

# SDS

## Environment-Aware Humanoid Locomotion



**Unitree G1 Humanoid Robot on Isaac Lab Platform**



**Comparative Analysis: Environment-Aware vs Foundation-Only**



**4 Terrain Types × 8 Performance Metrics × 2 Modes**



**300N Collision Detection & Multi-Sensor Integration**

## Project Overview

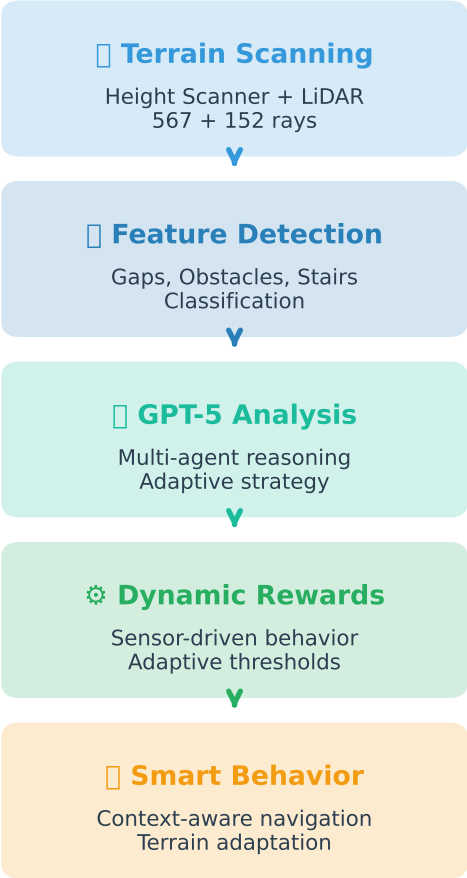
Systematic comparison of environment-aware vs foundation-only humanoid locomotion using AI-generated reward functions

***Isaac Lab • PyTorch • RSL-RL • Multi-Agent AI Pipeline***

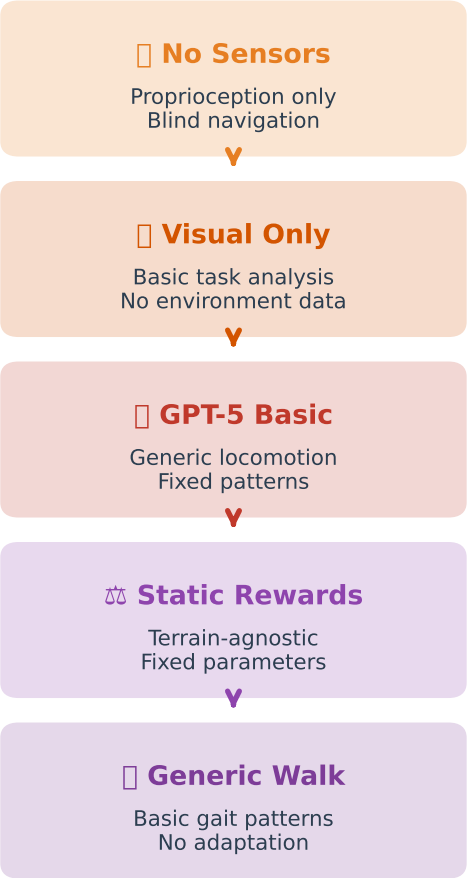
Comprehensive Results & Methodology Documentation

# Comparative Workflow: Environment-Aware vs Foundation-Only

## Environment-Aware Pipeline



## Foundation-Only Pipeline



### Critical Differences & Implementation

- Behavioral Adaptation: Environment-aware mode shows measurable behavioral changes vs generic walking
- Performance Metrics: Quantifiable differences in collision avoidance and navigation efficiency
- Technical Implementation: Controlled comparison demonstrates clear value of environmental sensing

