

ENVIRONMENTAL IMPACT ANALYSIS ON ATHLETIC PERFORMANCE

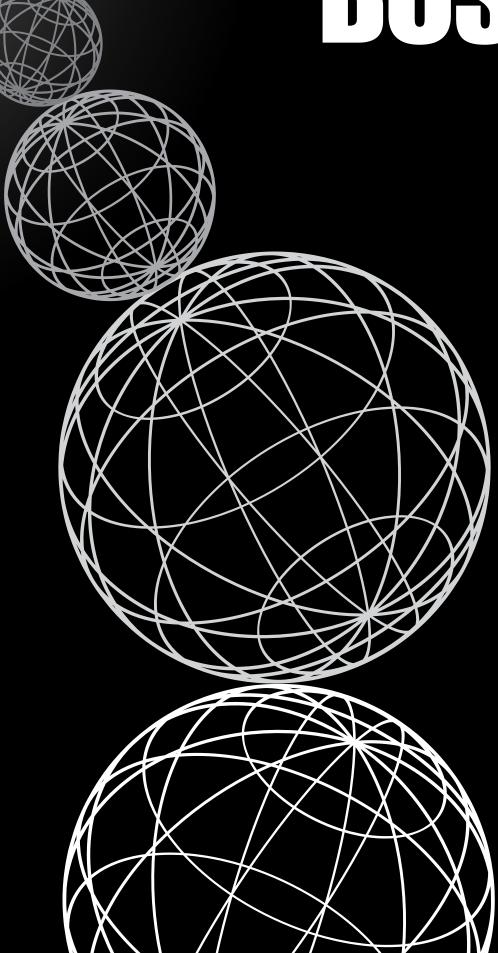
Problem:

Athletic performance varies significantly under different environmental conditions, but patterns remain unquantified

Solution:

Integrated DW analyzing altitude/temperature impact on hundreds of thousands performances from professional athletes

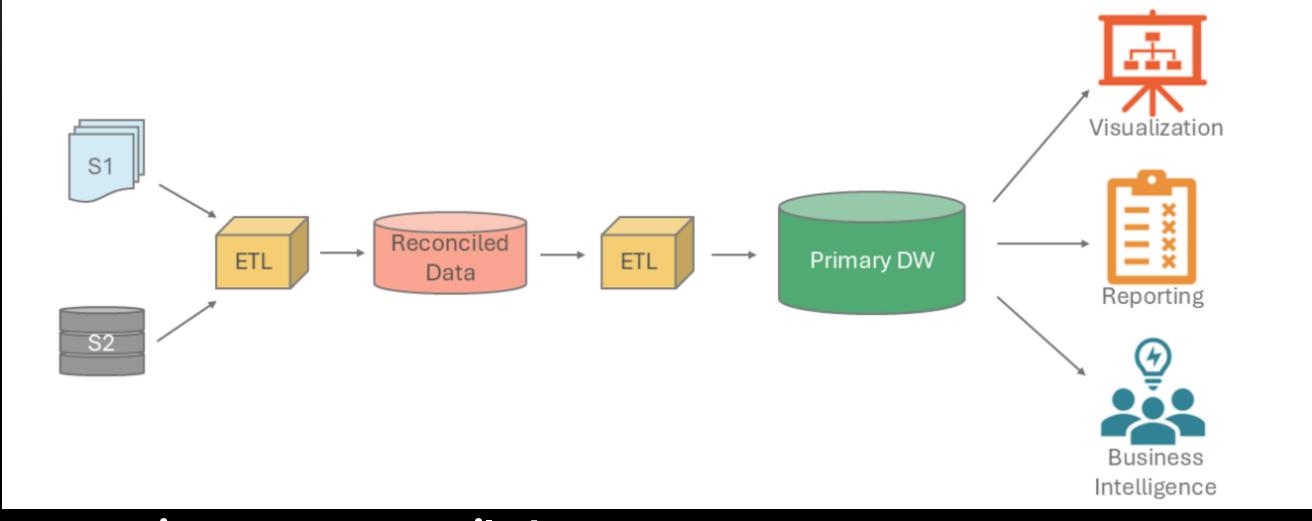
BUSINESS GOALS



- Quantify altitude effects on sprint vs endurance events
- Identify optimal temperature ranges per event type
- Map geographic performance patterns



3-LAYER ARCHITECTURE



Staging:

Reconciled:

DWH:

Raw CSV ingestion

Entity resolution

Star schema

The three layers are created by the file create_layers.sql, that defines 3 schemas representing the different data processing stages:

01_create_layers.sql
02a_create_reconciled_schema.sql

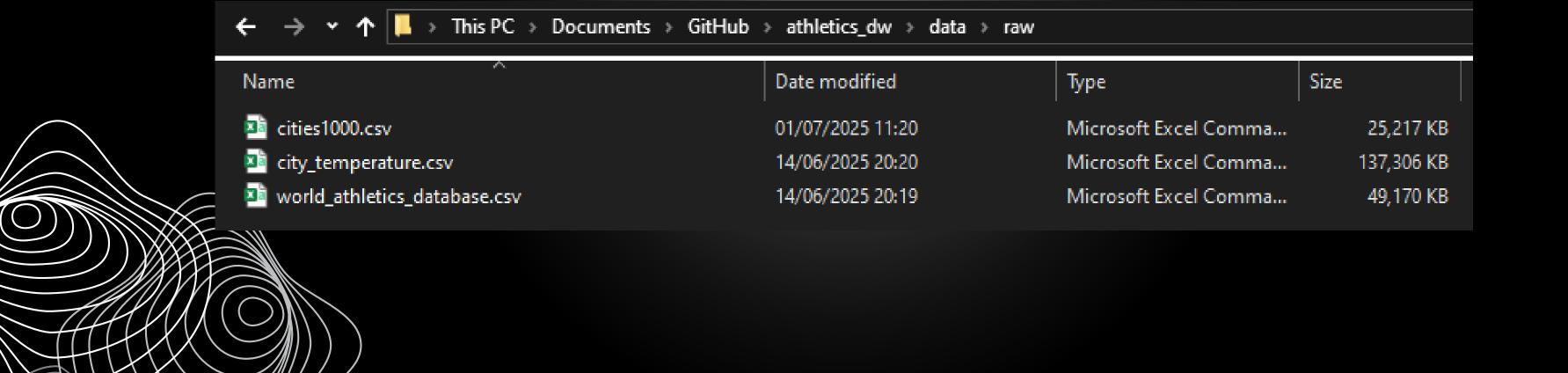
27/06/2025 11:47 11/07/2025 15:26 SQL File SQL File 1 KB 4 KB

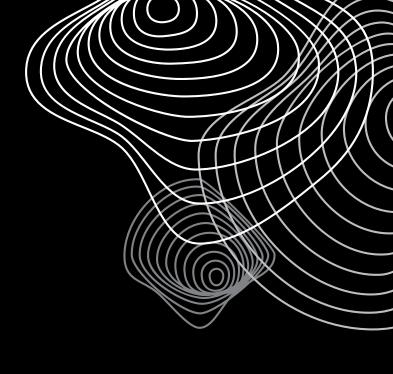
SOURCE LAYER

World Athletics: 461K performances, 35K athletes

GeoNames: 158K cities (>1000 inhabitants) with elevation

Temperature DB: 2.9M daily readings (until 2020)



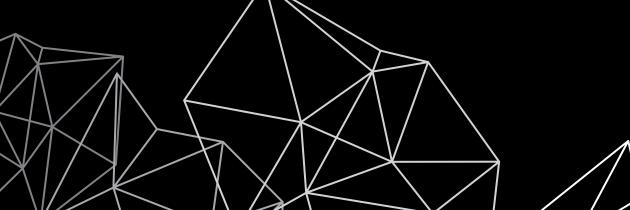


Data staging

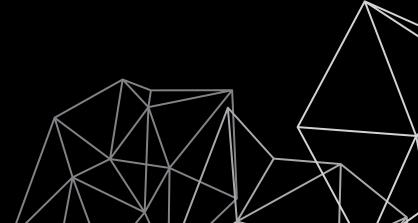
Raw operational data extracted directly from source systems, preserved in original format for initial loading. Acts as a buffer zone before transformation

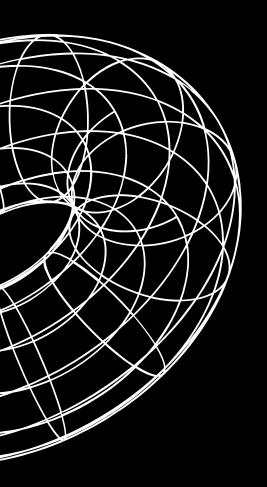
```
01_extract.py
                                                                    PY File
                                           15/07/2025 14:55
                                                                                               7 KB
02_transform.py
                                           11/07/2025 14:32
                                                                    PY File
                                                                                              18 KB
02b_load_reconciled.py
                                                                    PY File
                                                                                              40 KB
                                           14/07/2025 16:50
```

```
2025-07-15 14:55:35,118 - INFO - Loading data to staging tables...
 2025-07-15 14:55:35,118 - INFO - Loading World Athletics data (461522 rows)...
 2025-07-15 15:00:13,037 - INFO - World Athletics data loaded
 2025-07-15 15:00:13,047 - INFO - Loading Cities data (158848 rows)...
 2025-07-15 15:00:34,027 - INFO - Cities data loaded
 2025-07-15 15:00:34,027 - INFO - Loading Temperature data (2906327 rows)...
 2025-07-15 15:08:44,778 - INFO - Temperature data loaded
 2025-07-15 15:08:44,952 - INFO - Data verification - Athletics: 461522, Cities: 158848, Temperature: 2906327
 2025-07-15 15:08:44,952 - INFO - Data extraction completed successfully
PS C:\Users\Igorp\Documents\GitHub\athletics dw>
```









