# ECE 445

SENIOR DESIGN LABORATORY

# FINAL REPORT

# Final Report for ECE 445: Terrain-adaptive bipedal service robot

### <u>Team #2</u>

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# Abstract

This project describes the design and creation of a service robot that is bipedal and capable of navigating across uneven and complex surfaces. The robotic vehicle is intended to enhance mobility in environments that traditional wheeled robots have a hard time dealing with, such as stairs, slopes, and rough outdoor areas. Using feedback from real-time sensors, modular mechanical components, and a reinforcement learning-based motion controller, the robot guarantees consistent and efficient movement. Key attributes include obstacle detection, dynamic balancing, and a user-friendly interface that is designed to be integrated with human intelligence. The project focuses on safety and ethical concerns, including the protection of privacy, the security of data, and environmentally responsible design decisions. By providing dependable, autonomous assistance in both domestic and professional settings, this dual-legged robot provides novel solutions to service problems in human-oriented environments.

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# 1 Introduction

We are developing a well-rounded **terrain-adaptive bipedal robot** that is specifically engineered to smoothly and efficiently navigate diverse and challenging terrains including but not limited to uneven grounds like staircases, slopes, and outdoor areas where unpredictable surfaces may occur.

This document outlines our project's overall problem-solution overview, background rationale, core functionalities, along with the overall benefits, distinctive technical features, and essential performance benchmarks which are required for successful implementation and practical utility.

### 1.1 Purpose

Legged robotic systems, particularly bipedal platforms, are increasingly recognized for their potential to overcome the limitations of wheeled and tracked robots in unstructured environments. Unlike wheeled systems that rely on flat, continuous terrain, bipedal robots can traverse complex features such as stairs, debris, and narrow corridors. However, real-world deployment remains constrained by difficulties in achieving robust, adaptive, and real-time control. Advances in quadrupedal systems—such as the MIT Cheetah 3 and Mini Cheetah—have demonstrated the efficacy of convex model predictive control (MPC) in delivering dynamic and robust locomotion under challenging conditions [1]–[3]. Parallel efforts in humanoid robotics have proposed centroidal dynamics-based whole-body controllers, which enhance both locomotion and manipulation by improving coordination and dynamic balance [4], [5]. Yet, few of these approaches generalize effectively to bipedal systems—particularly compact or low-cost platforms—due to high complexity, expensive actuation, and limited learning-based adaptability.

To address this gap, our project introduces a compact terrain-adaptive bipedal robot that integrates reinforcement learning-based control, proprioceptive feedback, and a streamlined mechanical architecture. Rather than relying on high-fidelity models or costly hardware, our system prioritizes adaptive learning for gait generation and real-time control. Drawing inspiration from centroidal momentum regulation in humanoid systems [4] and unified MPC frameworks for whole-body mobility [5], we combine the predictive power of MPC-style control with the flexibility of reinforcement learning. This hybrid approach enables dynamic gait switching, real-time terrain response, and stable locomotion across a range of environments. Our robot aims to lower the barrier to entry for bipedal locomotion research, offering a scalable and cost-effective platform for academic and applied use cases where adaptability and autonomy are critical.

Specifically speaking, while alternative locomotion architectures were examined—namely multi-legged (e.g., quadruped or hexapod) and wheeled bases—we found each imposes critical trade-offs: adding legs improves static stability on irregular terrain but inflates actuator count, coordination complexity, and continuous power draw, whereas wheels simplify mechanics and excel on smooth surfaces yet falter on steps, loose soil, and highly irregular terrains. Consequently, a compact biped offers the most balanced compromise

between adaptability, efficiency, and system simplicity for the target operational environments.

# 1.2 Functionality

These are the functions of our project, and Figure 1 shows an overview:

- Capability to execute stable, adaptive walking patterns across diverse terrains including stairs, uneven grounds, and outdoor surfaces. The robot must reliably and stably traverse obstacles including steps up to 10 cm high and slopes of up to 15° inclination without losing balance.
- Advanced real-time obstacle detection and autonomous avoidance mechanisms.All sensor processing and control communications must maintain a latency below 30 ms to ensure responsive and accurate control.
- Intuitive, user-friendly interface for straightforward control, monitoring, and interaction.
- Highly modular and expandable design, supporting easy customization and adaptability.
- Robust mechanisms for maintaining balance and quickly recovering from disturbances or impacts. The robot must effectively handle dynamic impacts and disturbances up to 10 N, maintaining stability and operational consistency.



Figure 1: Visual aid of our project.

### **1.3 Subsystem Overview**



Figure 2: The block diagram of our bipedal robot.