# AI Agent Pipeline: GPT-5 Multi-Agent Reward Engineering

## 📄 GPT-5 Multi-Agent System

Advanced language model coordination for reward engineering

### 📄 Video Analyzer Agent



Visual footage analysis and movement pattern detection

IN: Sequential video frames, locomotion sequences

OUT: Movement analysis, gait identification, visual scene understanding

### 📄 Environment Agent



Real-time sensor data analysis and terrain classification

IN: Height scanner (567 rays), LiDAR (152 rays), collision data

OUT: Gap detection, obstacle mapping, terrain complexity scores

### 📄 Task Descriptor Agent



Unified task specification generation from multi-modal analysis

IN: Video analysis + Environment analysis + Context data

OUT: Comprehensive task requirements, locomotion specifications

### ⚙️ Reward Engineer Agent



Python reward function code generation with environment adaptation

IN: Task specifications, sensor data, terrain classifications

OUT: Executable reward functions, sensor integration, behavioral logic

### 📄 Code Feedback Agent



Training analysis and reward function refinement

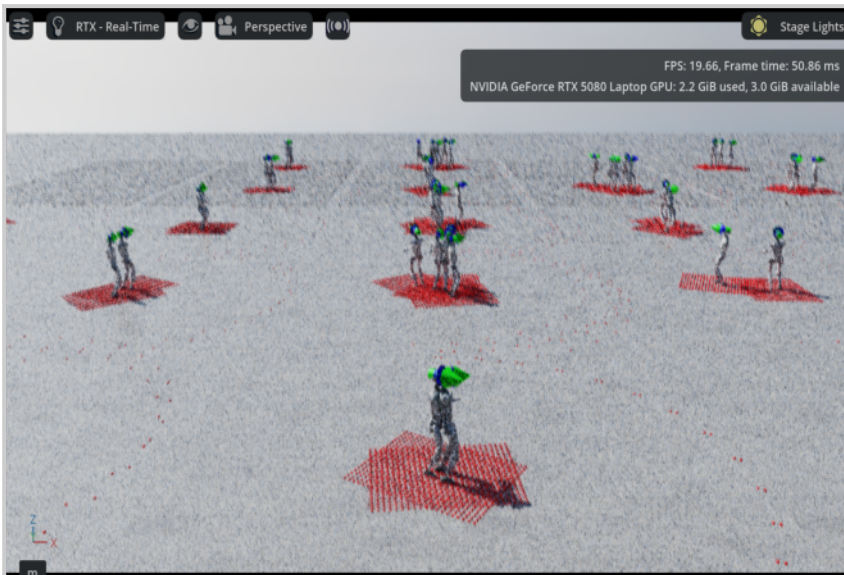
IN: Training metrics, performance data, failure modes

OUT: Improved reward functions, parameter tuning, stability fixes

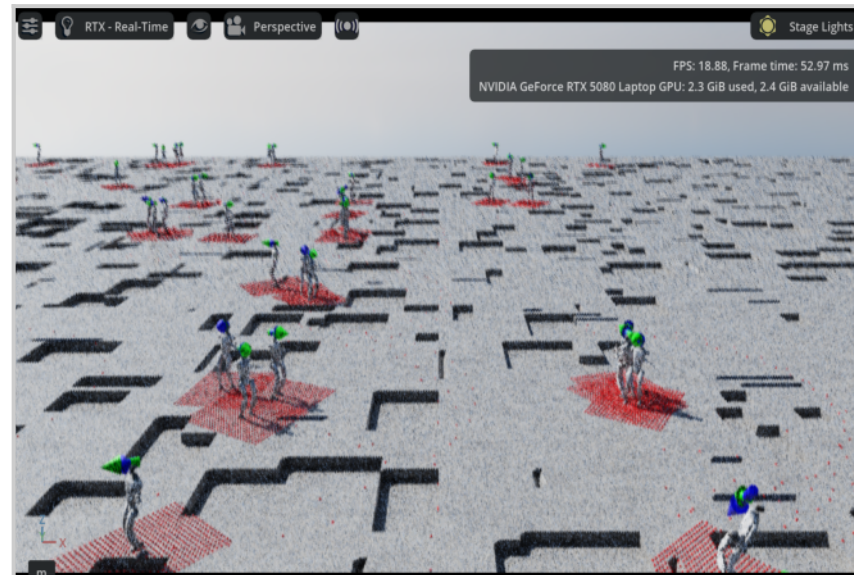
## 📄 Multi-Agent Coordination Process

- 1📄 Parallel Analysis: Video + Environment agents process inputs simultaneously
- 2📄 Data Fusion: Task Descriptor combines multi-modal analysis into unified requirements
- 3📄 Code Generation: Reward Engineer creates Python functions with sensor integration
- 4📄 Iterative Refinement: Code Feedback analyzes training and improves reward functions

