Medallion Architecture Explained

The Medallion Architecture is a layered data design pattern used to organize data processing in data lakes or lakehouses.

It enables a clean, scalable, and reliable flow of data, moving from raw to refined to business-ready stages.

Purpose

- Maintain data quality and traceability
- Enable modular and scalable data pipelines
- Support machine learning, BI, and LLM applications

Medallion Architecture



Bronze Layer → Raw Data

What it contains: Ingested raw data from external sources

Format: Logs, JSON, CSV, Parquet, PDFs, etc.

Operations: Capture as-is data, add ingestion metadata (e.g., source, time)

Examples:

- Web-scraped pages
- Uploaded PDFs
- IoT sensor streams

Silver Layer → Cleaned & Structured Data

What it contains: Refined, deduplicated, and structured data **Operations**:

- Data cleansing
- Normalization
- Deduplicated
- Joins

Examples:

- Extracted and cleaned text
- Chunked text with metadata

Gold Layer → Curated, Business-Ready or ML-Ready Data

What it contains: Final curated data for business use or ML/LLM tasks Operations:

- Aggregations
- Embeddings
- QA generation
- Data Analysis

Examples:

- Vector embeddings
- ML models
- LLM fine-tuning datasets

How It Helps in RAG (Retrieval-Augmented Generation)

- **Bronze**: Store raw documents (PDFs, HTML)
- Silver: Extract and clean text, chunk content, add metadata
- Gold: Generate embeddings, store in vector DB, build indices

Benefits

- Reusability: Build once, reuse across analytics and ML
- Modularity: Easy to debug

- Traceability: Track data lineage
- Scalability: Handle millions of records efficiently

How They Are Connected: End-to-End Flow

- **1.** Data Ingestion (ETL starts here)
 - Tools Used: Azure Data Factory, Databricks Auto Loader, Kafka
 - Source Systems: APIs, Databases, IoT Devices, Logs
- 2. Bronze Layer (Raw Layer, Extracted raw data)
 - Stored in: **Data Lake** (e.g., **ADLS** on Azure)
 - Format: JSON, CSV, Parquet, etc.
 - Purpose: Capture raw, unprocessed data
- 3. Silver Layer (Clean Layer, Transformations begin for cleaning/enrichment)
 - Stored in: Delta Lake on top of ADLS
 - Format: Delta Tables
 - Processed via: Spark, Databricks, Azure Synapse
 - Purpose: Apply joins, filters, schema enforcement, validation
- **4.** Gold Layer (Business Layer)
 - Stored in: **Delta Lake** (also queried via **Lakehouse engines**)
 - Use: Reporting, ML, BI, dashboards
 - Data is now structured, enriched, trusted
- **5.** Business Consumption Layer(Consumed by)
 - BI Tools: Power BI. Tableau
 - ML Models: Azure ML, Databricks ML
 - Analytics: SQL endpoints via Lakehouse engine
- **6.** Lakehouse Integration
 - The **Lakehouse** acts as the central system that:
 - Uses **Delta Lake** as storage engine
 - Manages Medallion layers