The high-level system architecture illustrated in the block diagram 2 is carefully structured to meet the project's mobility, responsiveness, and robustness requirements. The modular division into Mechanical, Electronics, Control Communication, and Power Supply subsystems enables efficient signal flow and isolation of critical functionalities. Realtime proprioceptive feedback from the IMU and encoders is transmitted at high frequency (1 kHz) through low-latency SPI and I2C/UART connections to the Master Board, ensuring that control signal latency remains well below 30 ms. The driver boards operating at 10 kHz enable high-bandwidth torque control for all T-motor joints, which, coupled with timing belt and bearing-supported actuation, allows the robot to handle uneven terrain, 15° slopes, and steps up to 10 cm without balance loss. Furthermore, the teacher-student neural network and ROS-based control structure allow adaptive locomotion, while the mechanical components are reinforced for shock absorption, meeting the system's 10 N impact resilience goal.

### 1.3.1 Description of all Subsystems

The Biped Robot System consists of four modular interconnected subsystems: Mechanical Subsystem, Electronics Subsystem, Control and Communication Subsystem. Each subsystem plays a critical role in enabling the robot to achieve dynamic, terrain-adaptive locomotion using reinforcement learning-based motion control. The mechanical components are lightweight and modular, executing movement through joint actuators and transmission mechanisms, while the electronics subsystem controls actuation and processes real-time sensor feedback. On the other hand, the control & communication subsystem integrates real-time feedback and adaptive decision-making, implementing high-level locomotion algorithms and communication between subsystems.

Notably, our bipedal robot system relies on seamless interaction between its four subsystems to ensure stable and adaptive locomotion. The Mechanical Subsystem receives position, speed signals and torque commands via currents from the Electronics Subsystem, while Encoders provide real-time joint feedback to enable precise motion control. The Electronics Subsystem, centered around the Master Board, processes sensor inputs and encoder feedback, as well as executing motor control commands based on high-level decisions from the Control & Communication Subsystem, which runs neural networkbased motion algorithms and ROS communication module. This tight integration allows the robot to execute smooth gait control, dynamically adapt to terrain variations, and maintain energy efficiency.

# 2 Design

### 2.1 Subsystem Diagrams and Schematics

### 2.1.1 Mechanical subsystem Design



Figure 3: The CAD drawings and corresponding mechanical dimensions for our bipedal robot.



Figure 4: The Fusion CAD model and cross-sectional view of our bipedal robot.

The physical diagrams of our terrain-adaptive bipedal robot highlight the modular mechanical structure, key dimensions, and placement of critical actuators and sensors, as shown in Figures 3 and 4.The full-body CAD drawing presents the robot's overall height of 457.17 mm and width of 277.8 mm, with clearly marked joint axis orientations and angular constraints. The lower diagram showcases the internal mechanical layout of the hip and leg modules, each incorporating T-Motor actuators, timing belts, and bearingsupported shafts for reliable torque transmission. Encoders are mounted at each joint to provide real-time proprioceptive feedback for closed-loop control. The robot features a symmetrical leg configuration with replaceable modular components, supported by a 3Dprinted structural shell. These physical design choices ensure structural integrity, ease of maintenance, and precise actuation, satisfying the requirements for adaptability and stability on complex terrain.

### 2.1.2 Circuit Diagram

The circuit diagram 5 6 7 8shows the design for both our Electronics subsystem and ControlCommunication subsystem. These two subsystems have overlapping parts, but as mentioned before, each plays a different and important role.



Figure 5: Circuit diagram of our master board.



Figure 6: Circuit diagram V1 of our driver board.



Figure 7: Circuit diagram V2 of our driver board.



Figure 8: Circuit diagram V3 of our driver board.

### 2.2 Subsystem Diagram Descriptions

#### 2.2.1 Mechanical Subsystem

The mechanical subsystem forms the structural and actuation foundation of the robot. It includes the body module, hip, upper leg (U-leg), and lower leg (L-leg) modules. The body is a lightweight 3D-printed shell designed to house all electronics and ensure structural support, with dimensions of 277.8 mm (width) × 457.17 mm (height) (Figure 2, Figure 3). Each hip and leg module uses high-torque T-Motor actuators to produce motion through a belt-driven transmission system. The actuation is supported by low-friction bearings and precision-machined shafts to ensure smooth mechanical response. Encoders mounted at each joint provide real-time feedback on position and velocity, enabling closed-loop control required for maintaining balance and stability.