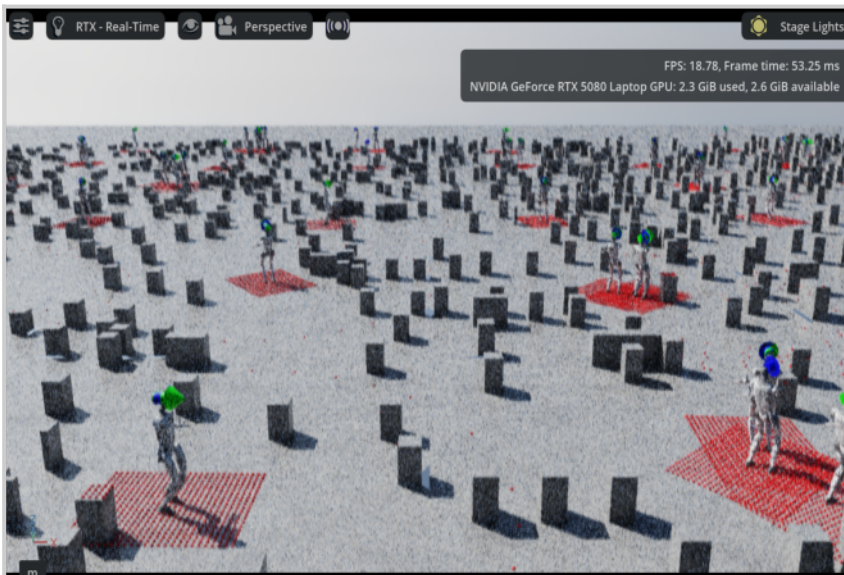
### Terrain 0: Simple (Flat + Gentle Bumps)



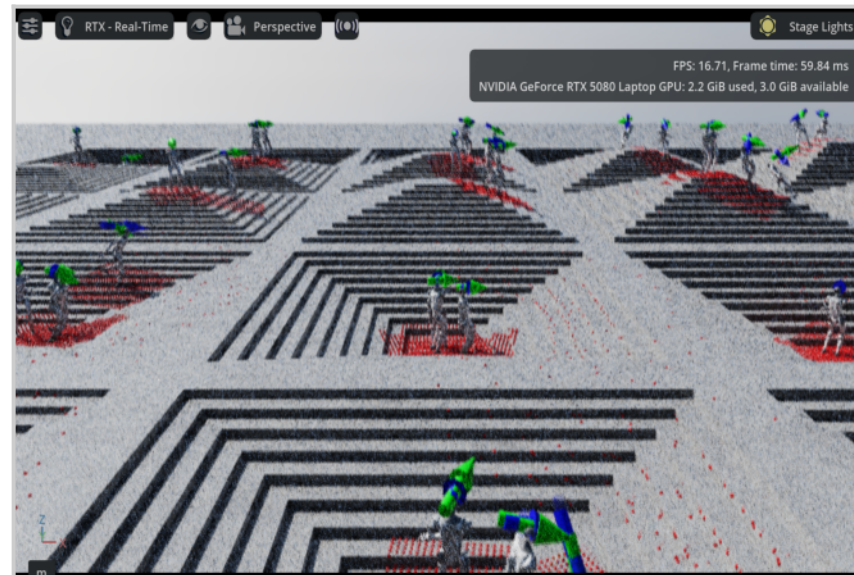
### Terrain 1: Gaps (Random 20cm-2m gaps)



