \theta - \frac{(T_l + T_r)}{ML}}{\frac{J}{ML} + L} \quad (9)$$

Combining the equation (6) and equation (5), we can get:

$$(M + 2M_w + \frac{2I}{r^2})\ddot{x} = ML(\ddot{\theta} \cos \theta - \dot{\theta}^2 \sin \theta) + \frac{T_l + T_r}{2} \quad (10)$$

When our vehicle body can keep balance and steady with a neglectable pitch angle  $\theta$ , we have the approximation as following:

$$\cos\theta = 1, \sin\theta = \theta, \theta^2 = 0 \quad (11)$$

Then the equation (10) can be linearized as :

$$\ddot{x} = \frac{T_l + T_r}{(M + 2M_w + \frac{2I}{r^2})r} - \frac{ML\ddot{\theta}}{(M + 2M_w + \frac{2I}{r^2})} \quad (12)$$

And the equation (9) could be linearized as:

$$\ddot{\theta} = \frac{g\theta - \ddot{x} - (\frac{T_l + T_r}{ML})}{\frac{J}{ML} + L} \quad (13)$$

Solving the equation system composed of (12) and (13), we get the following formula at last:

$$\ddot{x} = \frac{J + ML^2 + MLr}{JM r + r(J + ML^2)(2M_w + \frac{2I}{r^2})} (T_l + T_r) - \theta \frac{M^2 L^2 g}{JM + (J + ML^2)(2M_w + \frac{2I}{r^2})} \quad (14)$$

$$\ddot{\theta} = \theta \frac{MLg(M + 2M_w + \frac{2I}{r^2})}{JM + (J + ML^2)(2M_w + \frac{2I}{r^2})} - \frac{\frac{ML}{r} + M + 2M_w + \frac{2I}{r^2}}{JM + (J + ML^2)(2M_w + \frac{2I}{r^2})} (T_l + T_r) \quad (15)$$

### 2.5.3 Rotation Motion

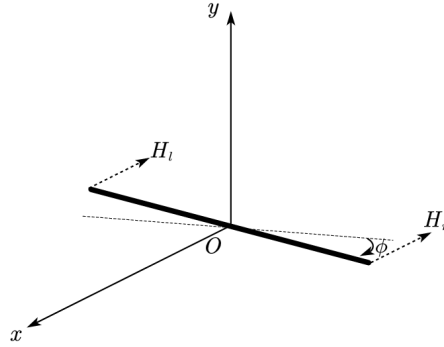


Figure 9: Rotation model

According to the law of rigid body rotation, we have :

$$J_\phi \ddot{\phi} = \frac{D}{2} (H_l - H_r) \quad (16)$$

$$\ddot{\phi} = \frac{\ddot{x}_l - \ddot{x}_r}{2} \quad (17)$$

Then we can plug equation (3) into the equations above, resulting in:

$$\ddot{\phi} = \frac{T_l - T_r}{rM_w D + \frac{ID}{r} + \frac{2rJ_\phi}{D}} \quad (18)$$

### 2.5.4 LQR control system

With equation (12), (13) and (18), we can generate the state function of our control system in the form of  $\dot{X} = AX + Bu$ :

$$\begin{bmatrix} \dot{x} \\ \ddot{x} \\ \dot{\theta} \\ \ddot{\theta} \\ \dot{\phi} \\ \ddot{\phi} \end{bmatrix} = \begin{bmatrix} 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & A_{23} & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & A_{43} & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix} * \begin{bmatrix} x \\ \dot{x} \\ \theta \\ \dot{\theta} \\ \phi \\ \dot{\phi} \end{bmatrix} + \begin{bmatrix} 0 & 0 \\ B_{21} & B_{22} \\ 0 & 0 \\ B_{41} & B_{42} \\ 0 & 0 \\ B_{61} & B_{62} \end{bmatrix} * \begin{bmatrix} T_l \\ T_r \end{bmatrix} \quad (19)$$

Where,

According to LQR, we need to set  $u = -Kx$ , where  $K$  denotes the feedback gain matrix and minimize the cost function of LQR control algorithm:

$$J = \frac{1}{2} \int_0^{\infty} (X^T Q X + u^T R u) dt \quad (20)$$

Where  $Q$  is the state vector weighting matrix of a semi-positive definite symmetric constant, and  $R$  is the control rate weighting matrix of a positive definite symmetric constant. Increasing the weighting matrix  $Q$  will decrease the overshoot and settling time of the dynamic process, but it will correspondingly increase the energy consumption of the control inputs. When the coefficients of the  $R$  matrix increase, it can reduce the number of input variables of the system, but it will also decrease the response speed of the system. To reduce the energy consumption of the system's control, one can appropriately increase the value of the weighting matrix  $R$ . However, if the value of the weighting matrix  $R$  is too large, it will result in too small control energy, which is also disadvantageous for controlling the system.