The leg architecture is symmetrical and modular, supporting dynamic gait planning and robust adaptation to variable terrains. Modules are mounted using standardized mechanical interfaces, enabling quick replacement and repair. All mechanical joints are designed to sustain external disturbances up to 10 N, with angular travel constraints marked in the design drawings (Figure 2) to prevent over-rotation and damage. The subsystem's precise geometry and material choices directly contribute to the robot's ability to meet mobility (10 cm steps, 15° slopes), resilience (10 N disturbance), and real-time stability performance goals.

Figure 9 shows the simulation of our bipedal robot in MuJoCo, a high-performance physics engine for simulating articulated multi-body systems with contact dynamics, based on a URDF model generated from CAD data with accurate mass center and inertia properties. All the related URDF data is shown in Table 1.



Figure 9: Simulation of our biped robot in MuJoCo

Link	Mass (kg)	Origin (xyz)	Ixx	Ixy	Ixz	Іуу	Iyz	Izz
BASE_LINK	0.61437	0 0 0	0.00579	0.00000	0.00000	0.01938	0.00000	0.02476
FL_SHOULDER	0.14004	0.01708256 -0.00446892 -0.01095830	0.00007	0.00000	0.00002	0.00014	-0.00001	0.00009
FL_UPPER_LEG	0.14854	0.00001377 0.01935853 -0.11870700	0.00041	0.00000	0.00000	0.00041	-0.00005	0.00003
FL_LOWER_LEG	0.03117	0.0 0.00836718 -0.11591877	0.00011	0.00000	0.00000	0.00012	-0.00000	0.00000
FL_FOOT	0.00010	0 0 0.00035767	0.00000	0.00000	0.00000	0.00000	0.00000	0.00000
FR_SHOULDER	0.14004	0.01708233 0.00447099 -0.01095846	0.00007	-0.00000	0.00002	0.00014	0.00001	0.00009
FR_UPPER_LEG	0.14854	-0.00001377 -0.01935853 -0.11870700	0.00041	0.00000	-0.00000	0.00041	0.00005	0.00003
FR_LOWER_LEG	0.03117	0.0 -0.00836718 -0.11591877	0.00011	0.00000	0.00000	0.00012	0.00000	0.00000
FR_FOOT	0.00010	0 0 0.00035767	0.00000	0.00000	0.00000	0.00000	0.00000	0.00000

Table 1: Complete Link Inertial Properties from URDF

Body Module: Provides structural support for all modules.

*Components:* 3D-printed shell with high-toughness resin, which offers superior mechanical strength. This material is particularly well-suited for our robot structure, which includes screw-locking mechanisms and requires high surface strength for structural stability. .

Interfaces: Holds Master Board, IMU, and power; links to motor joints.

**Leg and Hip Modules:** Drive robot motion via torque-controlled motors. *Components:* 

• T-Motors (U-leg/L-leg): stable torque output

- Encoders: real-time torque feedback
- Timing Belts and Bearings: reduce friction

*Interfaces:* T-motors receive position, speed, torque commands; encoders send torque feedback as current.

#### **Mechanical Stress and Torque Analysis**

To validate the mechanical feasibility of our leg design, we conducted simplified analytical calculations focusing on joint torque requirements and impact response.

**Maximum Joint Torque Estimation.** Assuming the robot is required to step onto a 10 cm high platform with one leg fully extended while bearing the full body weight (approximately 1.43 kg), the hip joint will experience a worst-case static torque:

$$\tau_{\max} = m \cdot g \cdot l = 1.43 \text{ kg} \cdot 9.81 \text{ m/s}^2 \cdot 0.1 \text{ m} = 1.40 \text{ Nm}$$

Our T-Motors are rated with peak torque  $\geq$  6 Nm and continuous torque > 3.5 Nm, satisfying this requirement with a large safety margin under worst-case conditions. Additional safety is provided via gear reduction and low-friction bearings.

**Impact Tolerance under 10 N Lateral Disturbance.** To assess the response to side impacts, we model the leg structure as a cantilever beam subjected to a 10 N lateral force at the foot. With an effective leg length of 0.4 m and cross-sectional stiffness modulus  $E = 2.1 \times 10^9$  Pa (for reinforced resin), the maximum tip deflection is estimated as:

$$\delta = \frac{F \cdot L^3}{3EI} \approx 0.85 \text{ mm}$$

This deflection is well within tolerances for gait stability ( $\leq 5$  mm), confirming that our frame can absorb shock while maintaining structural integrity. The assumption is further supported by simulation results from MuJoCo showing negligible tilt or deformation during side-force tests.



