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Article

# Data-Driven Beekeeping: A Smart Hive Monitoring System **Using IoT and Advanced Analytics**

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Abstract: Beekeeping faces several challenges that threaten both hive health and honey production, including frequent disturbances from manual inspections, lack of real-time monitoring, delayed responses to threats, unpredictable swarming, and inconsistent honey harvesting. Traditional beekeeping methods rely on periodic physical inspections, which can disrupt hive conditions, cause stress to bees, and fail to provide timely insights into colony health. To address these issues, this study explores the application of the Internet of Things (IoT), cloud computing, and data analytics in beehive monitoring. Primary research was conducted through surveys distributed to farmers and apiculture organizations, as well as a visit to Yatta Beekeepers in Juja, where firsthand challenges were observed. IoT sensors—such as load cells for weight measurement, temperature and humidity sensors, and microphones for monitoring hive acoustics—are deployed within hives to collect realtime data. This data is transmitted to a cloud-based system, analyzed, and displayed on a dashboard accessible via a smart device. Notifications are triggered when hive conditions exceed predefined thresholds, enabling beekeepers to take timely action. By integrating IoT and data analytics, this system enhances hive management, reduces losses, and promotes sustainable beekeeping practices. The findings suggest that precision beekeeping through IoT can significantly improve honey yield and colony health.

Keywords: smart beekeeping, IoT in apiculture, hive monitoring, hive acoustics, data analytics, real-time monitoring, predictive analysis, bee colony health

0. Introduction

Beekeeping plays a crucial role in global agriculture and biodiversity, as bees are essential pollinators that contribute to food production and ecosystem sustainability. However, modern apiculture faces significant challenges that threaten hive health and honey production. Traditional beekeeping methods rely on manual inspections, which can disrupt the internal conditions of hives, cause stress to the bees, and fail to provide real-time insights into colony well-being. Additionally, beekeepers often struggle with unpredictable swarming, inconsistent honey production due to a lack of precise data and delayed responses to threats such as pests including Varroa mites, honey badgers and ants, .

Recent advancements in technology have introduced the concept of smart beekeeping, where Internet of Things (IoT) sensors, cloud computing, and data analytics are leveraged to enhance hive monitoring and management. IoT-based hive monitoring systems have been explored in various studies, demonstrating the potential to collect and analyze real-time data on hive conditions such as temperature, humidity, weight, and acoustic activity. These

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innovations aim to improve decision-making and ensure timely interventions, ultimately promoting sustainability in apiculture.

This study seeks to address key challenges in beekeeping by integrating IoT and data analytics to develop a remote hive monitoring system. By providing real-time data access and predictive analysis, this system aims to enhance hive management, mitigate losses, and optimize honey production. The findings of this research contribute to the growing field of precision beekeeping, offering a sustainable solution to common apicultural challenges and ensuring better outcomes for both bees and beekeepers.

## 1. Materials and Methods

## 1.1. Problem Identification and Background Research

To establish the challenges in traditional beekeeping and assess the feasibility of an IoT-based hive monitoring system, we conducted both primary and secondary research...

# 1.1.1. Primary Research: Surveys and Field Observations

A structured questionnaire was distributed online to beekeepers and apiculture organizations, collecting data on challenges such as hive disturbances, inconsistent honey production, delayed responses to threats, and lack of real-time monitoring. Responses confirmed that most beekeepers rely on manual inspections, which can be intrusive and inefficient.

Additionally, a field visit was conducted at Yatta Beekeepers in Juja, where an experienced beekeeper, Dan, guided us through the beekeeping process—from hive installation and inspections to harvesting. This visit provided invaluable insights into the limitations of traditional beekeeping and how IoT technology could address them.

Dan explained that hives are typically inspected once a month, which can result in delays in detecting hive health issues, pest infestations, or swarming activity. Furthermore, he highlighted how beekeepers rely on visual indicators, such as capping on honeycombs, to determine the optimal harvesting time—an approach that lacks precision. The issue of pest intrusion, particularly honey badgers knocking over hives, was also raised, showing the need for an automated monitoring and alert system.

# 1.1.2. Secondary Research: Review of the literature

Research studies on precision beekeeping [1] and IoT applications in apiculturesuggest that sensor-based hive monitoring can significantly enhance beekeeping efficiency while reducing manual interventions[2]. It has also been highlighted how acoustic analysis can provide insights into colony behavior [3].

# 2. IoT System Architecture and Implementation

To address the identified challenges, an IoT-based hive monitoring system was developed, integrating multiple sensors, a LoRa-based wireless communication module, and cloud-based analytics for real-time monitoring and predictive analysis.

#### 2.0.1. Justification for Sensor Selection

The selection of sensors was based on their ability to monitor key parameters that influence hive health and productivity.

**DHT11 (Temperature and Humidity Sensor):** Ensures the internal hive environment remains optimal. Sudden increases in temperature could indicate external heat stress, requiring immediate intervention

**KY-037 (Microphone Sensor):** Monitors hive acoustics to detect colony stress, swarming activity, or agitation due to external threats.

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**Load Cell + HX711 (Weight Sensor):** Provides insights into honey production and colony population. A sudden weight drop could indicate swarming or nectar shortages, while a stable weight plateau suggests a good time for harvesting.

# 2.0.2. Data Transmission and Storage

Sensor data is collected by an **ESP32 microcontroller**, processed, and transmitted wirelessly via **LoRa** to a cloud-based **Supabase database**. A **web dashboard** allows real-time visualization of hive conditions, and alerts notify beekeepers when thresholds are exceeded.

# 2.0.3. Data-Driven Harvesting Precision

Dan mentioned that harvesting is primarily determined by visual cues (capping on honeycombs). By analyzing hive weight trends, harvesting can be data-driven, reducing unnecessary inspections. Sound analysis further aids harvesting decisions. Agitated or unusually silent colonies may indicate unsuitable harvesting conditions. Pest and Intrusion Detection Acoustic analysis detects disturbances when bees react to threats (human, animal, or insect). A shift in frequency can trigger an alert for potential intrusions. Weight sensor anomalies can signal foreign objects on the hive—such as a honey badger shifting or knocking it over.

## 2.0.4. Machine Learning for Sound Classification

Dan raised the challenge of differentiating normal hive sounds from those indicating disturbances. To address this, machine learning algorithms will be trained to filter normal fluctuations from meaningful alerts, reducing false alarms.

## 2.0.5. Data Analysis and Predictive Modeling

Data analytics techniques applied include:

- **Trend Analysis** Monitors fluctuations in hive weight, temperature, humidity, and sound levels.
- Threshold Alerts Notifies beekeepers of extreme values (e.g., overheating, excessive weight loss).
- **Predictive Modeling** Uses historical data to forecast swarming events and optimal honey harvesting times.

Abbreviations

The following abbreviations are used in this manuscript:

MDPI Multidisciplinary Digital Publishing Institute

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