Lightweight Protocols for Wearable Sensor Networks in Human Activity Recognition (HAR)

Introduction

This project implements a fitness tracker simulation that uses the MQTT protocol for lightweight communication in wearable sensor networks. It simulates sensor data such as temperature, acceleration, heart rate, steps, and calories burned, which are published and consumed via an MQTT broker. The project is designed for Human Activity Recognition (HAR), where wearable devices capture sensor data to identify user activities (e.g., walking, running, idle).

Objectives

- Implement lightweight protocols for wearable sensor networks using MQTT.
- Simulate fitness tracker data relevant for HAR.
- Provide a detailed explanation of network and computational efficiency.
- Document setup, code, and results.

System Setup

Environment

- Operating System: Debian Linux (on virtual machines).
- Programming Language: Python 3.
- MOTT Broker: Mosquitto.

Installed Packages

The following tools and libraries were installed:

- sudo apt install build-essential git python3 python3-pip -y
- sudo apt install mosquitto mosquitto-clients -y

Python Libraries:

- pip install paho-mqtt
- pip install tkinter

Implementation

1. MQTT Broker Configuration

Steps to Set Up Mosquitto Broker:

- 1. Install Mosquitto: sudo apt install mosquitto mosquitto-clients -y
- 2. Start and Enable Mosquitto Service:

sudo systemctl start mosquitto sudo systemctl enable mosquito

3. Configure Mosquitto:

Edit the Mosquitto configuration file to allow anonymous connections: sudo nano /etc/mosquitto/mosquitto.conf

Add the following lines:

```
# Place your local configuration in /etc/mosquitto.conf.d/
# A full description of the configuration file is at
# /usr/share/doc/mosquitto/examples/mosquitto.conf.example

pid_file /run/mosquitto/mosquitto.pid

persistence true
persistence_location /var/lib/mosquitto/

log_dest file /var/log/mosquitto/mosquitto.log

include_dir /etc/mosquitto/conf.d

listener 1883
allow_anonymous true
```

- 4. Restart Mosquitto: sudo systemctl restart mosquito
- 5. Verify Mosquitto:

Check if Mosquitto is listening on port 1883: sudo netstat -tuln | grep 1883

It should print this:

Testing Results

Verify if the publisher sends messages by subscribing to the topic `wearable/sensor` using:

```
client@serverVM:~$ mosquitto_sub -h localhost -t "test/topic"
```

Make the publisher send a message using

```
client@serverVM:~$ mosquitto_pub -h localhost -t "test/topic" -m "Hello World"
Received messages:
client@serverVM:~$ mosquitto_sub -h localhost -t "test/topic"
Hello World
```

2. Publisher: Simulating Fitness Tracker

The publisher script simulates fitness tracker data, including:

- Temperature (36.0–37.5 °C).
- Acceleration (0.0–10.0 m/s^2).
- Heart rate (60–180 BPM).
- Steps (100–500 per minute).
- Calories burned (0.5–10.0 kcal).

Code:

```
server.py x
server.py > @ simulate_fitness_tracker
import paho.mqtt.client as mqtt
import time
import random

def simulate_fitness_tracker():
    # Initialize MQTT client
client = mqtt.client()
client.connect("localhost", 1883, 60)

print("Publishing fitness tracker data...")

while True:
    sensor_data = {
    "temperature": round(random.uniform(36.0, 37.5), 2), # Body temperature in Celsiu "acceleration": round(random.uniform(0.0, 10.0), 2), # Acceleration in m/s^2
    "heart_rate": random.randint(60, 180), # Heart rate in BPM
    "steps": random.randint(100, 500), # Steps taken
    "calories_burned": round(random.uniform(0.5, 10.0), 2) # Calories burned
}

client.publish("wearable/sensor", str(sensor_data))
print(f"Published: {sensor_data}")
time.sleep(3)

if __name__ == "__main__":
    if __name__ == "__main__":
    simulate_fitness_tracker()
```

3. Subscriber: Receiving and Classifying Data

The subscriber script receives MQTT messages and performs activity classification based on sensor data.