Figure 10: Flow chart for mechanical subsystem

### 2.2.2 Electronics Subsystem

The electronics subsystem serves as the core of data processing, motor control, and intermodule communication within the robot. It includes the Master Board (ESP32), three custom driver boards (one corresponds to two T-motors), and an IMU module, which is loaded onto our robot.

The Master Board is based on an ESP32 microcontroller, which receives sensory input, processes high-level control commands, and sends out motor actuation signals. It communicates with the PC through Ethernet using TCPROS for real-time visualization and control integration. It also receives motion commands from the TSNN (Teacher-Student Neural Network) module via Ethernet, and relays those commands to the driver boards through high-speed SPI. Meanwhile, real-time joint feedback from the driver boards is

sent back to the ESP32 over the same SPI bus, completing the closed-loop control path.

Each driver board receives low-level motor control commands (position, speed, torque) from the Master Board and regulates the T-Motor outputs accordingly. These boards are also responsible for processing encoder feedback signals, measuring motor current, and providing short-circuit protection. The current feedback loop enables precise motor control essential for terrain-adaptive gait stabilization.

The IMU provides real-time orientation and acceleration data, which is critical for balance control and high-level decision making. It connects to the PC via UART with the baud rate of 460800 bps. The IMU serves as the primary proprioceptive sensor that enables fast reactive control in dynamic and unstable terrain environments.

Together, the master board, driver boards, and IMU form a tightly coupled electronics subsystem that supports real-time, high-frequency sensing and control. This architecture enables low-latency (< 30 ms) feedback loops, precise joint-level control, and seamless integration with the reinforcement learning-based control framework running on the PC.

The circuit schematic for master board is shown in Figure 5, while the circuit schematics for driver boards are shown in Figure 6, 7, 8, which are combined as a complete version.

**Master Board (ESP32):** Processes sensor feedback and drives motors.

Interfaces:

- IMU  $\rightarrow$  PC (UART/USB converter)
- TSNN signals  $\rightarrow$  ESP32 (Ethernet)
- Feedback SPI ← Driver boards (F.B.)

Driver Boards: Control motor output.

Interfaces: SPI to ESP32; T-Motor control and encoder feedback via current.

**IMU (YIS320):** Provides high-frequency orientation and motion state estimation. *Interfaces:* Connected to PC via UART-to-USB; publishes data to ROS topic via official driver.

### Communication Verification and Data Rate Analysis

To verify system communication integrity and latency, we utilize the official Master Board SDK, which includes a PD control loop example to test the full communication stack: the PC sends motion commands via Ethernet to the Master Board (ESP32), which in turn controls the driver boards via SPI to actuate the motors. This test confirms correct Ethernet and SPI interfacing and ensures the closed-loop response of the hardware chain.

For the IMU module (YIS320), we use a UART-to-USB adapter to connect it directly to the PC. Sensor data is streamed using the official Yesense ROS driver package. The driver is launched via ./run.sh, and users can monitor the output using rostopic echo

/yesense/sensor\_data. The IMU publishes 3-axis acceleration, angular velocity, Euler angles, quaternions, and attitude estimates at 1 kHz. Additional visual verification can be done using the Yesense Manager software.

Given the SPI communication rate of 10 kHz between the Master Board and Driver Boards, and the 1 kHz IMU update frequency, the complete sensor-actuator loop operates well within the target control loop latency of (< 30 ms), satisfying the high-level requirement.figure 11 shows the entire process.



Figure 11: Flow chart for electronics subsystem.

### 2.2.3 Control and Communication Subsystem

The control and communication subsystem is responsible for generating adaptive locomotion actions and maintaining real-time coordination across all robot components. At its core, the PC functions as the ROS Master, running all control software and acting as the central node for publishing and subscribing to motion commands. Communication between the PC and the Master Board occurs through Ethernet using TCPROS, with control signals issued at a frequency of 100 Hz to maintain low-latency updates throughout the system.Figrue 13 shows the system flow chart.

Locomotion policies are generated using a neural network controller trained in simulation. This controller was developed through reinforcement learning in Isaac Gym, where a customized URDF model of the robot was imported, including modified meshes and physical parameters. Training followed a curriculum learning approach, where terrain difficulty gradually increased across 20,000 epochs with 5000 bipedal agents, optimizing a reward function shaped for stability and terrain adaptability. The final policy was exported and deployed in the MuJoCo simulation environment by converting the trained URDF model into an XML format, augmenting it with actuator definitions, terrain inputs, and IMU site annotations to ensure compatibility.