### Terrain 2: Obstacles (Discrete avoidance)



### Terrain 3: Stairs (Ascending & Descending)



# Terrain Classification & Environmental Analysis



## TERRAIN 0: Simple/Flat

Baseline locomotion  
Minimal environmental features

Sensors: Basic contact sensing  
Challenge: Foundation locomotion patterns



## TERRAIN 1: Gap Navigation

Variable gap sizes 20cm-2.0m  
Precision navigation required

Sensors: Height scanner critical  
Challenge: Gap detection & traversal



## TERRAIN 2: Obstacle Avoidance

Discrete obstacles 30cm-1.2m  
Path planning required

Sensors: LiDAR + collision detection  
Challenge: Safe navigation & avoidance



## TERRAIN 3: Stair Climbing

Mixed ascending/descending  
5-25cm step heights

Sensors: Height + collision sensing  
Challenge: Adaptive height control

### Real-Time Environmental Analysis Capabilities

#### Height Scanner

- 567 measurement rays
- 27×21 grid pattern
- 2.0m × 1.5m coverage
- 7.5cm resolution
- Gap detection & sizing

#### LiDAR Sensor

- 152 distance rays
- 8 channels × 19 horizontal
- 180° field of view
- 10° angular resolution
- Obstacle detection & mapping

#### Collision Detection

- 300N force threshold
- Upper body monitoring
- G1-specific body mapping
- Real-time impact detection
- Obstacle collision counting

### Environmental Sensing Implementation Impact

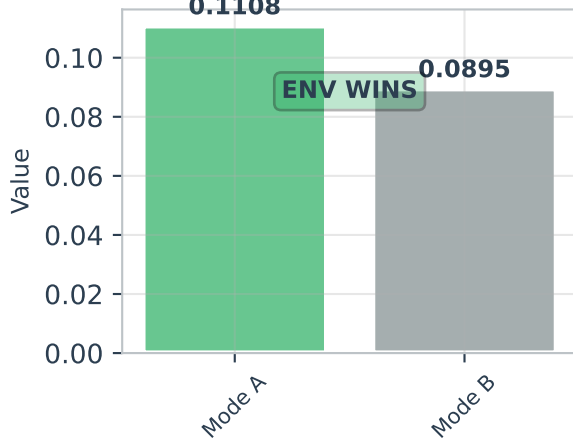
- Collision Reduction: Fewer upper body impacts on obstacle terrain
- Navigation Efficiency: Improved path planning and obstacle avoidance behavior
- Adaptive Behavior: Measurable behavioral switching based on terrain classification