In order to select the most appropriate set of  $Q$  and  $R$ , we planned to use MATLAB to simulate the performance of different choices.

## 2.6 Host System Trajectory Planning Module

For this part, we plan to move all the computation work to the host computer since we are afraid of the computing power of the microcomputer. Of course, if we latter proved the microcomputer can cater to this work, we will abandon this unit. Till now, we still want to use the ROS operating system to let the robot pass rosbags to the host system, which contains all the pos and vel infomation of the robot. What's more, the camera and radar unit will also catch the corresponding information. Then we will use an open source following algorithm to plan the trajectory and give specific command for robot to execute.(e.g: move forward, backward ....)

## 2.7 Sensor fusion Unit

In the sensor fusion module, we expect to use two modules: vision module and Bluetooth module to perform dual recognition and positioning functions, so as to improve the stability and accuracy of recognition and tracking.

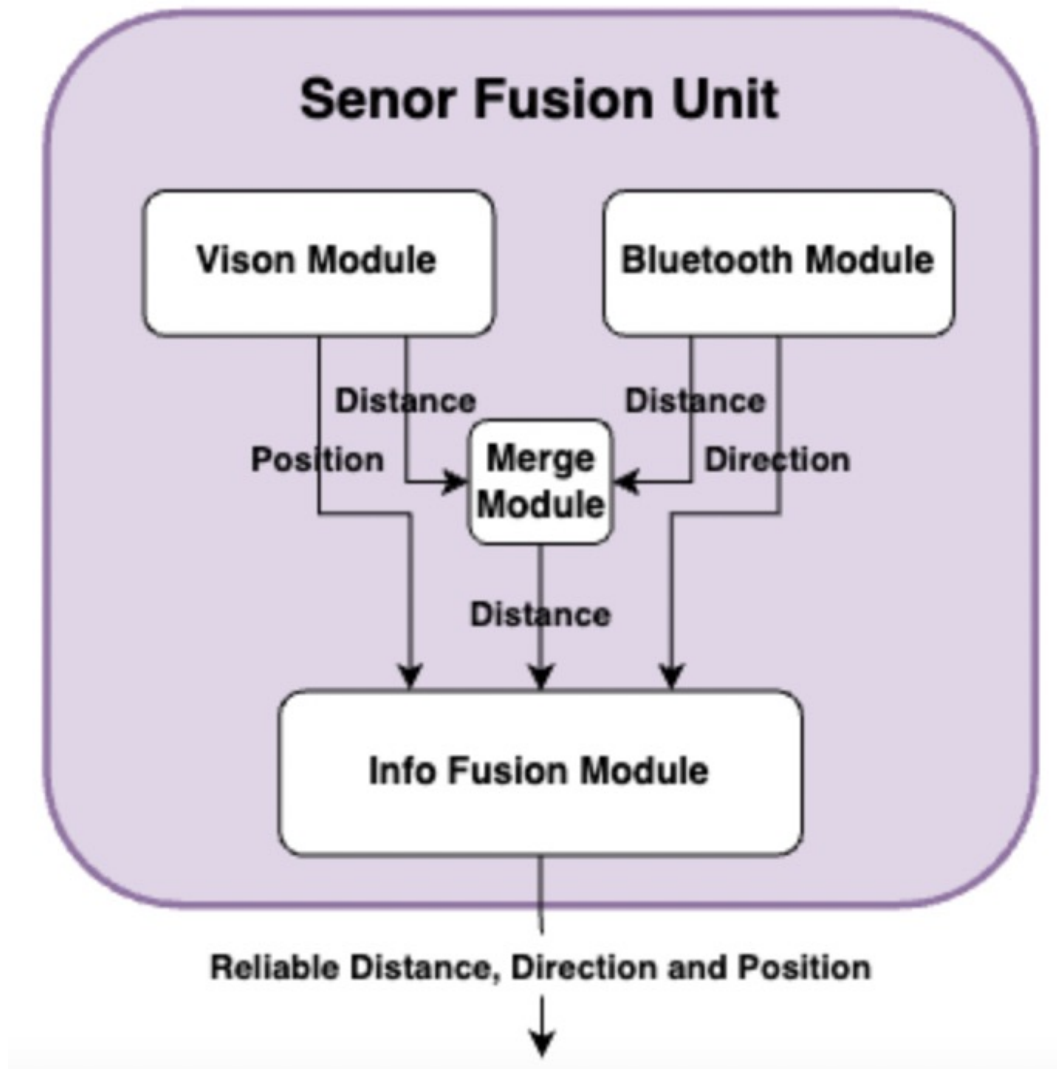


Figure 10: Fusion Unit

### 2.7.1 Bluetooth Module

In this module, our design is roughly divided into several parts: Bluetooth module and Beacon, positioning algorithm and signal processing.