RECONCIED DATA LAYER

Here the data are transformed, cleaned, and prepared for the loading in the Data Warehouse

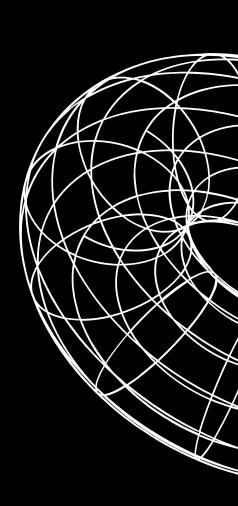
01_create_layers.sql	27/06/2025 11:47	SQL File	1 KB
02a_create_reconciled_schema.sql	11/07/2025 15:26	SQL File	4 KB

The create_reconciled_schema.sql implements the detailed structure of the Reconciled Layer, by creating standardized tables in the reconciled schema:

- Dimension Tables:
 - o athletes: Cleaned athlete data (names, nationality, attributes).
 - events: Standardized event definitions (categories, distances).
 - o venues: Enriched geographic data (cities, coordinates, climate).
 - weather_conditions: Environmental metrics (temperature, seasons).
- Fact Table:
 - o performances: Core performance records linking all dimensions (results, dates, sources).

Strong points:

- Enforces integrity with **foreign keys** (e.g., performances.athlete_key → athletes.athlete_key).
- Adds **indexes** on key columns (e.g., **athlete_key**, **event_key**) for query performance.
- Includes data quality fields (e.g., data_quality_score, source_system).



PPEINE

01_extract.py	15/07/2025 14:55	PY File	7 KB
02_transform.py	11/07/2025 14:32	PY File	18 KB
02b_load_reconciled.py	14/07/2025 16:50	PY File	40 KB



Transformation

Loading to the reconciled tables

TRANSFORMATION

In the photo below, there is the output of the 02_transform.py file. Its main tasks are:

- Cleaning the raw source data
- Standardizing formats (event names, city names, units)
- Enforcing data quality rules (null handling, value ranges)
- Creating staging tables: clean_world_athletics, clean_cities, clean_temperature

```
2025-07-15 16:36:43,840 - INFO - Starting data transformation process...
   2025-07-15 16:36:43,911 - INFO - Cleaning World Athletics data...
   2025-07-15 16:36:46,920 - INFO - Original records: 461522
   2025-07-15 16:36:46,920 - INFO - Original columns: ['Rank', 'Mark', 'Competitor', 'DOB', 'Nat', 'Pos', 'Venue', 'Date', 'Results Score', 'Mark [meters or seconds]', 'Event', 'Wind', 'Sex']
   2025-07-15 16:36:47,207 - INFO - After column selection: ['athlete_name', 'event_name', 'result_value', 'venue_name', 'competition_date', 'nationality', 'gender', 'date_of_birth', 'rank_position', 'wind_reading', 'pos', 'r
   esults score']
   2025-07-15 16:36:47,574 - INFO - After removing null essential fields: 461522 records (-0)
   2025-07-15 16:36:47,574 - INFO - Cleaning result values...
   2025-07-15 16:36:48,215 - INFO - After cleaning result values: 458043 records (-3479 invalid)
   2025-07-15 16:36:48,266 - INFO - Standardizing event names...
   2025-07-15 16:36:48,392 - INFO - Standardized events: ['10 Kilometres', '10 Kilometres Race Walk', '10 Miles Road', '100 Metres', '100 Metres Hurdles', '1000 Metres', '10000 Metres', '10000 Metres Race Walk', '110 Metres H
   urdles', '15 Kilometres', '1500 Metres', '20 Kilometres', '20 Kilometres Race Walk', '200 Metres', '2000 Metres', '2000 Metres Steeplechase', '20000 Metres Race Walk', '30 Kilometres Race Walk', '30 Metres', '3000 Metres', '3000 Metres', '2000 Metres', '2000 Metres', '20000 Metres Race Walk', '30 Kilometres Race Walk', '30 Kilometres', '30 Kilo
   , '3000 Metres Race Walk', '3000 Metres Steeplechase', '35 Kilometres Race Walk', '400 Metres', '400 Metres Hurdles', '5 Kilometres Race Walk', '50 Kilometres Race Walk', '5000 Metres', '5000 Metres', '5000 Metres', '8000 Metres', 
   lk', '600 Metres', '800 Metres', 'Decathlon', 'Discus Throw', 'Half Marathon', 'Hammer Throw', 'Haptathlon', 'Javelin Throw', 'Long Jump', 'Marathon', 'One Mile', 'Pole Vault', 'Shot Put', 'Triple Jump', 'Two
   2025-07-15 16:36:48,392 - INFO - Cleaning athlete names...
   2025-07-15 16:36:48,785 - INFO - Final columns: ['athlete name', 'event name', 'result value', 'venue name', 'competition date', 'nationality', 'gender', 'date of birth', 'rank position', 'wind reading', 'pos', 'results sc
   ore', 'result numeric', 'event clean', 'competition level', 'data source']
   2025-07-15 16:36:48,785 - INFO - Final column count: 16
   2025-07-15 16:36:48,785 - INFO - Saving 458043 records to staging.clean world athletics in chunks of 10000...
   2025-07-15 16:40:07,484 - INFO - clean world athletics saved successfully
   2025-07-15 16:40:07,487 - INFO - Cleaned World Athletics data: 458043 records saved
   2025-07-15 16:40:07,576 - INFO - Integrating geographic data...
   2025-07-15 16:40:08,205 - INFO - Original cities data: 158848 records
   2025-07-15 16:40:08,205 - INFO - Original columns: ['City', 'Country', 'Latitude', 'Longitude', 'Population', 'Altitude']
   2025-07-15 16:40:10,591 - INFO - Clean cities columns: ['city_name', 'country_name', 'latitude', 'longitude', 'altitude', 'altitude_category', 'data_source']
   2025-07-15 16:40:10,591 - INFO - Clean cities count: 145457
   2025-07-15 16:40:10,592 - INFO - Saving 145457 records to staging.clean_cities in chunks of 10000...
   2025-07-15 16:40:38,862 - INFO - clean_cities saved successfully
   2025-07-15 16:40:38,863 - INFO - Geographic data integrated: 145457 cities
   2025-07-15 16:40:38,902 - INFO - Integrating temperature data...
   2025-07-15 16:41:00,083 - INFO - Temperature data after filtering: 2905887 records
   2025-07-15 16:41:00,812 - INFO - Monthly averages calculated: 3852 records
   2025-07-15 16:41:00,814 - INFO - Converting Fahrenheit to Celsius...
   2025-07-15 16:41:00,822 - INFO - Fast saving temperature data...
   2025-07-15 16:41:00,823 - INFO - Saving 3852 records to staging.clean_temperature in chunks of 10000...
   2025-07-15 16:41:01,499 - INFO - clean_temperature saved successfully
   2025-07-15 16:41:01,499 - INFO - Temperature data integrated: 3852 records
   2025-07-15 16:41:01,820 - INFO - Data transformation completed successfully!
   2025-07-15 16:41:01,820 - INFO - Final record counts:
   2025-07-15 16:41:01,820 - INFO - Athletics: 458043
   2025-07-15 16:41:01,821 - INFO - Cities: 145457
   2025-07-15 16:41:01,821 - INFO - Temperature: 3852
OPS C:\Users\Igorp\Documents\GitHub\athletics dw>
```

LOADING TO RECONCILED TABLES

The load_reconciled file manages the Business entity reconciliation. Its main tasks are:

Entity Resolution:

- Athlete deduplication (reconcile_athletes())
- Event categorization & standardization (reconcile_events())
- Venue geolocation matching (reconcile_venues())
- Weather gap filling (reconcile_weather())

Relationship Building:

- Cross-linking performances to athletes/events/venues/weather
- Foreign key assignment

Advanced Matching:

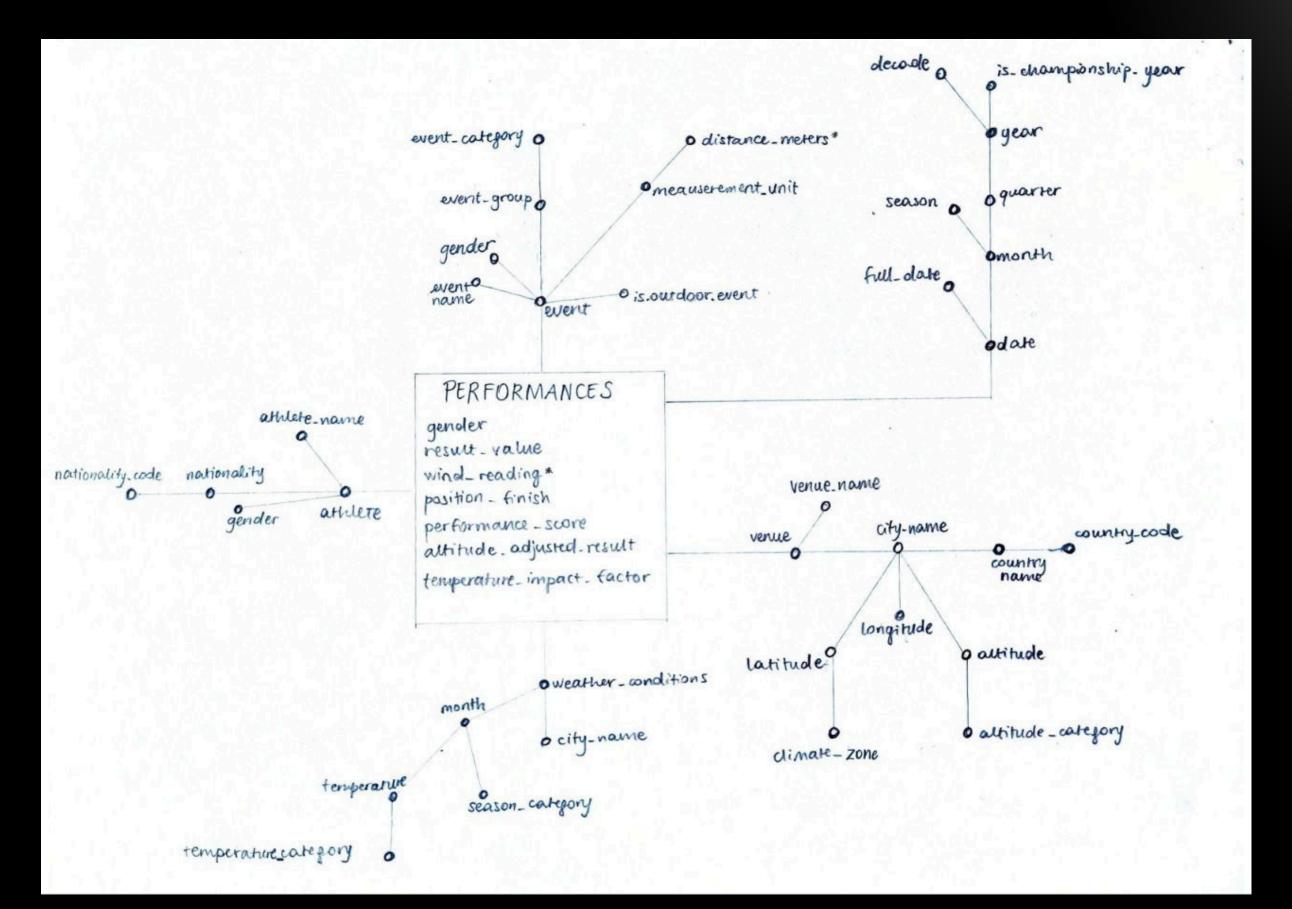
- Fuzzy matching for weather conditions
- Heuristic-based city extraction from venues

Output:

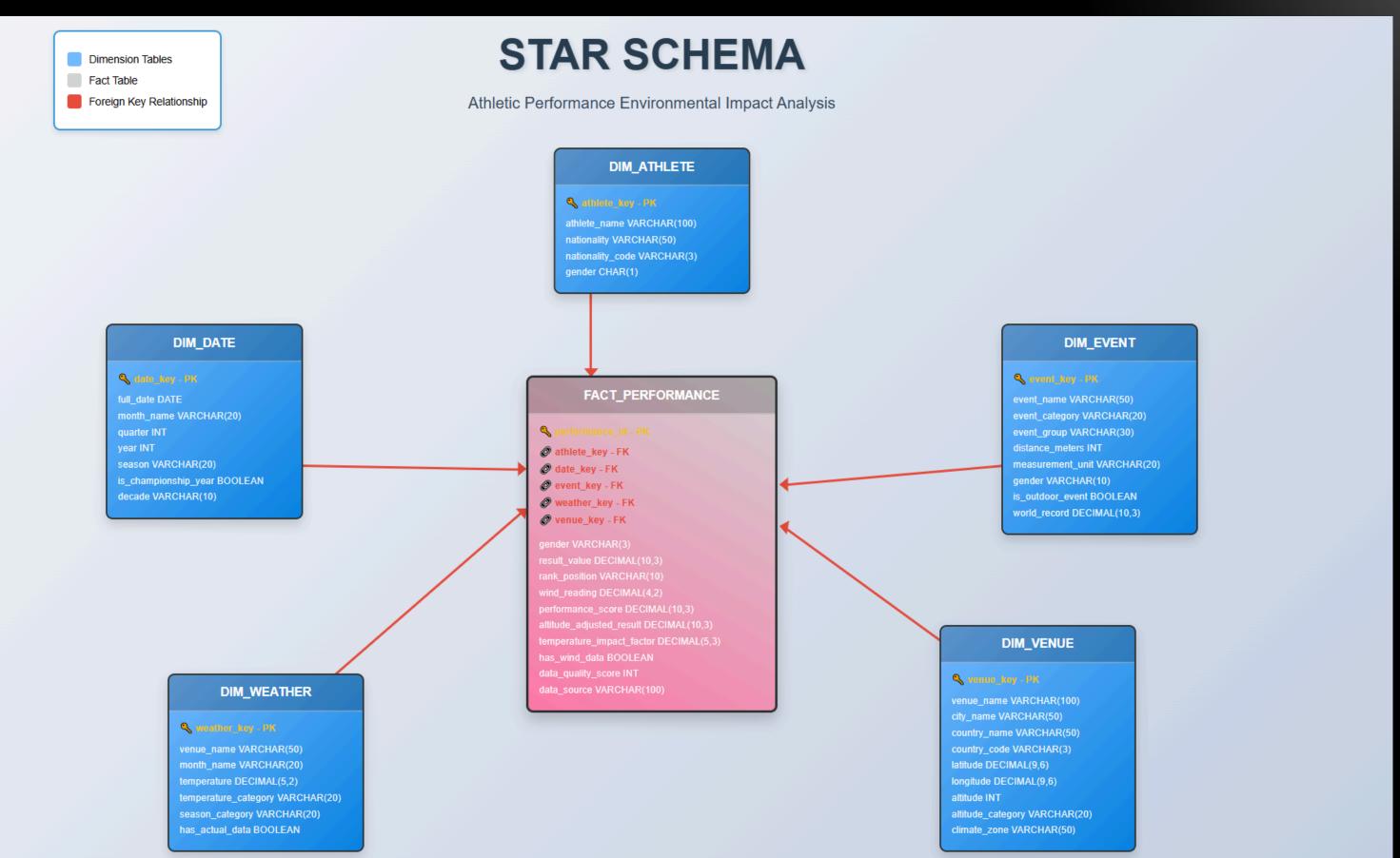
Populates reconciled schema tables

```
INFO: main :Reconciling athletes...
INFO: main :Deduplication: 34854 → 33785 athletes (1069 duplicates removed)
INFO: main :Inserted 33785 athletes.
INFO:__main__:Reconciling events...
INFO:__main__:Filtering out multi-events...
INFO: main :Removed 2 multi-event records
INFO: main :Inserted 44 events.
INFO: main :Reconciling venues with city extraction...
INFO: main :Applying city-only matching for 2200 venues...
INFO: main :City extraction: 6399/6452 (99.2%)
INFO: main :Geographic matching: 4906/6452 (76.0%)
INFO: main :Inserted 6452 venue records
INFO:__main__:Reconciling weather conditions...
INFO: main :Loaded 3852 temperature records from transform stage
INFO: main :Final weather data: 3912 records for 326 cities
INFO: main :Inserted 3912 weather records
INFO: main :Reconciling performances...
INFO: main :STEP 1 - Original performance data: 457454 records
INFO: main :Reference table counts - Athletes: 33785, Events: 44, Venues: 6452
INFO: main :STEP 2 - After athlete join: 457454 records
INFO: main :STEP 3 - After event join: 457454 records
INFO: main :Venues after deduplication: 6452 (was 6452)
INFO:__main__:STEP 4 - After venue join: 457454 records
INFO: main :Creating weather matching lookup tables...
INFO: main :Building exact match lookup table...
INFO: main :Exact matches: 205964/457454 (45.0%)
INFO: main :Creating similarity matches for 251490 unmatched records...
INFO: main :Only 11202 unique city/month combinations need similarity matching
INFO: main :Similarity matches: 251490 additional matches
INFO: main :Total weather matching success: 457454/457454 (100.0%)
INFO: main :STEP 5 - After weather join: 457454 records
INFO: main :Removing performances without weather data...
INFO: main :Reconciled layer weather filter:
INFO: main : Initial performances: 457,454
INFO: main : Removed (no weather): 185,036 (40.4%)
INFO: main : Reconciled with weather: 272,418
INFO: main :Before filtering: 272418 records
INFO: main :After requiring athlete/event IDs: 272371 records
INFO: main :Filter duplicated performances: 8481 performances removed
INFO:__main__:Final performance records ready for insert: 263890
INFO: main :Weather match success: 263890/263890 performances have weather data
INFO: main :Cleared existing performance data
INFO: main :Starting save of performance data...
INFO: main : Appending 263890 records to reconciled.performances...
INFO: main :Table reconciled.performances exists and is accessible
INFO: main :Executing COPY command for reconciled.performances
INFO: main :263890 records appended successfully
INFO: main :Inserted 263890 performances.
INFO: main :reconciled.athletes: 33785 records
INFO: main :reconciled.events: 44 records
INFO: main :reconciled.venues: 6452 records
INFO: main :reconciled.weather conditions: 3912 records
INFO: main :reconciled.performances: 263890 records
INFO: main :Reconciled data layer created successfully.
PS C:\Users\Igorp\Documents\GitHub\athletics_dw>
```