To maintain consistency between the training and deployment environments, actuator gains, torque limits, and terrain maps were carefully matched to those used during training. The terrain was represented as an  $11 \times 11$  point grid, and key parameters were extracted from the Isaac Gym config files. ROS-based execution scripts running the trained policy communicate with the physical or simulated system by taking in IMU and encoder data as input observations and outputting joint torques or high-level motion targets. Diagnostic data such as policy observations, terrain state, and gain parameters can be logged or printed for verification, and latency across the entire control loop has been confirmed to remain under 30 ms, meeting real-time operational requirements.

The simulation situation in Isaac Gym and MuJoCo is shown in Figure 12 and Figure 9.



Figure 12: Simulation of our bipedal robot in Isaac Gym.

**PC (ROS Master):** Runs locomotion learning algorithms. *Interfaces:* Ethernet TCPROS to Master Board.

**TSNN Controller:** Executes real-time adaptive motion control. *Interfaces:* Uses IMU + encoder input; sends action commands to PC.

### **Control Frequency and Policy Latency Analysis**

The control system sends commands from the PC to the Master Board at 100 Hz, with a control update every 20 ms. The Master Board actuates motors via SPI at 10 kHz, and the IMU updates at 1 kHz. Overall, the latency from state observation to action execution is empirically under 30 ms.

In Isaac Gym, the policy was trained over 20,000 epochs using 5000 parallel robot instances. Each update took about 0.25 seconds with GPU acceleration, allowing convergence within 8 hours.

### Measurement and Verification Method

We verify the policy by loading the trained .pt model into the MuJoCo deployment script, where the XML-converted URDF matches the training setup. During runtime, we print terrain values, joint positions, and control outputs to check correctness. Latency is measured from observation input to motor command using Python timers or ROS timestamps. Pose and terrain mismatches are fixed through visual debugging and parameter tuning, ensuring stable deployment.



Figure 13: Flow chart for Control and Communication Subsystem.

# 3 Cost Analysis

# 3.1 Bill of Materials (BOM)

Part #	Mft	Desc	Price (RMB)	Qty	Total (RMB)
AK60-6	T-MOTOR	High torque actuator	799 per 2	6	2397
AS5047P + wheel	Ruiboyi + Shengxin	Magnetic encoder + aluminum wheel	70	6	420
YIS320	Yesense	9-axis IMU	680	1	680
Custom Shell	Meiyicheng	SLA 3D-printed body (resin)	300	1	300
ET2520 2Z VA	BNTB	Hip AA bearing (25×20×4 mm)	20	6	120
Custom Belt	Dingsheng	Timing belt for joints	25	6	150
Subtotal					4067

### Table 2: BOM: Mechanical Components

### Table 3: BOM: Electronics Components

Part #	Mft	Desc	Price (RMB)	Qty	Total (RMB)
Driver Board	IEO Tech	BLDC motor controller	1170	5	5850
Master Board	IEO Tech	Motor and sensor communication hub	580	1	580
Battery Pack	Huiwei Dianyuan	24V Li-ion (borrowed)	653.8	1	653.8
Misc. Electron- ics	Zhuohua	Connectors, wires, converters	100	1	100
Subtotal					7183.8

Part # / Name	Mft	Desc	Price (RMB)	Qty	Total (RMB)
M3×8 Screws (Body)	Xiangyun	Socket Head, steel	0.10	18	1.80
M3×8 Screws (Hip AA)	Xiangyun	Socket Head, steel	0.10	6	0.60
M2.5×25 Screws	Xiangyun	Socket Head, steel	0.10	4	0.40
M2×5 Screws	Xiangyun	Socket Head, steel	0.10	2	0.20
M2×20 Screws	Xiangyun	Socket Head, steel	0.10	2	0.20
M2.5×16 Plastic Screws	Xiangyun	Slotted screw for IMU/Encoder	0.15	15	2.25
M3×4.5 mm Helicoil	Xiangyun	Thread insert	0.20	24	4.80
M2.5×3.75 mm Helicoil	Xiangyun	Thread insert	0.20	4	0.80
Subtotal					11.05

Table 4: BOM: Fasteners and Inserts

### 3.2 Labor Costs

Table 5: Estimated Average Labor Cost for Each Team Members

Name	Hourly Rate (RMB)	Hours	Sub-total (RMB)
Member 1	30	240	7200
Member 2	30	240	7200
Member 3	30	240	7200
Member 4	30	240	7200
Total Labor Cost		960	28,800

### 3.3 Grand Total

 $Grand \ Total \ Cost = Material \ Costs + Labor \ Costs$ 

For this project, we add the total material cost (Total Material Cost = 4658.05 RMB) to the labor costs (28, 800 RMB):

Grand Total Cost = 11,261.85 (material) + 28,800 (labor) = 40,061.85 RMB

Note: The battery pack is a free lab resource, so no cost is included for this part.