**Bluetooth Beacon.** The first one is selecting the appropriate bluetooth module and beacon: For the Raspberry Pi, we would like to choose a Bluetooth module that supports Bluetooth Low Energy (BLE), such as the HC-05 or a more advanced module like BLE 5.0,

to reduce power consumption. This module will be equipped on the robot as the signal receiver. As for the bluetooth beacon, our requirement is small, low energy consumption and long transmission distance so that we can make it to be a wristband from the consumer perspective. Therefore, we would like to choose beacon like iBeacon or Eddystone beacon.

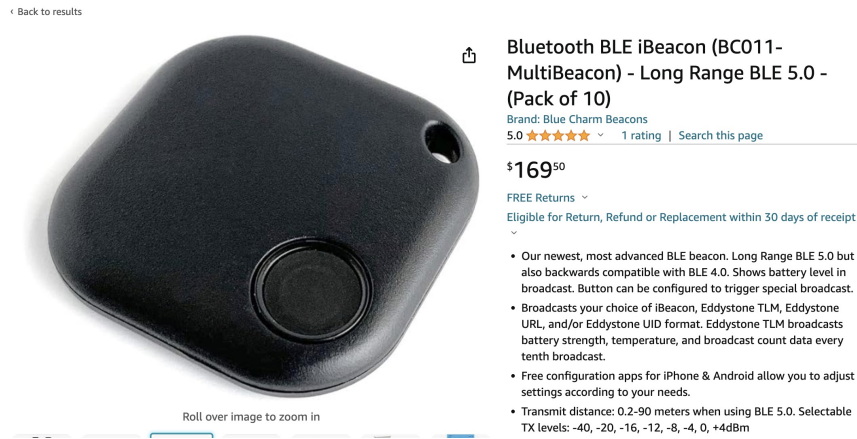


Figure 11: Example of Bluetooth Beacon

**Positioning Algorithm:** When using Bluetooth beacons for positioning, we will estimate the distance based on the Received Signal Strength Indicator (RSSI). A simple method is to use a logarithmic model that relates RSSI to distance. The relation between RSSI and distance can be roughly seen as the following:

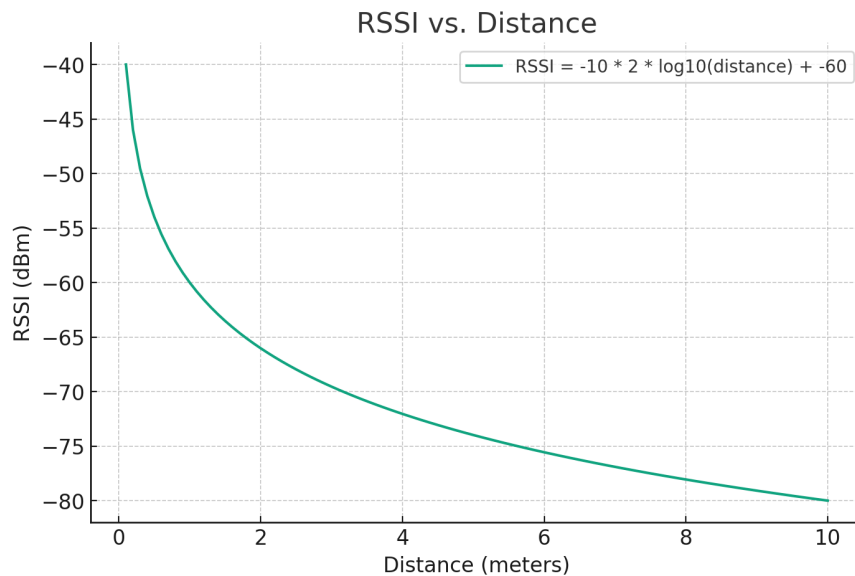


Figure 12: Relation between RSSI and distance

From the graph, we can calculate distance in terms of RSSI as:

$$d = 10^{\left(\frac{A-RSSI}{10 \cdot n}\right)}$$

**Signal Processing:** Bluetooth signals can be affected by environmental factors such as walls and human bodies. Therefore, we plan to implement a simple filtering algorithm: Moving average filter. This filter averages the RSSI values over a certain number of samples to provide a more stable estimate of the signal strength. The formula for a moving average filter is:

$$RSSI_{\text{filtered}}[n] = \frac{1}{N} \sum_{i=0}^{N-1} RSSI[n-i]$$

Where: -  $RSSI_{\text{filtered}}[n]$  is the filtered RSSI value at the  $n$ -th sample. -  $N$  is the number of samples over which the average is taken (the window size of the filter). -  $RSSI[n-i]$  is the RSSI value at the  $(n-i)$ -th sample.

In a practical implementation, the filtered RSSI value will be updated every time a new RSSI measurement is obtained, using the most recent  $N$  samples to calculate the average. This helps to smooth out short-term fluctuations in the signal strength while still allowing the filtered value to respond to changes in the distance between the Bluetooth beacon and the receiver.

### 2.7.2 Drawback of Bluetooth Module

But is bluetooth module alone enough? The bluetooth has following drawbacks, which leads to the necessity of using a vision module to recognize dually.

**Signal Interference:** Bluetooth signals are susceptible to interference from the surrounding environment, such as walls, furniture, and signals from other electronic devices. This interference can cause fluctuations in signal strength, which in turn affects the accuracy of positioning.

**Limitations in Non-Line-of-Sight Environments:** In Non-Line-of-Sight (NLoS) environments, where the target is obstructed, Bluetooth signal attenuation is more severe, further reducing positioning accuracy.

**Multipath Effect:** In indoor environments, Bluetooth signals may propagate through multiple paths to the receiver, leading to the multipath effect. This results in the superposition of received signals, causing positioning errors.

**Limited Distance Resolution:** Bluetooth technology has a limited distance resolution, which means it may not accurately distinguish between different positions at shorter distances.

### 2.7.3 Vision Module

Therefore, we introduce the vision module to build a dual recognition system, to increase the accuracy and reliability. In this module, we primarily use the AprilTag to locate the target, which is also on the wristband/cloth.



Figure 13: Apriltags

**Target Detection and Tracking:** We use the AprilTag system for target detection. AprilTag is a 2D barcode system for object identification and pose estimation, with each tag having a unique pattern that can be recognized from various angles and distances.

**Image Processing and Enhancement:** Preprocess images captured by the camera, such as denoising and histogram equalization, to improve image quality and enhance the recognizability of the tags. Apply image enhancement techniques, such as edge detection and image sharpening, to highlight the features of the tags.

**Distance Estimation:** Combine visual information and the known dimensions of the tags to estimate the distance between the tags and the camera using the geometric relationships of a monocular camera or the disparity information of a stereo camera.

#### 2.7.4 Sensor fusion Algorithm

So far, we got the detailed implementation of two sensors. And what we can know is that the bluetooth can provide quite accurate information of direction and distance of the target, but may be inaccurate at the detailed position, while the vision can provide accurate position of the target and the direction, but poor at the calculation of distance. Therefore, we can pick the most reliable part of two algorithms to build a reliable system.

**Bluetooth Signal Strength for Distance Estimation:** The Bluetooth receiver measures the signal strength (RSSI) and estimates the distance between the target and the receiver based on a known signal attenuation model. This provides a rough estimate of the target's distance.

**Visual Tracking for Direction and Precise Position:** A camera and visual algorithms (such as AprilTag detection) are used to track the position and direction of the target. This provides precise information about the target's position and direction relative to the camera.

**Combining Distance and Direction Information:** By combining the distance estimated from Bluetooth and the direction information from visual tracking, the position of the tar-

get in two-dimensional space can be determined. For example, if Bluetooth estimates the target's distance to be 2 meters and visual tracking shows that the target is directly in front of the camera, it can be inferred that the target is 2 meters in front of the receiver.