DIMENSIONAL FACT MODEL



STAR SCHEMA



DATA WAREHOUSE LAYER

The Data Warehouse layer is where clean and validated data from RDL are transformed into a star schema optimized for answering business questions.

02b_create_dimensions.sql	11/07/2025 14:38	SQL File	3 KB
03_create_fact_table.sql	11/07/2025 14:40	SQL File	5 KB

- The first file creates **Dimension tables** in the **dwh** schema:
 - o dim_date: Temporal attributes (season, decade, championship year).
 - o dim_venue: Geographic/climate attributes (altitude, climate zone).
 - o dim_event: Event details (category, distance).
 - o dim_athlete: Athlete attributes (gender, nationality).
 - o dim_weather: Environmental conditions (temperature, season).
 - It includes **Indexes** to optimize query performance.
- The second one creates the **fact table fact_performance** and defines its structure:
 - Foreign Keys: Links to all dimension tables (athlete_key, event_key, etc.).
 - Measures:
 - Raw results (result_value, rank_position).
 - Standardized metrics (performance_score).
 - Environmental adjustments (altitude_adjusted_result, temperature_impact_factor).
 - It includes indexes to support common analytical queries (e.g., idx_fact_environmental_analysis for event/venue/weather analysis).
- Business Focus: Explicitly designed for environmental impact analysis (e.g., altitude/temperature effects on performance).

DATA WAREHOUSE LOADING

03_load_dimensions.py

04_load_facts.py

14/07/2025 11:41

PY File

7 KB

13/07/2025 15:28

PY File

41 KB

- The first file populates **Dimension tables** from the reconciled layer: It extracts data from **reconciled** tables, then transforms them (e.g., parses dates, calculates derived attributes like **season**), and finally loads into **dwh** dimensions.
- Key Logic: the load_date_dimension derives time attributes from competition dates, and include them in the date dimension.
- The second file populates the **Fact table fact_performance** with enriched data.
- Workflow:
 - a. Extract: Fetches performances from reconciled.performances.
 - b. Join Dimensions: Links athlete, event, venue, date, and weather data.
 - c. Calculate Metrics:
 - performance_score: Uses World Athletics coefficients for standardized scoring.
 - altitude_adjusted_result: Adjusts results for altitude effects (e.g., sprints benefit at high altitude).
 - temperature_impact_factor: Models temperature impact (e.g., distance events suffer in heat).
 - d. Filter Outliers: Removes unrealistic performances (e.g., 100m times < 9.57s).
 - e.**Load**: Inserts processed data into **fact_performance**.
- Environmental Focus:
 - Altitude/temperature adjustments are central to the calculations.
 - Indexes are optimized for environmental queries (e.g., idx_fact_weather_impact).

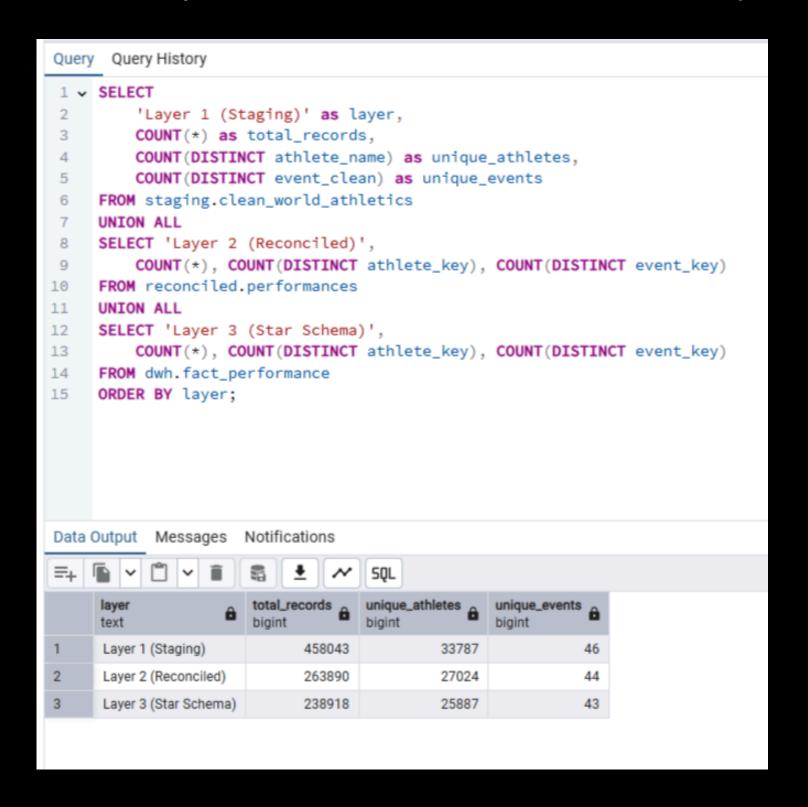
Executions:

```
2025-07-16 14:05:59,156 - INFO - Starting dimension loading from reconciled layer...
 2025-07-16 14:05:59,338 - INFO - Cleared dwh.dim athlete
 2025-07-16 14:05:59,408 - INFO - Cleared dwh.dim date
 2025-07-16 14:05:59,479 - INFO - Cleared dwh.dim event
 2025-07-16 14:05:59,548 - INFO - Cleared dwh.dim venue
 2025-07-16 14:05:59,607 - INFO - Cleared dwh.dim weather
 2025-07-16 14:05:59,617 - INFO - Loading date dimension from actual performance dates...
 2025-07-16 14:05:59,661 - INFO - Found 9425 unique competition dates
 2025-07-16 14:05:59,661 - INFO - Valid dates after parsing: 9425
 2025-07-16 14:06:00,463 - INFO - Date dimension loaded: 9425 actual dates
 2025-07-16 14:06:00,463 - INFO - Loading athlete dimension from reconciled.athletes...
 2025-07-16 14:06:03,199 - INFO - Athlete dimension loaded: 33785 records
 2025-07-16 14:06:03,208 - INFO - Loading event dimension from reconciled.events...
 2025-07-16 14:06:03,219 - INFO - Event dimension loaded: 44 records
 2025-07-16 14:06:03,219 - INFO - Loading venue dimension from reconciled.venues excluding venues without proper altitude value...
 2025-07-16 14:06:03,589 - INFO - Venue dimension loaded: 4884 records
 2025-07-16 14:06:03,589 - INFO - Loading weather dimension from reconciled.weather conditions...
 2025-07-16 14:06:03,941 - INFO - Weather dimension loaded: 3912 records
 2025-07-16 14:06:03.943 - INFO - dwh.dim athlete: 33785 records
 2025-07-16 14:06:03,949 - INFO - dwh.dim date: 9425 records
 2025-07-16 14:06:03,949 - INFO - dwh.dim event: 44 records
 2025-07-16 14:06:03,952 - INFO - dwh.dim venue: 4884 records
 2025-07-16 14:06:03,952 - INFO - dwh.dim weather: 3912 records
 2025-07-16 14:06:03,952 - INFO - All DWH dimensions loaded successfully.
○ PS C:\Users\Igorp\Documents\GitHub\athletics dw>
```

```
• 2025-07-16 14:06:35,665 - INFO - Starting fact table loading...
  2025-07-16 14:06:35,723 - INFO - FACT LOADING - 5 Essential Dimensions
  2025-07-16 14:06:37,459 - INFO - Loaded 260248 performance records from reconciled layer
 2025-07-16 14:06:37,561 - INFO - Loaded 5 essential dimensions:
  2025-07-16 14:06:37,561 - INFO - Athletes: 33785 records
  2025-07-16 14:06:37,561 - INFO - Events: 44 records
  2025-07-16 14:06:37,561 - INFO - Venues: 4884 records
  2025-07-16 14:06:37,561 - INFO - Weather: 3912 records
  2025-07-16 14:06:37,638 - INFO - Dates: 9425 records
  2025-07-16 14:06:37,638 - INFO - Joining 5 essential dimensions...
  2025-07-16 14:06:38,332 - INFO - After joining 5 dimensions: 240836 records
  2025-07-16 14:06:38,338 - INFO - 5-Dimension join success rates:
  2025-07-16 14:06:38,338 - INFO - athlete key: 240836/240836 (100.0%)
  2025-07-16 14:06:38,338 - INFO - event key: 240836/240836 (100.0%)
 2025-07-16 14:06:38,338 - INFO - venue_key: 240836/240836 (100.0%)
 2025-07-16 14:06:38,338 - INFO - date_key: 240836/240836 (100.0%)
  2025-07-16 14:06:38,338 - INFO - weather key: 240836/240836 (100.0%)
  2025-07-16 14:06:38,471 - INFO - Filtered out 0 records missing critical dimensions
  2025-07-16 14:06:38,471 - INFO - === FILTERING PERFORMANCE OUTLIERS ===
  2025-07-16 14:06:43,038 - INFO - Initial performances: 240,836
 2025-07-16 14:06:43,038 - INFO - Realistic performances: 238,918
  2025-07-16 14:06:43,038 - INFO - Filtered outliers: 1,918 (0.8%)
  2025-07-16 14:06:43,058 - INFO - TOP OUTLIER EVENTS:
  2025-07-16 14:06:43,059 - INFO - 10 Kilometres (F): 1.0 outliers, range: 1759.0-1759.0
  2025-07-16 14:06:43,059 - INFO - 10 Kilometres Race Walk (F): 169.0 outliers, range: 2476.0-2642.0
  2025-07-16 14:06:43,059 - INFO - 10 Kilometres Race Walk (M): 19.0 outliers, range: 2231.0-2311.0
  2025-07-16 14:06:43,062 - INFO - 10 Miles Road (F): 8.0 outliers, range: 3032.0-3048.0
  2025-07-16 14:06:43,062 - INFO - 10 Miles Road (M): 10.0 outliers, range: 2644.0-2706.0
  2025-07-16 14:06:43,062 - INFO - 100 Metres Hurdles (F): 1.0 outliers, range: 12.12-12.12
  2025-07-16 14:06:43,063 - INFO - 1000 Metres (F): 1.0 outliers, range: 148.98-148.98
  2025-07-16 14:06:43,063 - INFO - 10000 Metres (F): 1.0 outliers, range: 1757.45-1757.45
 2025-07-16 14:06:43,063 - INFO - 10000 Metres (M): 1.0 outliers, range: 1571.0-1571.0
  2025-07-16 14:06:43,063 - INFO - 10000 Metres Race Walk (F): 50.0 outliers, range: 2516.23-2639.73
  2025-07-16 14:06:43,148 - INFO - Outlier filtering removed 1918 suspicious performances
  2025-07-16 14:06:43,209 - INFO - Filtered out 0 records missing critical dimensions
  2025-07-16 14:06:43,227 - INFO - Calculating ALL performance measures...
 2025-07-16 14:06:43,228 - INFO - Calculating performance_score
 2025-07-16 14:06:47,351 - INFO - Calculating altitude_adjusted_result
  2025-07-16 14:06:51,238 - INFO - Calculating temperature impact factor
  2025-07-16 14:06:54,069 - INFO - Adding performance context flags...
  2025-07-16 14:06:54,273 - INFO - SIMPLIFIED FACT TABLE SUMMARY:
  2025-07-16 14:06:54,273 - INFO - Total performances: 238,918
 2025-07-16 14:06:54,281 - INFO - Unique athletes: 25,887
  2025-07-16 14:06:54,281 - INFO - Unique events: 43
  2025-07-16 14:06:54,288 - INFO - Unique venues: 1,627
  2025-07-16 14:06:54,291 - INFO - Unique dates: 9,010
  2025-07-16 14:06:54,298 - INFO - Unique weather conditions: 1,971
  2025-07-16 14:06:54,298 - INFO - ALL CALCULATION FUNCTIONS USED:
  2025-07-16 14:06:54,299 - INFO - performance_score: avg = 1133.9
  2025-07-16 14:06:54,299 - INFO - altitude_adjusted_result: avg = 583.886
  2025-07-16 14:06:54,299 - INFO - temperature impact factor: avg = 0.984
  2025-07-16 14:06:54,299 - INFO - Loading 238918 records to dwh.fact_performance...
  2025-07-16 14:08:08,749 - INFO - Total fact records: 238918
○ PS C:\Users\Igorp\Documents\GitHub\athletics dw> [
```