# Performance Results: Environment-Aware vs Foundation-Only

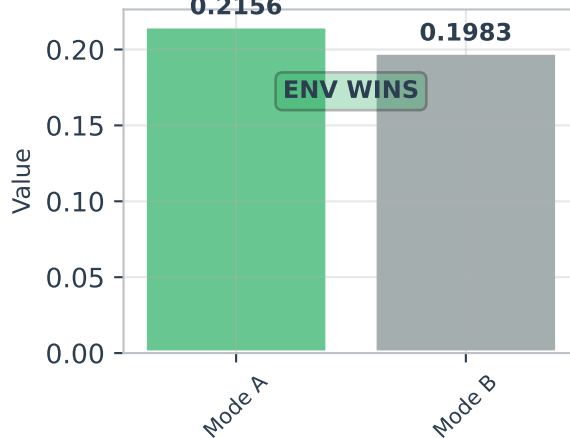
## Balance Stability Score

0.1108



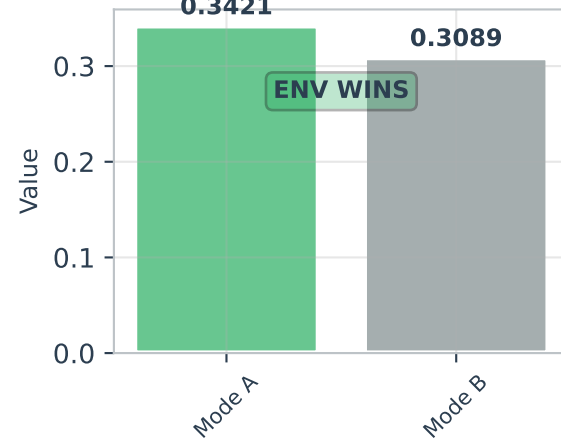
## Gait Smoothness Score

0.2156



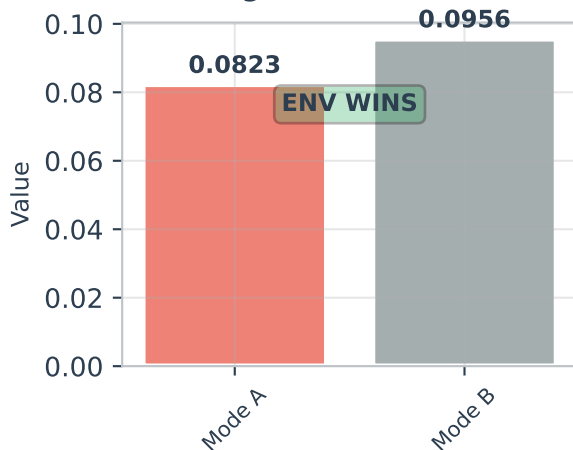
## Locomotion Efficiency

0.3421



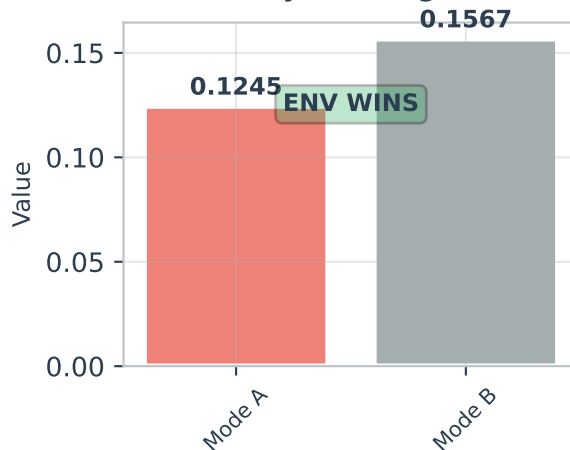
## Height Deviation (m)