Code:

```
🕏 tkinterClient.py 🗙
         # Global Variable to Store In
sensor_data = {

"temperature": "N/A",

"acceleration": "N/A",

"heart_rate": "N/A",

"steps": "N/A",

"calories_burned": "N/A",

"calories_burned": "N/A",
               global sensor_data
                    # Decode and convert the string to a dictionary
sensor_data = eval(msg.payload.decode())
                update_gui()
except Exception as e:
                update_gul():
temp_label_value.config(text=f"{sensor_data['temperature']} \u00b0C")
accel_label_value.config(text=f"{sensor_data['acceleration']} m/s\u00b2")
heart_label_value.config(text=f"{sensor_data['heart_rate']} BPM")
steps_label_value.config(text=f"{sensor_data['steps']} steps")
calories_label_value.config(text=f"{sensor_data['calories_burned']} kcal")
                  if sensor_data['heart_rate'] > 120 or sensor_data['acceleration'] > 5.0:
                       activity_label_value.config(text=f"Running")
f sensor data['heart rate'] > 80 and sensor data['heart rate'] <= 120 or sensor data['a
          elif sensor data['heart
🕏 tkinterClient.py 🗙
  25 def update_gui():
             elif sensor_data['heart_rate'] > 80 and sensor_data['heart_rate'] <= 120 or sensor_data['...
                 activity_label_value.config(text=f"Walking")
elif sensor_data['heart_rate'] <= 80 or sensor_data['acceleration'] < 1.0:
    activity_label_value.config(text=f"Idle")
                       activity_label_value.config(text=f"Idle")
           def setup_mqtt(broker_ip, topic):
                 client.subscribe(topic)
                 client.loop start()
           def setup_gui():
                  app.title("Fitness Tracker Data Viewer")
                 app.geometry("500x350")
app.configure(bg="#2e3b4e") # dark background
                  title_label = ttk.Label(
                         font=("Helvetica", 20, "bold"),
foreground="#FFFFFF",
                         background="#2e3b4e"
                  title_label.pack(pady=15)
```

```
tkinterClient.py ×
 tkinterClient.py > .
         def setup_gui():
              ttk.Separator(app, orient="horizontal").pack(fill="x", padx=20, pady=10)
              data_frame = tk.Frame(app, bg="#2e3b4e")
              data_frame.pack(fill="both", expand=True, padx=20, pady=10)
              # temperature
global temp_label_value
              temp_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), foreg
ttk.Label(data_frame, text="Temperature:", font=("Helvetica", 14), foreground="#f4b4la", b
              temp_label_value.grid(row=0, column=1, sticky="w", padx=10)
              global accel_label_value
              accel_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), fore ttk.Label(data_frame, text="Acceleration:", font=("Helvetica", 14), foreground="#f4b41a", accel_label_value.grid(row=1, column=1, sticky="w", padx=10)
              global heart_label_value
              heart_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), fore
              ttk.Label(data_frame, text="Heart Rate:", font=("Helvetica", 14), foreground="#f4b41a", baheart_label_value.grid(row=2, column=1, sticky="w", padx=10)
              global steps_label_value
               steps_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), fore
              ttk.Label(data_frame, text="Steps:", font=("Helvetica", 14), foreground="#f4b41a", backgro
              steps_label_value.grid(row=3, column=1, sticky="w", padx=10)
                                                                             Go to Line/Column
tkinterClient.py ×
🕏 tkinterClient.py > ...
               global steps_label_value
              steps_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), fore
ttk.Label(data_frame, text="Steps:", font=("Helvetica", 14), foreground="#f4b41a", backgro
steps_label_value.grid(row=3, column=1, sticky="w", padx=10)
               global calories_label_value
              calories_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), f
ttk.Label(data_frame, text="Calories Burned:", font=("Helvetica", 14), foreground="#f4b4la
calories_label_value.grid(row=4, column=1, sticky="w", padx=10)
               activity_label_value = ttk.Label(data_frame, text="N/A", font=("Helvetica", 14, "bold"), f
               ttk.Label(data_frame, text="Current activity:", font=("Helvetica", 14), foreground="#f4b41
               activity_label_value.grid(row=5, column=1, sticky="w", padx=10)
              return app
         if __name__ == "__main__":
    MQTT_BROKER_IP = "192.168.1.8"
    MQTT_TOPIC = "wearable/sensor"
               setup_mqtt(MQTT_BROKER_IP, MQTT_TOPIC)
               app = setup_gui()
```

app.mainloop()

Activity Classification

The subscriber performs simple rule-based classification:

- Idle: Low acceleration, low heart rate.
- Walking: Moderate acceleration, moderate heart rate.
- Running: High acceleration, high heart rate.