DATA COMPLETENESS CHECK

Counts performance records across all layers:



DATA QUALITY VALIDATION

• Check foreign key integrity in the fact table:

```
Query Query History
1 v SELECT
          'Missing Athletes' as check_type.
         COUNT(*) as failed_records,
         CASE WHEN COUNT(*) = 0 THEN 'PASS' ELSE 'FAIL' END as status
     FROM dwh.fact_performance f
     LEFT JOIN dwh.dim_athlete a ON f.athlete_key = a.athlete_key
     WHERE a.athlete_key IS NULL
     UNION ALL
10
11
     SELECT 'Missing Events', COUNT(*),
         CASE WHEN COUNT(*) = 0 THEN 'PASS' ELSE 'FAIL' END
     FROM dwh.fact_performance f
     LEFT JOIN dwh.dim_event e ON f.event_key = e.event_key
     WHERE e.event_key IS NULL
16
17
     UNION ALL
18
     SELECT 'Missing Venues', COUNT(*),
20
         CASE WHEN COUNT(*) = 0 THEN 'PASS' ELSE 'FAIL' END
     FROM dwh.fact_performance f
     LEFT JOIN dwh.dim_venue v ON f.venue_key = v.venue_key
     WHERE v.venue_key IS NULL
24
25
     ORDER BY check_type;
Data Output Messages Notifications
     Missing Athletes
                             0 PASS
     Missing Events
                             0 PASS
                             0 PASS
     Missing Venues
```

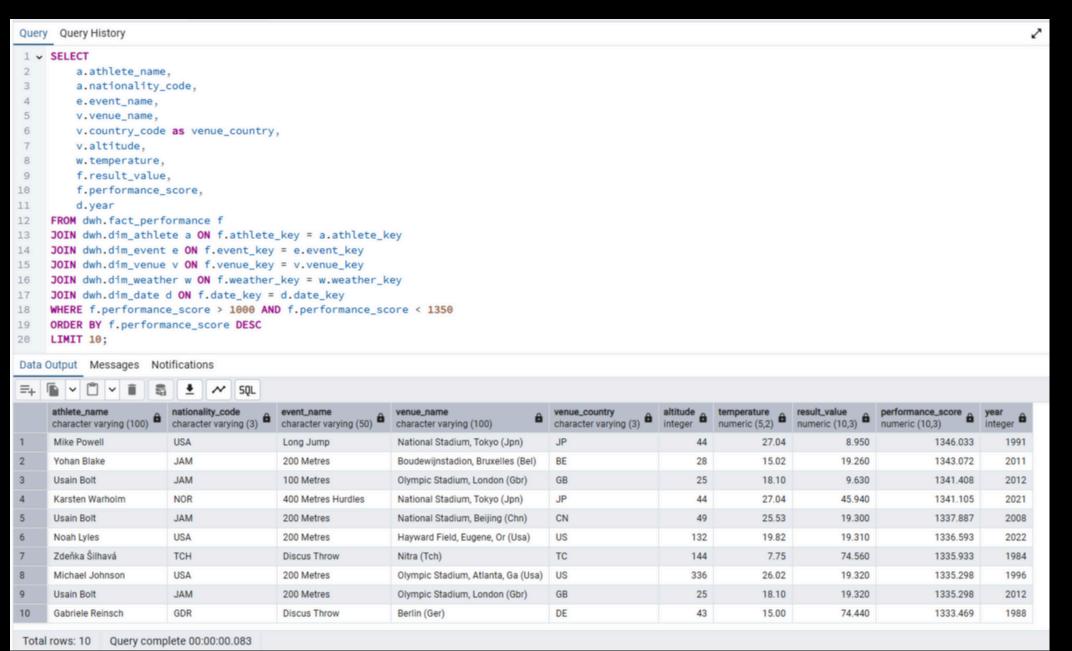
PERFORMANCE DATA QUALITY

Validate performance scores and key measures:



SAMPLE DATA VERIFICATION

• Show sample of integrated data to verify joins worked correctly



BUSINESS LOGIC VALIDATION

Verify event categorization and measurement units

```
Query History
1 v SELECT
         e.event_category,
         e.measurement_unit,
         COUNT(*) as performances,
         ROUND(MIN(f.performance_score), 1) as min_score,
         ROUND(AVG(f.performance_score), 1) as avg_score,
         ROUND(MAX(f.performance_score), 1) as max_score,
         ROUND(STDDEV(f.performance_score), 1) as score_variance
    FROM dwh.fact_performance f
    JOIN dwh.dim_event e ON f.event_key = e.event_key
     GROUP BY e.event_category, e.measurement_unit
    ORDER BY e.event_category, performances DESC;
           Messages
                        character varying (20)
    character varying (20)
                                                                     numeric
                                                                                 numeric
                                                    82093
                                                               856.3
                                                                          1087.5
                                                                                      1372.1
                                                                                                      80.9
                         meters
                                                     7566
                                                               979.4
                                                                          1134.3
                                                                                      1285.0
                                                                                                      56.0
     Road
                         seconds
                                                   149259
                                                               801.4
                                                                          1159.4
                                                                                      1355.9
                                                                                                      73.0
     Track
                         seconds
```

1) Environmental Impact Analysis:

- Cross-sectional analysis of environmental factors
- Operation: DICE
 - It builds a 3-D "cube" over
 - i. Altitude category
 - ii. Temperature category
 - iii.Event category

```
Query Query History
1 v SELECT
          v.altitude_category,
          w.temperature_category,
          e.event_category,
          COUNT(*) as performances,
          ROUND(AVG(f.performance_score), 1) as avg_performance_score,
          ROUND(AVG(f.temperature_impact_factor), 3) as avg_temp_impact,
          ROUND(AVG(f.altitude_adjusted_result - f.result_value), 3) as avg_altitude_adjustment
     FROM dwh.fact_performance f
     JOIN dwh.dim_venue v ON f.venue_key = v.venue_key
     JOIN dwh.dim_weather w ON f.weather_key = w.weather_key
     JOIN dwh.dim_event e ON f.event_key = e.event_key
     WHERE v.altitude_category IS NOT NULL
        AND w.temperature_category IS NOT NULL
     GROUP BY v.altitude_category, w.temperature_category, e.event_category
     HAVING COUNT(*) >= 20
     ORDER BY avg_performance_score DESC
Data Output
            Messages Notifications
=+ | □
                                                                                                      avg_temp_impact
                                              character varying (20)
                                              Track
                                                                           2827
                                                                                                1187.0
                                                                                                                  0.949
      Sea Level
                                                                                                                                       -0.015
                                                                                                1172.2
                          Cold
                                              Track
                                                                           1322
                                                                                                                  0.948
                                                                                                                                       -51.784
                                              Track
                                                                          64064
                                                                                                1172.1
                                                                                                                  0.980
      Sea Level
                          Moderate
                                                                                                                                        -0.231
                                              Track
                                                                          25193
                                                                                                1167.0
                                                                                                                  0.971
                          Warm
                                                                                                                                        -0.092
      Sea Level
                                                                           2486
                                                                                                1165.2
      Moderate
                          Warm
                                              Track
                                                                                                                  0.967
                                                                                                                                        -4.996
      High
                          Moderate
                                              Track
                                                                            188
                                                                                                1158.8
                                                                                                                  0.984
                                                                                                                                       -10.987
                                                                                                1156.2
                                                                                                                  0.985
      Moderate
                          Moderate
                                              Track
                                                                           2822
                                                                                                                                       -3.975
                                                                                                1152.0
                                              Track
                                                                           2829
                                                                                                                  0.993
                                                                                                                                        -6.752
      Moderate
                          Cool
      Moderate
                          Cool
                                              Road
                                                                            209
                                                                                                1150.0
                                                                                                                  0.991
                                                                                                                                        0.000
                                              Track
                                                                          41821
                                                                                                1148.4
                                                                                                                  0.991
                                                                                                                                        -0.155
      Sea Level
                          Cool
                                                                                                1143.6
      Sea Level
                          Cold
                                              Road
                                                                           1542
                                                                                                                  0.979
                                                                                                                                        0.000
12
                                              Track
                                                                            737
                                                                                                1142.8
                                                                                                                  0.986
      Moderate
                          Cold
                                                                                                                                       -11.414
      Sea Level
                                              Road
                                                                           2817
                                                                                                1136.9
                                                                                                                  0.992
                                              Track
                                                                             76
                                                                                                1136.5
                                                                                                                  0.995
      High
                          Cool
                                                                                                                                        -5.145
                          Moderate
                                              Road
                                                                           1916
                                                                                                1130.2
                                                                                                                  0.981
                                                                                                                                        0.000
      Sea Level
Total rows: 15 Query complete 00:00:00.259
```

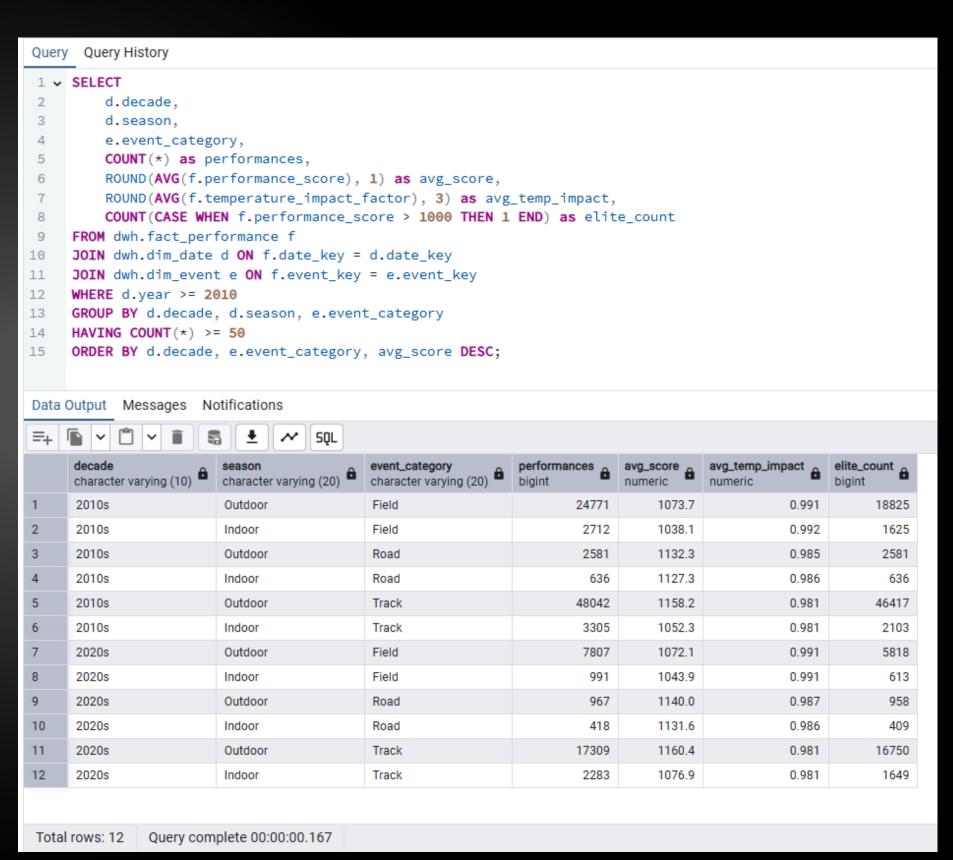
2) Geographic Performance Patterns:

- High-level geographic summary
- Operation: ROLL-UP along the venue → city → country hierarchy
- Aggregates total performances, unique athletes, events covered at country level.

```
Query Query History
1 v SELECT
         v.country_code,
         COUNT(*) as total_performances,
         COUNT(DISTINCT f.athlete_key) as unique_athletes,
         COUNT(DISTINCT f.event_key) as events_covered,
         ROUND(AVG(f.performance_score), 1) as avg_performance_score,
         COUNT(CASE WHEN f.performance_score > 1000 THEN 1 END) as elite_performances,
          ROUND(AVG(v.altitude), 0) as avg_altitude
     FROM dwh.fact_performance f
     JOIN dwh.dim_venue v ON f.venue_key = v.venue_key
     WHERE v.country_code IS NOT NULL AND v.country_code != 'Unknown'
     GROUP BY v.country_code
     HAVING COUNT(*) >= 100
     ORDER BY avg_performance_score DESC
     LIMIT 15;
           Messages Notifications
                                         unique_athletes
                                                                       avg_performance_score
                                                                                                           avg_altitude
                                                         events_covered
                                                                                            elite_performances
                                     294
                                                    155
                                                                    22
                                                                                     1181.9
                                                                                                         294
                                                                                                                      111
                                    5493
                                                   2709
                                                                    28
                                                                                      1180.6
                                                                                                         5402
                                                                                                                       29
     СН
                                    12637
                                                   4151
                                                                    34
                                                                                     1176.6
                                                                                                        12429
                                                                                                                      431
                                    4531
                                                   2474
                                                                    33
                                                                                     1176.2
                                                                                                        4441
                                                                                                                       27
                                     144
                                                                    15
                                                    111
                                                                                     1175.5
                                                                                                         141
                                                                                                                      640
                                    1357
                                                    609
                                                                    20
                                                                                     1170.6
                                                                                                        1305
                                                                                                                     1697
                                                   1995
                                                                    25
                                                                                      1164.8
                                                                                                        3763
                                                                                                                       11
                                    1311
                                                    584
                                                                    26
                                                                                     1163.1
                                                                                                        1309
                                                                                                                      186
      MA
                                                   1188
                                                                    29
                                    1759
                                                                                      1160.6
                                                                                                         1666
                                                                                                                       61
10
                                     209
                                                    130
                                                                    16
                                                                                     1159.1
                                                                                                         206
                                                                                                                     1302
                                                                    36
                                                   4458
                                                                                      1156.8
                                                                                                        10271
                                                                                                                      152
12
                                    4784
                                                    908
                                                                    20
                                                                                     1156.2
                                                                                                        4759
                                                                                                                       64
                                                                    24
                                    2017
                                                   1282
                                                                                     1150.2
                                                                                                        1924
                                                                                                                      132
                                                                    27
                                    5603
                                                   2503
                                                                                     1150.1
                                                                                                        5358
                                                                                                                       75
15
                                     229
                                                    175
                                                                                     1148.6
                                                                                                         225
                                                                                                                      284
Total rows: 15 Query complete 00:00:00.429
```