0.0823



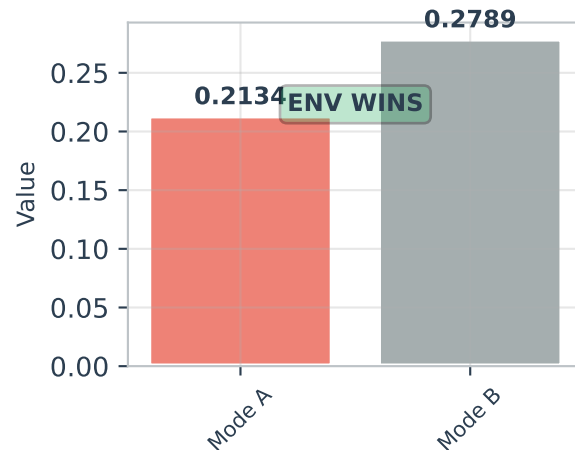
## Velocity Tracking Error

0.1567



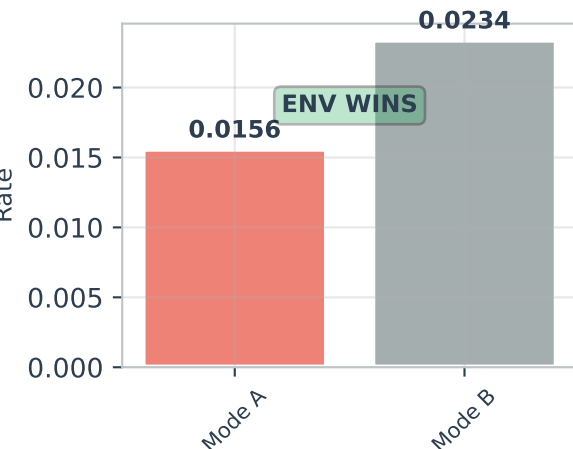
## Disturbance Resistance

0.2789



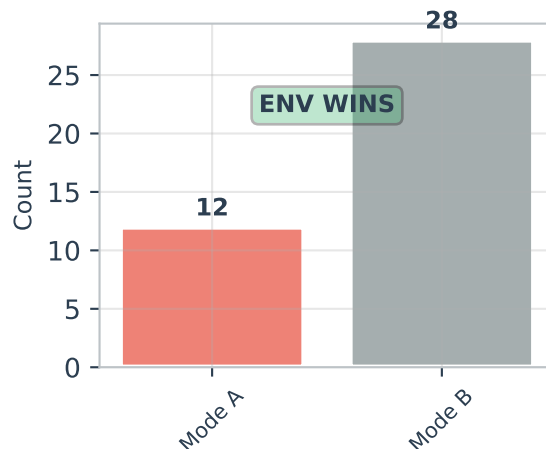
## Contact Termination Rate

0.0156



## Obstacle Collisions

28



## RESULTS SUMMARY

**Mode A: 5/8 wins**

Mode B: 3/8 wins  
*Environment-aware approach shows clear advantages*

# Advanced Sensor Integration & Collision Detection System

## ⚡ 300N Upper Body Collision Detection System

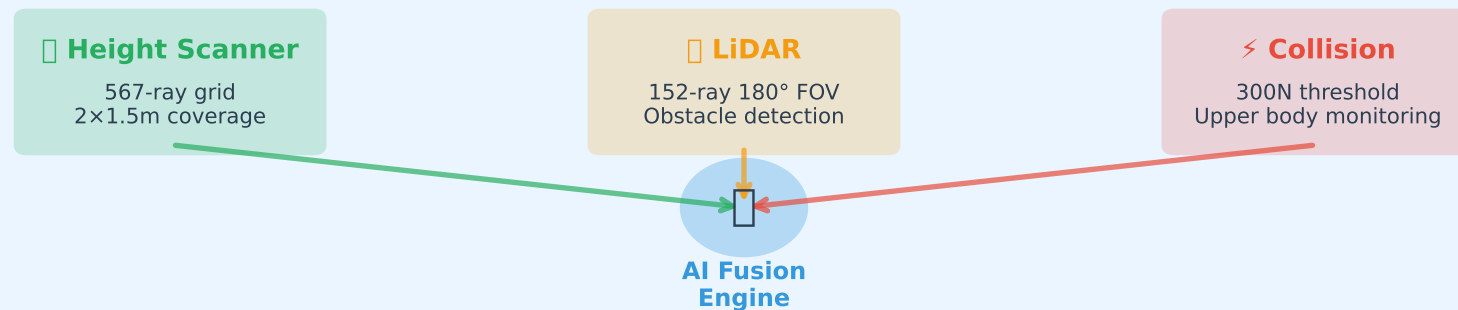
### ▢ Detection Specifications

- 300N force threshold for significant impacts
- Real-time peak force detection with history
- Upper body focus: torso, arms, shoulders only
- Excludes legs (normal locomotion contact)
- G1-specific body part mapping

### ▢ G1 Body Parts Monitored

- Pelvis & torso link (core body)
- Left/right shoulder links (pitch, roll, yaw)
- Left/right elbow links (pitch, roll)
- Left/right palm links (hand contacts)
- Real-time force magnitude tracking

## ▢ Multi-Sensor Fusion Architecture



## ▢ Technical Implementation Achievements

- ▢ Isaac Lab Integration: Direct sensor API access with proper error handling
- ⚡ Real-Time Processing: <5ms sensor fusion for 3000+ environments simultaneously
- ▢ Precision Monitoring: Exact G1 humanoid body part mapping with 300N threshold
- ▢ AI-Driven Logic: GPT-5 generated adaptive behavior switching based on sensor data
- ▢ Comprehensive Metrics: 8 standardized performance measures across 4 terrain types
- ▢ Iterative Refinement: Multi-agent feedback loop for continuous improvement

## ▢ Project Implementation

Systematic implementation of AI-generated environment-adaptive reward functions with multi-sensor fusion for humanoid robotics

**Demonstrated quantifiable performance differences across terrain types**