# 4 Project Schedule

The comprehensive weekly schedule below provides a detailed breakdown of individual responsibilities and key tasks leading up to our project's final demonstration after April 12.

Week of	Yuan Zhou	Zihao Ye	Gaokai Zhang	Binhao Wang
4/12	Integrate IMU, Master Board & PC	Integrate IMU, Master Board & PC	Adjust joint actu- ator range	Setup hardware for joint adjust- ments
4/19	Deploy models, initial field test- ing	Teacher-Student model training	Develop basic auto-following	Verify hardware communication
4/26	Debugging, performance optimization	Model refine- ment and debug- ging	Code integration for vision	Code integration
5/3	Comprehensive testing and sys- tem debugging	Complete train- ing and optimize models	Refine face track- ing and recogni- tion algorithms	check the fun- cion of the communication
5/10	Final system tuning and opti- mization	Final model adjustments and optimization	Final integration of the camera	Test the function of the vision and recognition
5/20	Final simulation deployment	Final test for sim to real	Complete poster production	Complete the production of the presentation video

Table 6: Weekly Responsibilities Schedule for Project Members

# 5 Requirements and Verification

### 5.1 Completeness of Requirements

### 5.1.1 Tolerance Analysis

To achieve stable terrain-adaptive locomotion, each subsystem must meet specific error tolerances. This section evaluates the Mechanical, Electronics, and Control & Communication subsystems using quantitative analysis and modeling. The Control & Communication subsystem, with the strictest requirements, is examined in more detail.

### 1. Mechanical Subsystem

The mechanical subsystem must provide structural stability and precise transmission. Errors in mechanical alignment or deflection can propagate to trajectory deviation and instability.

### **Tolerances:**

- Joint misalignment tolerance:  $\pm 1.5^{\circ}$
- Foot-end deformation tolerance:  $\pm 1.5 \,\mathrm{cm}$

### **Beam Deflection Analysis:**

We approximate each leg segment (e.g., U-leg or L-leg) as a cantilever beam under torque. The maximum angular deflection of a hollow beam under torsion is:

$$\theta = \frac{TL}{GJ}$$

Where: - T = 1 Nm (applied torque at the joint) - L = 0.2 m (length of a single leg segment) -  $G = 2.5 \times 10^9$  Pa (shear modulus for high-toughness resin) -  $J = 5 \times 10^{-9}$  m<sup>4</sup> (torsional constant)

Then:

$$\theta = \frac{1 \cdot 0.2}{2.5 \times 10^9 \cdot 5 \times 10^{-9}} = 0.016 \, \mathrm{rad} \approx 0.92^{\circ}$$

This result shows that even under 1Nm of torque, the angular deflection per joint remains within  $\pm 1.5^{\circ}$  tolerance, ensuring mechanical stability of the structure during locomotion.

### 2. Electronics Subsystem

Electronics must maintain reliable data acquisition and command transmission within tight time and resolution limits.

### **Tolerances:**

• Encoder resolution error:  $\leq 1 \text{ count} = \pm 0.088^{\circ}$ 

- IMU sampling jitter:  $\leq 2\%$
- Signal delay:  $\leq 30 \, \mathrm{ms}$

#### Angular Error Due to Encoder Resolution:

With 4096 counts per revolution (T-Motor default), angular resolution is:

$$\Delta \theta = \frac{360^{\circ}}{4096} \approx 0.088^{\circ}$$

For a leg length of  $L = 0.4 \,\mathrm{m}$ , this translates to foot-end error:

$$\Delta x = L \cdot \sin(\Delta \theta) \approx 0.4 \cdot \sin(0.088^\circ) \approx 0.4 \cdot 0.00154 \approx 0.62 \,\mathrm{mm}$$

This is negligible relative to the  $\pm 5 \,\mathrm{cm}$  locomotion margin.

#### IMU Jitter Impact on Orientation:

Assuming nominal roll/pitch of 15°, a 2% noise gives:

$$\Delta \phi = 0.02 \cdot 15^\circ = 0.3^\circ$$

Which is well below the  $\pm 3^{\circ}$  requirement.

#### 3. Control & Communication Subsystem

This subsystem governs gait generation via a reinforcement learning policy. Its precision determines overall trajectory and balance.

**Tolerances:** The control system must maintain a CoM trajectory deviation within  $\pm 5$  cm, orientation stability within  $\pm 3^{\circ}$ , and torque variance under  $\pm 10\%$ .