3) Temporal Performance Trends

- Performance evolution over time and seasons
- Operation: DRILL-DOWN Breaks down date dimension into multiple levels :
- 1.Level 1: Decade (2010s, 2020s)
- 2.Level 2: Season (Indoor, Outdoor)
- The GROUP BY Event Category is used to show how each category performs within those time buckets.



4) Venue Specialization Analysis

- Comparison of venue strengths across event types
- Operation: PIVOT Rotates event_group dimension from rows to columns

```
Query History
           v.venue_name,
           v.country_code,
           v.altitude_category,
           COUNT(*) as total_performances,
           ROUND(AVG(CASE WHEN e.event_group = 'Sprint' THEN f.performance_score END), 1) as sprint_avg,
           ROUND(AVG(CASE WHEN e.event_group = 'Distance' THEN f.performance_score END), 1) as distance_avg,
           ROUND(AVG(CASE WHEN e.event_group = 'Jumps' THEN f.performance_score END), 1) as jumps_avg,
10
           ROUND(AVG(CASE WHEN e.event_group = 'Throws' THEN f.performance_score END), 1) as throws_avg,
11
12
           ROUND(AVG(f.performance_score), 1) as overall_avg
      FROM dwh.fact_performance f
      JOIN dwh.dim_venue v ON f.venue_key = v.venue_key
      JOIN dwh.dim_event e ON f.event_key = e.event_key
      WHERE v.venue_name != 'Unknown'
      GROUP BY v.venue_name, v.country_code, v.altitude_category
      HAVING COUNT(\star) >= 50
        AND COUNT(DISTINCT e.event_group) >= 2
20
      ORDER BY overall_avg DESC
21
            Messages Notifications
Data Output
      character varying (100)
      Jserra Catholic Hs. San Juan Capistrano, Ca (Usa)
                                                                      Sea Level
                                                                                                         234
                                                                                                                   1162.4
                                                                                                                                  1203.7
                                                                                                                                              1134.8
                                                                                                                                                              [null]
                                                                                                                                                                         1201.5
       Parliament Hill Fields Athletics Track, London (Gbr)
                                                                      Sea Level
                                                                                                          51
                                                                                                                     [null]
                                                                                                                                  1205.0
                                                                                                                                                [null]
                                                                                                                                                             915.3
                                                                                                                                                                         1199.3
                                                DE
                                                                      Sea Level
                                                                                                                   1170.3
                                                                                                                                  1217.8
                                                                                                                                                [null]
                                                                                                                                                             955.5
                                                                                                                                                                         1196.4
       Herzogenaurach (Ger)
                                                CH
      Zürich (Sui)
                                                                     Sea Level
                                                                                                        3436
                                                                                                                   1179.9
                                                                                                                                  1211.9
                                                                                                                                               1154.4
                                                                                                                                                            1129.2
                                                                                                                                                                         1185.4
                                                GD
                                                                     Sea Level
                                                                                                         105
                                                                                                                   1179.1
                                                                                                                                  1207.9
                                                                                                                                               1207.6
                                                                                                                                                            1179.2
                                                                                                                                                                         1185.2
       Berlin (Gdr)
       Sechseläutenplatz, Zürich (Sui)
                                                CH
                                                                                                          74
                                                                                                                                   [null]
                                                                                                                                              1169.6
                                                                                                                                                            1161.0
                                                                                                                                                                         1185.1
                                                                     Sea Level
                                                                                                                    [null]
                                                NO
                                                                     Sea Level
                                                                                                        2157
                                                                                                                   1168.9
                                                                                                                                  1214.0
                                                                                                                                              1152.7
                                                                                                                                                            1106.5
                                                                                                                                                                         1184.8
      Oslo (Nor)
                                                BE
                                                                                                                   1169.1
                                                                                                                                  1219.2
                                                                                                                                              1155.7
                                                                                                                                                            1117.7
                                                                                                                                                                         1183.9
                                                                     Sea Level
                                                                                                        2661
      Bruxelles (Bel)
                                                BE
                                                                                                        2539
                                                                                                                                              1151.8
       Boudewijnstadion, Bruxelles (Bel)
                                                                     Sea Level
                                                                                                                   1179.5
                                                                                                                                  1218.6
                                                                                                                                                            1114.3
                                                                                                                                                                         1183.6
                                                NL
                                                                                                          77
                                                                                                                   1129.6
                                                                                                                                  1207.0
                                                                                                                                                            1077.8
                                                                                                                                                                         1183.1
       Tilburg (Ned)
                                                                     Sea Level
                                                                                                                                                [null]
                                                GD
                                                                                                                   1169.9
                                                                                                                                  1203.6
                                                                                                                                              1178.4
                                                                                                                                                            1177.9
                                                                                                                                                                         1180.1
       Jena (Gdr)
                                                                      Sea Level
       Suhaim Bin Hamad Stadium, Doha (Qat)
                                                QA
                                                                      Sea Level
                                                                                                                   1184.2
                                                                                                                                  1215.2
                                                                                                                                              1153.9
                                                                                                                                                            1118.5
                                                                                                                                                                         1179.4
                                                FR
                                                                                                         100
                                                                                                                                              1119.8
       Stade Delort, Marseille (Fra)
                                                                     Sea Level
                                                                                                                   1124.4
                                                                                                                                  1206.0
                                                                                                                                                            1045.1
                                                                                                                                                                         1178.8
       Stade Olympique De La Pontaise, Lausanne (Sui)
                                                CH
                                                                     Sea Level
                                                                                                        4050
                                                                                                                   1178.9
                                                                                                                                  1211.7
                                                                                                                                              1153.3
                                                                                                                                                            1122.0
                                                                                                                                                                         1177.8
       Lausanne (Sui)
                                                CH
                                                                     Sea Level
                                                                                                                   1176.6
                                                                                                                                  1206.4
                                                                                                                                              1142.7
                                                                                                                                                            1110.2
                                                                                                                                                                         1177.6
 Total rows: 15 Query complete 00:00:00.515
```

5) Athlete Performance Ranking

- Top performing athletes with contextual environmental data
- Operation: DRILL-DOWN From event category → specific event name

```
Query Query History
 1 ➤ WITH top_performers AS (
         SELECT
             a.athlete_name,
             a.nationality_code,
             e.event_name,
             f.performance_score,
             v.venue_name,
             v.altitude,
9
             w.temperature,
10
             d.year,
11
             ROW_NUMBER() OVER (PARTITION BY e.event_name ORDER BY f.performance_score DESC) as rank_in_event
12
         FROM dwh.fact_performance f
13
         JOIN dwh.dim_athlete a ON f.athlete_key = a.athlete_key
14
         JOIN dwh.dim_event e ON f.event_key = e.event_key
15
         JOIN dwh.dim_venue v ON f.venue_key = v.venue_key
16
         JOIN dwh.dim_weather w ON f.weather_key = w.weather_key
17
         JOIN dwh.dim_date d ON f.date_key = d.date_key
18
         WHERE f.performance_score > 1000
19
20
     SELECT
21
         event_name,
22
         athlete_name,
23
         nationality_code,
24
         performance_score,
25
         venue_name,
26
         altitude,
27
         temperature,
28
         year,
29
         rank_in_event
     FROM top_performers
     WHERE rank_in_event <= 3 -- Top 3 per event
     ORDER BY event_name, rank_in_event;
```

5° Query Result (partial):