### 3 Cost and Schedule

#### 3.1 Cost Analysis

The total cost now is 10371 RMB. Four joint motors from Unitree spent 6400 RMB, almost 50 percent of the total cost. The acrylic boards for iteration don't cost as much as we expected, only around 500 RMB.

Purchase Date	Comment	Manufacturer	Quantity	Price (RMB)	
2024.1.18	Unitree A1 Joint Motor	Unitree	4	1600.0	6400
2024.1.19	TTL to 485 module		4	82.5	330
2024.1.20	Bawl set bearing		12	10.4	124.6
	XIAOMI motor	XIAOMI	2	499.5	999
2024.2.20	DaMiao CAN to USB module	DaMiao	1	185.0	185
2024.2.21	Acrylic Parts-1		15	11.3	170
2024.2.25	CNC Parts		10	92.0	920
2024.2.26	KP035 Bearing		2	88.0	176
2024.2.27	Screws		50	1.2	59.81
2024.3.1	Acrylic Parts-2		5	44.0	220
2024.3.7	M3.5 Screws		10	1.9	19
2024.3.7	55×68×7 Bearing		4	19.1	76.56
2024.3.11	DaMiao wires	DaMiao	10	8.8	88
2024.3.12	Unitree RS485 converter	Unitree	1	200.0	200
2024.3.12	RS485 to TTL modeule		1	5.2	5.17
2024.3.12	Nylon 3D print		9	26.7	240
2024.3.19	UART to RS485 module		1	49.0	49
2024.3.23	TTL to RS485 module		2	17.0	34

Figure 14: Bill of material for current robot



## 3.2 Schedule

Week	Tasks	Person
2024.3.18 - 2024.3.24	CAD modeling	Jiajun Hu
	simulation code test on Webot	Yuhao Wang
	test Aprildetector's performance on single	Yixuan Li
	Test OpenCV algorithms on binocular cam	Xuchen Ding
2024.3.25 - 2024.3.31	Main body assembly	Jiajun Hu
	LQR parameters simulation	Yuhao Wang
	optimize Apriltag's performance and stabilit	Yixuan Li
	Optimize CV tracking on binocular camera	Xuchen Ding
2024.4.1 - 2024.4.7	UART to RS485 module test	Jiajun Hu
	parameter measurement of real robot and	Yuhao Wang
	deploy on robot and test performance, ma	Yixuan Li
	deploy on robot and test performance, ma	Xuchen Ding
2024.4.8 - 2024.4.14	Gyroscope algorithm transplantation	Jiajun Hu
	intergate the algorithms with the motor cor	Yuhao Wang
	deploy on robot and test performance, ma	Yixuan Li
	deploy on robot and test performance, ma	Xuchen Ding
2024.4.15 - 2024.4.21	Remote control code transplanatation	Jiajun Hu
	intergate the algorithms with the motor cor	Yuhao Wang
	deploy on robot and test performance, ma	Yixuan Li
	deploy on robot and test performance, ma	Xuchen Ding
2024.4.22 - 2024.4.28	CAD modele iteration	Jiajun Hu
	intergate the algorithms with the motor cor	Yuhao Wang
	overall vision tracking test	Yixuan Li
	overall vision tracking test	Xuchen Ding

Figure 15: Schedule

## 4 Discussion of Ethics and Safety

### 4.1 Ethical concern

Our design does not interfere with any life-related experiment or social problem. However, military use of robots or any other misuse of our design that intends to turn the helper robot into a killer is against the IEEE Code of Ethics[1]. Therefore, we promise that we will not open-source the Control System and the Sensor Unit.

## 4.2 Safety concern

To prevent injuries resulting from collisions with the human body and to address potential experimental accidents during the assembly process, we will implement a collision detection mechanism for the robot. Additionally, an external emergency shutdown button will be installed to prevent any potential hazards. For safety during our robot test, we utilize a stop trigger on our remote control. By pulling this trigger, all the input signal to our robot will be switched to zero and the robot will be automatically shut down.

## References

- [1] IEEE. "IEEE Code of Ethics." (2016), [Online]. Available: <https://www.ieee.org/about/corporate/governance/p7-8.html> (visited on 02/08/2020).