#### Pendulum Model Analysis:

Torque deviation of  $\Delta \tau = 0.5 \,\mathrm{Nm}$  causes angular acceleration:

$$\alpha = \frac{\Delta \tau}{I}, \quad I = \frac{1}{3}mL^2 = 0.1067 \,\mathrm{kg} \cdot \mathrm{m}^2, \quad \alpha \approx 4.69 \,\mathrm{rad/s^2}$$

Angular deviation in 100 ms:

$$\Delta \theta = \frac{1}{2} \alpha t^2 = 0.0235 \, \mathrm{rad} \approx 1.35^\circ$$

And CoM shift:

$$\Delta x = L \cdot \sin(\Delta \theta) \approx 0.4 \cdot 0.0235 = 0.94 \,\mathrm{cm}$$

Both within specified bounds. MuJoCo simulation confirms real-time policy execution maintains stable motion under these uncertainties.

# 5.2 Verification Procedures and Quantitative Results

# 5.2.1 Mechanical Subsystem

Requirement	Verification Method	Pass Criteria
The hip joint must provide at least 2 Nm of torque under full body weight loading.	Mount the leg on a test rig; apply simulated body weight (1.43 kg) at 10 cm offset; mea- sure static torque output with a torque sensor.	Measured torque $\ge 2 \text{ Nm}$
Each motor must output continuous torque $\geq$ 3.5 Nm and peak torque $\geq$ 6 Nm.	Drive the T-Motors through a test cycle using the lab power supply and controller; record torque using inline torque sensor.	Torque output sustained above 3.5 Nm continuous and peaks at $\geq 6$ Nm
The leg structure must withstand a 10 N lateral impact with tip deflection $\leq$ 5 mm.	Apply 10 N lateral force at the foot tip using a force gauge; measure tip displace- ment with a dial indicator or motion capture.	Deflection ≤ 5 mm
The mechanical frame must exhibit no permanent de- formation under 10 N side load.	Apply and release 10 N side force repeatedly; inspect structure visually and with calipers.	No visible deformation or resid- ual strain
Encoder feedback must resolve joint angle within 0.1°.	Rotate joint in 0.1° steps using calibrated input signal; compare encoder readout.	Encoder output matches command steps with $\leq 0.1^{\circ}$ error
Leg module must be removable and reassembled within 10 minutes using standard tools.	Time the disassembly and reassembly process under supervision using provided tools.	Complete process within 10 minutes without damage

Table 7: Requirements and Verification Table: Mechanical Subsystem

# 5.2.2 Electronics Subsystem

Table 8: Requirements and	Verification	Table:	Electronics	Subsystem
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Requirement	Verification Method	Pass Criteria
Master Board must successfully receive and transmit Ethernet packets from PC at $\geq$ 100 Hz.	Use Master Board SDK PD control example; monitor round-trip com- mand/response using logic analyzer or debug serial.	Latency per command- response < 0.2 ms, no packet loss over 30 s
Master Board must send control com- mands to Driver Boards over SPI at $\geq$ 20 kHz.	Scope SPI lines using logic analyzer; measure command frequency and timing jitter.	Verified SPI frequency $\geq$ 10 kHz with jitter < 0.5 ms
Driver Boards must actuate motors based on received torque commands.	Observe motor response to command inputs via PD ex- ample; confirm motor rota- tion and smooth ramp-up.	Motors follow command with no oscillation or delay
IMU must pro- vide acceleration, orientation (Eu- ler/Quaternion), and angular velocity at 1 kHz.	Launch Yesense ROS driver via ./run.sh; monitor data with rostopic echo /yesense/sensor_data.	Data is continuously pub- lished at 1 kHz with valid val- ues
ROS node must pub- lish all required IMU fields (acceleration, Euler angles, etc.) to a ROS topic.	Use rostopic echo /yesense/sensor_data and check output over 10 seconds.	Each expected field is present and updating in real time
System control loop latency must remain below 10 ms from PC to motor output.	Use timestamped Ethernet + SPI logging from SDK; calcu- late total delay across stack.	Total latency $\leq 30 \text{ ms}$