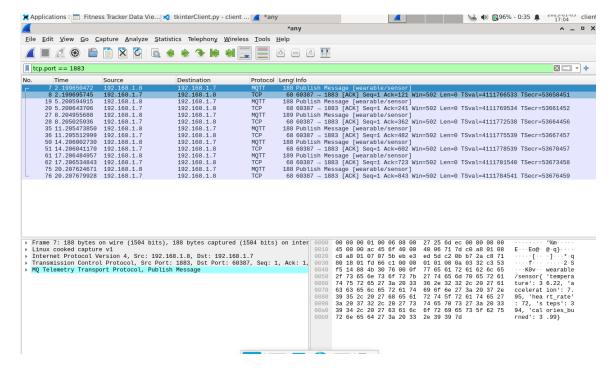
Classification Code:

```
if sensor_data['heart_rate'] > 120 or sensor_data['acceleration'] > 5.0:
    activity_label_value.config(text=f"Running")
elif sensor_data['heart_rate'] > 80 and sensor_data['heart_rate'] <= 120 or sensor_data['a activity_label_value.config(text=f"Walking")
elif sensor_data['heart_rate'] <= 80 or sensor_data['acceleration'] < 1.0:
    activity_label_value.config(text=f"Idle")
else:
    activity_label_value.config(text=f"Idle")</pre>
```

```
34 art_rate'] <= 120 or sensor_data['acceleration'] < 5.0:
```

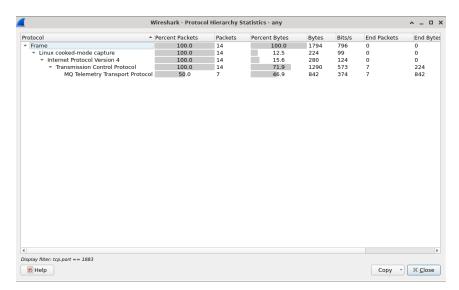
Network Usage

To test network usage, we used Wireshark, and we configured it to only look for data sent via port 1883 (the MQTT one):

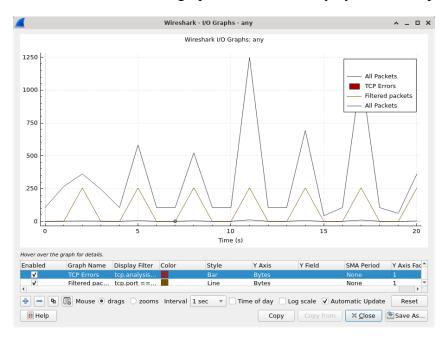


In the picture we can see that packets have the maximum length of 189 bytes and they are sent in intervals of 3 seconds.

Then we looked into the Hierarchy Statistics to see how much of the network the MQTT protocol uses.



Then we checked the I/O graphs to see how many bytes are sent per tick.

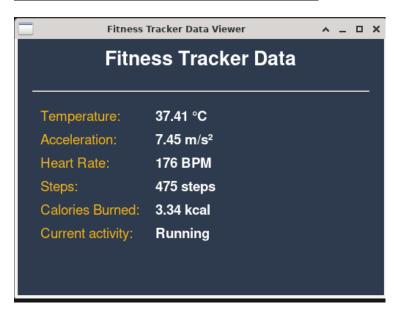


1. Message Size:

- Average message size: ~189 bytes (JSON-encoded sensor data).
- 2. Frequency:
 - Messages sent every 3 seconds.

- 3. Total Usage:
 - ~3.8 KB per minute.

Here is how the application looks like:



Conclusion

This project successfully demonstrates the use of MQTT as a lightweight protocol for wearable sensor networks. The system efficiently simulates and transmits fitness tracker data for Human Activity Recognition. Future improvements could include integrating machine learning models for activity classification and optimizing payload sizes for further network efficiency.