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## Google BigQuery The Definitive Guide

Data Warehousing, Analytics, and Machine



Valliappa Lakshmanan & Jordan Tigani

## Google BigQuery: The Definitive Guide

Data Warehousing, Analytics, and Machine Learning at Scale

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Beijing • Boston • Farnham • Sebastopol • Tokyo

## Google BigQuery The Definitive Guide

- 1. Preface
  - a. Who Is This Book For?
  - b. Conventions Used in This Book
  - c. Using Code Examples
  - d. O'Reilly Online Learning
  - e. How to Contact Us
  - f. Acknowledgments
- 1. What Is Google BigQuery?
  - a. Data Processing Architectures
    - i. Relational Database Management System
    - ii. MapReduce Framework
    - iii. BigQuery: A Serverless, Distributed SQL Engine
  - b. Working with BigQuery
    - i. Deriving Insights Across Datasets
    - ii. ETL, EL, and ELT
    - iii. Powerful Analytics
    - iv. Simplicity of Management
  - c. How BigQuery Came About
  - d. What Makes BigQuery Possible?
    - i. Separation of Compute and Storage
    - ii. Storage and Networking Infrastructure
    - iii. Managed Storage
    - iv. Integration with Google Cloud Platform
    - v. Security and Compliance
  - e. Summary
- 3. 2. Query Essentials
  - a. Simple Queries
    - i. Retrieving Rows by Using SELECT
    - ii. Aliasing Column Names with AS
    - iii. Filtering with WHERE
    - iv. SELECT \*, EXCEPT, REPLACE
    - v. Subqueries with WITH
    - vi. Sorting with ORDER BY
  - b. Aggregates
    - i. Computing Aggregates by Using GROUP BY
    - ii. Counting Records by Using COUNT
    - iii. Filtering Grouped Items by Using HAVING
    - iv. Finding Unique Values by Using DISTINCT
  - c. A Brief Primer on Arrays and Structs
    - i. Creating Arrays by Using ARRAY AGG
    - ii. Array of STRUCT
    - iii. TUPLE
    - iv. Working with Arrays
    - v. UNNEST an Array
  - d. Joining Tables
    - i. The JOIN Explained

- ii. INNER JOIN
- iii. CROSS JOIN
- iv. OUTER JOIN
- e. Saving and Sharing
  - i. Query History and Caching
  - ii. Saved Queries
  - iii. Views Versus Shared Queries
- f. Summary
- 4. 3. Data Types, Functions, and Operators
  - a. Numeric Types and Functions
    - i. Mathematical Functions
    - ii. Standard-Compliant Floating-Point Division
    - iii. SAFE Functions
    - iv. Comparisons
    - v. Precise Decimal Calculations with NUMERIC
  - b. Working with BOOL
    - i. Logical Operations
    - ii. Conditional Expressions
    - iii. Cleaner NULL-Handling with COALESCE
    - iv. Casting and Coercion
    - v. Using COUNTIF to Avoid Casting Booleans
  - c. String Functions
    - i. Internationalization
    - ii. Printing and Parsing
    - iii. String Manipulation Functions
    - iv. Transformation Functions
    - v. Regular Expressions
    - vi. Summary of String Functions
  - d. Working with TIMESTAMP
    - i. Parsing and Formatting Timestamps
    - ii. Extracting Calendar Parts
    - iii. Arithmetic with Timestamps
    - iv. Date, Time, and DateTime
  - e. Working with GIS Functions
  - f. Summary
- 5. 4. Loading Data into BigQuery
  - a. The Basics
    - i. Loading from a Local Source
    - ii. Specifying a Schema
    - iii. Copying into a New Table
    - iv. Data Management (DDL and DML)
    - v. Loading Data Efficiently
  - b. Federated Queries and External Data Sources
    - i. How to Use Federated Queries
    - ii. When to Use Federated Queries and External Data Sources
    - iii. Interactive Exploration and Querying of Data in Google Sheets
    - iv. SQL Queries on Data in Cloud Bigtable
  - c. Transfers and Exports
    - i. Data Transfer Service