# 5.2.3 Control & Communication Subsystem

Requirement	Verification Method	Pass Criteria
PC must send high- level commands to Master Board at $\geq$ 100 Hz	Use ROS timestamp logging to record command publication rate	Average publish rate $\geq$ 100 Hz with jitter < 2 ms
Reinforcement learn- ing policy must ex- ecute with total la- tency < 10 ms from observation to action	Use Python timer to record in- ference time for each step	Average loop duration < 10 ms for 1000 consecutive steps
Policy must output valid torques in Mu- JoCo simulation	Print action vector after policy step; check for NaNs and unrea- sonable values	All values in torque vector are finite and within expected range ( $\pm 5$ Nm)
Trained policy must remain stable when deployed on terrain identical to training	Run policy in MuJoCo over de- fault terrain grid; observe robot for 30 seconds	Robot does not fall or enter failure state within 30 sec- onds
Terrain input must match training setting $(11 \times 11 \text{ grid})$	Print terrain input inside pol- icy function; compare with Isaac Gym config	Printed grid matches $11 \times 11$ points defined in training config
Trained policy must correctly load from file and run end-to- end in MuJoCo	Load policy via script; print con- firmation; visualize in MuJoCo	Policy runs without error, and robot begins moving in simulation

Table 9: Requirements and Verification Table: Control & Communication Subsystem

# 6 Conclusion

### 6.1 Accomplishments

In this work, we demonstrated that, when the robot is suspended, its six motors reliably follow predefined trajectories under our commands. Real-time communication over Ethernet achieved a round-trip latency of just 0.2 ms for 127-byte messages, meeting our timing requirements.

After training a neural network policy in simulation, we deployed it on the physical (suspended) platform, enabling adaptive motion through learned control. Mechanical robustness was validated by torque and impact tests—withstanding 10 N of lateral force without damage—and the modular design allowed leg assembly in under ten minutes. We also developed and tested a vision module for real-time human detection, laying the groundwork for future autonomous tracking.

Although full independent walking has not yet been achieved, we reached several important milestones and established a solid foundation for further enhancements.

### 6.2 Uncertainties

Although the final system achieved locomotion under controlled conditions, several uncertainties were observed that impacted the performance of the deployed policy, particularly when transferring from simulation to the physical robot.

### 1. Weight Increase and Center of Mass Shift

The robot was initially designed to weigh **1.43 kg**, but the final version weighed about**1.53 kg** due to extra structural reinforcement and wiring. This caused the center of mass to shift upward, which affected balance and led to a larger *sim-to-real gap*. As a result, the trained policy could not control the robot stably during walking.

### 2. Control Delay in Torque Transmission

In simulation, torque is applied instantly. In reality, it passes from the PC  $\rightarrow$  Master Board  $\rightarrow$  Driver Board  $\rightarrow$  Motor through multiple steps. This causes a delay of up to **10 ms**, as described in Section 2.2.2. The delay weakens the real-time response and reduces control accuracy, especially during fast gait changes.

#### 3. IMU Drift

Over time, the IMU showed some bias drift, especially in pitch and roll angles. The error could grow to around **2–3 degrees**, which affected balance when walking on slopes or uneven ground.

### 4. Motor Nonlinearity at Low Torque

During fine movement, the motors did not respond smoothly due to *nonlinear behavior* at low input current. The trained policy did not consider this, which sometimes led to small jerky movements or delays. These issues explain why the policy worked well in simulation but performed worse on the real robot.

### 6.3 Future works

Our next step will be to integrate the independently developed visual recognition module onto the robot platform. This will involve mounting a camera directly onto the robot, establishing stable communication between the vision module and the robot's control system, and ensuring seamless integration with existing motion control algorithms.

Additionally, we plan to incorporate a distance measurement feature into the visual recognition module. This enhancement will enable the robot to determine the precise distance to a detected individual, significantly improving tracking accuracy and interaction capabilities. By accurately assessing distance, robot will be able to autonomously follow individuals more reliably, offering enhanced functionality in practical service scenarios.

These improvements will further enhance our robot's ability to interact effectively within dynamic environments and provide more comprehensive and adaptive services to users.

### 6.4 Ethical Considerations

### 6.4.1 Privacy and Data Security

Our terrain-adaptive bipedal service robot uses multiple sensors, including cameras and IMUs, for effective navigation. Following the IEEE and ACM Codes of Ethics [6], [7], we prioritize privacy and data security through strict access controls, encryption, and on-device processing. All data will be used solely for operational purposes, with no personally identifiable information stored or transmitted beyond what is necessary.

### 6.4.2 Professional Ethics Compliance

Our team will observe IEEE and ACM ethical frameworks, ensuring that our project prioritizes safety, fairness, and accountability [6], [7]. Additionally, as mandated by ECE 445 Ethical Guidelines, we will go beyond compliance with professional ethics codes and reflect deeply on the broader societal impacts of our project [8]. We will actively avoid conflicts of interest, ensure fair credit allocation for contributions, and strictly adhere to anti-discrimination policies, ensuring equity and inclusion in our team's decision-making process.

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