Data Output Messages Notifications									
=+ (a) v (1) v (a) (a) (b) (b)									
	event_name character varying (50)	athlete_name character varying (100)	nationality_code character varying (3)	performance_score numeric (10,3)	venue_name character varying (100)	altitude integer	temperature numeric (5,2)	year integer	rank_in_event bigint
1	10000 Metres	Kenenisa Bekele	ETH	1300.177	Boudewijnstadion, Bruxelles (Bel)	28	18.16	2005	1
2	10000 Metres	Kenenisa Bekele	ETH	1292.614	Eugene, Or (Usa)	132	15.50	2008	2
3	10000 Metres	Paul Tergat	KEN	1290.931	Bruxelles (Bel)	28	18.16	1997	3
4	10000 Metres Race Walk	Evan Dunfee	CAN	1198.742	Alexander Stadium, Birmingham (Gbr)	149	26.43	2022	1
5	10000 Metres Race Walk	Kevin Campion	FRA	1198.359	Paris (Fra)	42	18.63	2013	2
6	10000 Metres Race Walk	Walter Arena	ITA	1197.841	Catania (Ita)	40	12.57	1990	3
7	1000 Metres	Noah Ngeny	KEN	1250.119	Rieti (Ita)	395	18.15	1999	1
8	1000 Metres	Maria De Lurdes Mutola	MOZ	1248.311	Bruxelles (Bel)	28	18.16	1995	2
9	1000 Metres	Sebastian Coe	GBR	1248.071	Oslo (Nor)	26	16.68	1981	3
10	100 Metres	Usain Bolt	JAM	1355.947	Olympiastadion, Berlin (Ger)	43	19.00	2009	1
11	100 Metres	Usain Bolt	JAM	1341.408	Olympic Stadium, London (Gbr)	25	18.10	2012	2
12	100 Metres	Usain Bolt	JAM	1324.054	National Stadium, Beijing (Chn)	49	25.53	2008	3
13	100 Metres Hurdles	Kendra Harrison	USA	1259.099	Olympic Stadium, London (Gbr)	25	18.71	2016	1
14	100 Metres Hurdles	Kendra Harrison	USA	1252.733	Hayward Field, Eugene, Or (Usa)	132	12.68	2016	2
15	100 Metres Hurdles	Ginka Zagorcheva	BUL	1251.144	Drama (Gre)	122	25.40	1987	3
16	10 Kilometres	Rhonex Kipruto	KEN	1285.018	Valencia (Esp)	10	-2.12	2020	1
17	10 Kilometres	Joyciline Jepkosgei	KEN	1273.179	Praha (Cze)	202	13.70	2017	2
18	10 Kilometres	Joshua Cheptegei	UGA	1272.597	Valencia (Esp)	10	0.38	2019	3
19	10 Kilometres Race Walk	Luke Adams	AUS	1198.576	Beijing (Chn)	49	20.43	2010	1
20	10 Kilometres Race Walk	Chilsung Park	KOR	1197.986	Beijing (Chn)	49	20.43	2010	2
21	10 Kilometres Race Walk	Perseus Karlström	SWE	1197.986	Madrid (Esp)	665	16.67	2022	3
22	10 Miles Road	Charles Waweru Kamathi	KEN	1224.721	Amsterdam (Ned)	13	15.02	2002	1
23	10 Miles Road	Keisuke Morita	JPN	1224.721	Kosa (Jpn)	179	7.30	2022	2
24	10 Miles Road	Samuel Kamau Wanjiru	KEN	1223.734	Kosa (Jpn)	179	7.30	2005	3
25	110 Metres Hurdles	Aries Merritt	USA	1294.108	Boudewijnstadion, Bruxelles (Bel)	28	15.02	2012	1
26	110 Metres Hurdles	Grant Holloway	USA	1292.526	Hayward Field, Eugene, Or (Usa)	132	15.50	2021	2
27	110 Metres Hurdles	Xiang Liu	CHN	1281.477	Stade Olympique De La Pontaise, Lausanne (Sui)	453	22.00	2006	3
28	1500 Metres	Hicham El Guerrouj	MAR	1302.444	Stadio Olimpico, Roma (Ita)	52	24.45	1998	1
29	1500 Metres	Hicham El Guerrouj	MAR	1301.412	Bruxelles (Bel)	28	18.16	2001	2
30	1500 Metres	Bernard Lagat	KEN	1299.520	Bruxelles (Bel)	28	18.16	2001	3
31	15 Kilometres	Paul Tergat	KEN	1208.802	La Courneuve (Fra)	38	12.72	1994	1
	15 Kilometres	Emmanuel Moi Maru	KEN	1207.641	Valencia (Esp)	10		2021	2
	15 Kilometres	Todd Williams	USA	1203.002	Jacksonville. Fl (Usa)	218	16.36	1995	3
		lete 00:00:01.418							

6) Environmental Optimization Insights

- Best environmental conditions for each event type
- Operation: DRILL-ACROSS analyzes the same measures (performance_score) across different dimensional perspectives:
- 1. Event Group × Altitude Category
- 2. Event Group × Temperature Category

Query Query History 1 v SELECT e.event_group, 'Optimal Altitude' as condition_type, v.altitude_category as optimal_value, COUNT(*) as sample_size, ROUND(AVG(f.performance_score), 1) as avg_performance FROM dwh.fact_performance f JOIN dwh.dim_event e ON f.event_key = e.event_key JOIN dwh.dim_venue v ON f.venue_key = v.venue_key WHERE v.altitude_category IS NOT NULL 10 GROUP BY e.event_group, v.altitude_category 11 HAVING COUNT(*) >= 100 12 13 14 UNION ALL 15 16 SELECT 17 e.event_group, 'Optimal Temperature', 18 19 w.temperature_category, 20 COUNT(*), ROUND(AVG(f.performance_score), 1) 21 FROM dwh.fact_performance f 22 23 JOIN dwh.dim_event e ON f.event_key = e.event_key 24 JOIN dwh.dim_weather w ON f.weather_key = w.weather_key WHERE w.temperature_category IS NOT NULL 25 GROUP BY e.event_group, w.temperature_category 26 27 HAVING COUNT(*) >= 100 28 29 ORDER BY event_group, avg_performance DESC;

6° Query Result:

OLAP QUERIES

Data	Data Output Messages Notifications						
=+		± ✓ SQL					
	event_group character varying (30)	condition_type text	optimal_value character varying (20)	sample_size bigint	avg_performance numeric		
1	Distance	Optimal Temperature	Hot	1359	1203.7		
2	Distance	Optimal Temperature	Moderate	25875	1184.8		
3	Distance	Optimal Temperature	Warm	8419	1176.9		
4	Distance	Optimal Altitude	High	1101	1172.8		
5	Distance	Optimal Altitude	Moderate	2384	1158.3		
6	Distance	Optimal Altitude	Sea Level	58013	1155.2		
7	Distance	Optimal Temperature	Cool	21082	1135.7		
8	Distance	Optimal Temperature	Cold	4763	1034.4		
9	Distance (Road)	Optimal Temperature	Cold	1643	1141.5		
10	Distance (Road)	Optimal Temperature	Cool	3040	1137.6		
11	Distance (Road)	Optimal Altitude	Sea Level	6988	1134.6		
12	Distance (Road)	Optimal Altitude	Moderate	527	1133.5		
13	Distance (Road)	Optimal Temperature	Moderate	2069	1129.7		
14	Distance (Road)	Optimal Temperature	Warm	776	1121.2		
15	Hurdles	Optimal Temperature	Hot	513	1175.6		
16	Hurdles	Optimal Temperature	Moderate	12622	1174.8		
17	Hurdles	Optimal Altitude	Sea Level	24250	1173.9		
18	Hurdles	Optimal Temperature	Cool	7026	1172.9		
19	Hurdles	Optimal Temperature	Warm	5433	1171.7		
20	Hurdles	Optimal Altitude	Moderate	1733	1167.6		
21	Hurdles	Optimal Temperature	Cold	502	1165.3		
22	Hurdles	Optimal Altitude	High	113	1163.2		
23	Jumps	Optimal Temperature	Hot	387	1147.8		
24	Jumps	Optimal Temperature	Moderate	8067	1144.6		
25	Jumps	Optimal Altitude	Sea Level	15833	1144.0		
26	Jumps	Optimal Temperature	Cool	4831	1143.7		
27	Jumps	Optimal Temperature	Warm	3738	1142.4		
28	Jumps	Optimal Altitude	Moderate	1418	1142.2		
29	Jumps	Optimal Temperature	Cold	288	1136.1		
30	Sprint	Optimal Temperature	Hot	959	1169.2		
31	Sprint	Optimal Temperature	Warm	13904	1158.6		
32	Sprint	Optimal Temperature	Moderate	28577	1157.7		

33	Sprint		Optimal Altitude	Sea Level	56455	1157.6
34	Sprint		Optimal Temperature	Cool	16618	1154.7
35	Sprint		Optimal Altitude	High	449	1153.7
36	Sprint		Optimal Altitude	Moderate	4761	1151.1
37	Sprint		Optimal Temperature	Cold	1607	1150.3
38	Throws		Optimal Temperature	Hot	1073	1104.0
39	Throws		Optimal Temperature	Moderate	26177	1074.9
40	Throws		Optimal Altitude	Moderate	5743	1074.1
41	Throws		Optimal Altitude	Sea Level	58913	1072.4
42	Throws		Optimal Temperature	Cool	22983	1071.9
43	Throws		Optimal Temperature	Warm	11429	1071.5
44	Throws		Optimal Temperature	Cold	3120	1049.3
45	Throws		Optimal Altitude	High	126	1031.4
Total rows: 45 Query complete 00:00:00.285						