- ii. Exporting Stackdriver Logs
- iii. Using Cloud Dataflow to Read/Write from BigQuery
- d. Moving On-Premises Data
  - i. Data Migration Methods
- e. Summary
- 6. 5. Developing with BigQuery
  - a. Developing Programmatically
    - i. Accessing BigQuery via the REST API
    - ii. Google Cloud Client Library
  - b. Accessing BigQuery from Data Science Tools
    - i. Notebooks on Google Cloud Platform
    - ii. Working with BigQuery, pandas, and Jupyter
    - iii. Working with BigQuery from R
    - iv. Cloud Dataflow
    - v. JDBC/ODBC drivers
    - vi. Incorporating BigQuery Data into Google Slides (in G Suite)
  - c. Bash Scripting with BigQuery
    - i. Creating Datasets and Tables
    - ii. Executing Queries
    - iii. BigQuery Objects
  - d. Summary
- 7. 6. Architecture of BigQuery
  - a. High-Level Architecture
    - i. Life of a Query Request
    - ii. BigQuery Upgrades
  - b. Query Engine (Dremel)
    - i. Dremel Architecture
    - ii. Query Execution
  - c. Storage
    - i. Storage Data
    - ii. Metadata
  - d. Summary
- 8. 7. Optimizing Performance and Cost
  - a. Principles of Performance
    - i. Key Drivers of Performance
    - ii. Controlling Cost
  - b. Measuring and Troubleshooting
    - i. Measuring Query Speed Using REST API
    - ii. Measuring Query Speed Using BigQuery Workload Tester
    - iii. Troubleshooting Workloads Using Stackdriver
    - iv. Reading Query Plan Information
  - c. Increasing Query Speed
    - i. Minimizing I/O
    - ii. Caching the Results of Previous Queries
    - iii. Performing Efficient Joins
    - iv. Avoiding Overwhelming a Worker
    - v. Using Approximate Aggregation Functions
  - d. Optimizing How Data Is Stored and Accessed
    - i. Minimizing Network Overhead

- ii. Choosing an Efficient Storage Format
- iii. Partitioning Tables to Reduce Scan Size
- iv. Clustering Tables Based on High-Cardinality Keys
- e. Time-Insensitive Use Cases
  - i. Batch Queries
  - ii. File Loads
- f. Summary
  - i. Checklist
- 9. 8. Advanced Queries
  - a. Reusable Queries
    - i. Parameterized Queries
    - ii. SQL User-Defined Functions
    - iii. Reusing Parts of Queries
  - b. Advanced SQL
    - i. Working with Arrays
    - ii. Window Functions
    - iii. Table Metadata
    - iv. Data Definition Language and Data Manipulation Language
  - c. Beyond SQL
    - i. JavaScript UDFs
    - ii. Scripting
  - d. Advanced Functions
    - i. BigQuery Geographic Information Systems
    - ii. Useful Statistical Functions
    - iii. Hash Algorithms
  - e. Summary
- 10. 9. Machine Learning in BigQuery
  - a. What Is Machine Learning?
    - i. Formulating a Machine Learning Problem
    - ii. Types of Machine Learning Problems
  - b. Building a Regression Model
    - i. Choose the Label
    - ii. Exploring the Dataset to Find Features
    - iii. Creating a Training Dataset
    - iv. Training and Evaluating the Model
    - v. Predicting with the Model
    - vi. Examining Model Weights
    - vii. More-Complex Regression Models
  - c. Building a Classification Model
    - i. Training
    - ii. Evaluation
    - iii. Prediction
    - iv. Choosing the Threshold
  - d. Customizing BigQuery ML
    - i. Controlling Data Split
    - ii. Balancing Classes
    - iii. Regularization
  - e. k-Means Clustering
    - i. What's Being Clustered?

- ii. Clustering Bicycle Stations
- iii. Carrying Out Clustering
- iv. Understanding the Clusters
- v. Data-Driven Decisions
- f. Recommender Systems
  - i. The MovieLens Dataset
  - ii. Matrix Factorization
  - iii. Making Recommendations
  - iv. Incorporating User and Movie Information
- g. Custom Machine Learning Models on GCP
  - i. Hyperparameter Tuning
  - ii. AutoML
  - iii. Support for TensorFlow
- h. Summary
- 11. 10. Administering and Securing BigQuery
  - a. Infrastructure Security
  - b. Identity and Access Management
    - i. Identity
    - ii. Role
    - iii. Resource
  - c. Administering BigQuery
    - i. Job Management
    - ii. Authorizing Users
    - iii. Restoring Deleted Records and Tables
    - iv. Continuous Integration/Continuous Deployment
    - v. Cost/Billing Exports
    - vi. Dashboards, Monitoring, and Audit Logging
  - d. Availability, Disaster Recovery, and Encryption
    - i. Zones, Regions, and Multiregions
    - ii. BigQuery and Failure Handling
    - iii. Durability, Backups, and Disaster Recovery
    - iv. Privacy and Encryption
  - e. Regulatory Compliance
    - i. Data Locality
    - ii. Restricting Access to Subsets of Data
    - iii. Removing All Transactions Related to a Single Individual
    - iv. Data Loss Prevention
    - v. CMEK
    - vi. Data Exfiltration Protection
  - f. Summary
- 12. Index