Low-Level Technical Design Document Project: GreenQuery - Sustainable BigQuery Optimization **Date:** July 22, 2025 **Team:** Lloyds Technology Centre

1. Objective

To build a cost-effective, performance-optimized, and sustainable BigQuery monitoring and optimization platform called **GreenQuery** that:

- Detects and recommends fixes for inefficient queries.
- Estimates cost and CO2 emissions.
- Provides actionable dashboards and alerts for data teams.

2. Tech Stack

- Cloud Platform: Google Cloud Platform (GCP)
- Primary Services: BigQuery, Cloud Functions, Cloud Scheduler, Pub/Sub, Cloud Logging
- Monitoring & Reporting: Looker Studio
- Programming Languages: Python, SQL
- ML/Forecasting: BigQuery ML
- CI/CD Integration: GitHub Actions

3. Project Structure

```
greenquery/
├─ config/
     — dry_run_config.json
    └─ alert_rules.yaml
 — data∕
    ├─ raw_logs/
    └─ processed/
  - functions/
    ├── dry_run_estimator.py
    ├─ log_parser.py
    ├─ notifier.py
    optimization_advisor.py
    ├─ query_classifier.sql
    └─ forecasting_model.sql
  - reports/
    dashboard_templates/
   scripts/
    └─ setup_bigquery_views.sql
```

```
├── tests/
| └── test_dry_run_estimator.py
└── main.py
```

4. Component Breakdown

A. Log Collection

- Source: BigQuery audit logs
- Method: Sink logs to a central GCP logging bucket and export to BigQuery
- **Storage**: greenquery_logs.raw_logs

B. Log Parsing

- Script: log_parser.py
- **Function:** Extract relevant fields (user, query, project, data processed, etc.) and store in processed_logs table.

C. Dry Run Estimation

- **Script:** dry_run_estimator.py
- **Function:** Runs BigQuery jobs in dry_run=True mode and captures estimated cost and data scanned.
- Trigger: Cloud Function triggered via Pub/Sub or scheduler

D. Query Classification (ML)

- Tool: BigQuery ML
- **Script:** ml/query_classifier.sql
- Function: Classify queries as efficient or inefficient
- Input: processed_logs

E. Forecasting Model (ML)

- Tool: BigQuery ML ARIMA_PLUS
- **Script:** ml/forecasting_model.sql
- Function: Forecast future cost and emissions based on query patterns

F. Optimization Advisory

- **Script:** optimization_advisor.py
- Function: Provide tips (e.g., add filter, partition, cluster, avoid SELECT *)

G. Alerting and Notifications

• **Script**: notifier.py

- Trigger: Cost/CO2 exceeds threshold (defined in alert_rules.yaml)
- Channels: Slack, Email

H. Dashboarding

- Tool: Looker Studio
- **Source Tables:** processed_logs |, classification_results |, forecast_results
- Views: Persona-based (Engineers, Analysts, Executives)

5. Data Flow

- 1. BigQuery Logs → Log Sink → BQ Dataset (raw)
- 2. Raw Logs → Cloud Function (Parser) → Processed Logs Table
- 3. Dry Run Estimator → Estimated Cost/Emissions Table
- 4. ML Classifier + Forecasting → Results Tables
- 5. Advisor → Optimization Suggestions Table
- 6. Notifier → Alerts to Slack/Email
- 7. Looker Studio → Visual Dashboards

6. Cost Optimization Measures

- Use **on-demand Cloud Functions** instead of long-running services
- Store logs in compressed formats
- Minimize storage via partitioned tables
- Use **caching and dry run** for forecasting without actual execution
- Prefer scheduled batch jobs over real-time where latency isn't critical

7. Future Enhancements

- Gemini-powered SQL rewrite suggestions
- CI/CD query budget guardrails
- Geo-based carbon estimation models
- Integration with enterprise ITSM (ServiceNow)

8. Security & IAM

- Use least-privilege roles for Cloud Functions
- Logs anonymized (PII masked) in processed_logs
- IAM scoped by team (Eng/Analyst/Exec)

9. Deployment

- **Setup Script:** scripts/setup_bigquery_views.sql
- CI/CD: GitHub Actions for test + deploy
- **Monitoring:** GCP Ops Suite (Logging + Monitoring)

10. Testing Strategy

- Unit Tests: For each Cloud Function in /tests
- Integration Tests: End-to-end dry run + optimization flow
- Load Tests: Simulate logs using synthetic queries

11. Deliverables

- Source code repo (GitHub)
- GCP deployment templates (Terraform or scripts)
- Documentation (README, architecture, runbooks)
- Dashboards & sample alerts