

Business Objective

The analytics team needs to explore how **environmental indicators** correlate with **economic conditions** using open public data. Your task is to design, implement, and document a **cloud-first, end-to-end data pipeline** capable of:

- Ingesting two independent external data sources
- Processing and tracking incremental updates
- Storing data in a structured, resilient cloud architecture
- Producing a simple analytical insight from the curated dataset

The architecture, tools, orchestration, and cloud services are entirely your decision. The sole strict requirements are:

- All ingestion, crawling, and transformation logic **must be implemented in Python**
 - **Cloud resources must be used** for storage and execution
 - The pipeline must be **incremental**, not just full-refresh
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Data Sources

1. Public API Source

Option A — OpenWeather Air Pollution API

Documentation:

<https://openweathermap.org/api/air-pollution>

Data includes pollutants such as PM2.5, PM10, O₃, CO, SO₂, NO₂, etc.

Requires a free API key.

Option B — World Bank Indicators API

Base example:

<https://api.worldbank.org/v2/country/br/indicator/NY.GDP.MKTP.CD?format=json>

Choose any country and indicator.

No key required.

API Ingestion Requirements:

- Must support **incremental ingestion** (pagination, time filtering, deduplication, etc.)
 - Must normalize the response into a structured dataset
 - Must store raw + processed data in the cloud
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2. Web Crawler

Use Python to extract a **structured table** from a public website.

Recommended source: Wikipedia

Example: https://en.wikipedia.org/wiki/List_of_countries_by_inflation_rate

Crawler Requirements:

- Extract a full table (inflation, GDP list, demographic list, etc.)
- Clean and normalize column names
- Convert values to consistent types
- Handle at least one HTML inconsistency (missing field, symbol, merged value, footnote, etc.)
- Store raw + processed data in cloud storage

You may choose another public website with a stable table if preferred to be crawled.

Technical Requirements

Your pipeline must satisfy the following requirements:

1. Cloud Usage

You must use a cloud provider (AWS, GCP, Azure, etc.) for:

- Storing raw, processed, and curated layers
- Running ingestion and/or transformation workloads
- Scheduling or triggering the pipeline

2. Python Implementation

Python must be used for:

- API ingestion
- Web crawling
- Incremental ingestion logic
- Metadata tracking
- Transformations / curation
- Analytical output

3. Incremental Ingestion

Your pipeline must implement an incremental approach:

- Detect new or updated data
- Avoid duplications
- Track ingestion timestamps
- Use pagination or checkpoints where applicable

4. Metadata Tracking

Each ingestion run must record at minimum:

- Ingestion timestamp
- Data source identifier
- Row count or processed volume
- Any execution metric of your choice (duration, last successful checkpoint, etc.)

5. Curated Dataset

You must produce a **final dataset** that joins:

- The API dataset
- The crawler dataset

This curated dataset must be clean, normalized, and ready for analytical consumption.

6. Analytical Output

Provide a **programmatically generated analytical artifact**, such as:

- A chart (PNG/HTML/SVG)
- A summary table produced by your script
- A small Jupyter notebook visualization

Context expectation:

The output should demonstrate that the curated dataset holds meaningful insights.
For example:

- Trend comparison between economic indicator and environmental metric
- Ranking by region
- Numeric summary of correlations

We don't need go crazy here.. the key is that it is **generated by code** and uses the curated dataset.

Deliverables

1. README

Must include:

- **Architecture Overview** (high-level explanation)
 - **Chosen Cloud Services & Justification**
 - **Incremental Ingestion Strategy**
 - **Data Schema Decisions**
 - **Instructions to Run the Entire Project**
 - **Assumptions & Limitations**
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2. Final Documentation

This is the main technical deliverable.
It must include:

- **Architectural Diagram (embedded)**
 - Any format is fine (Mermaid, Excalidraw, PNG, Lucidchart, etc.), but it must be **included inside this document**, not provided separately.
- **Detailed Pipeline Explanation**
 - Ingestion flow for API and crawler
 - Storage layers (raw → processed → curated)
 - Transformation steps
 - Metadata tracking implementation
 - Orchestration / scheduling design
 - Cloud components used and their responsibilities
- **Data Models / Schemas**
 - Raw structure
 - Processed structure
 - Curated final dataset
 - Explanation of naming conventions and normalization decisions
- **Operational Considerations**
 - Error handling
 - Pagination strategies
 - Retry logic
 - Incremental ingestion approach
 - Idempotency considerations

3. Python Codebase

A complete, runnable codebase, including:

- API ingestion module
 - Crawler module
 - Incremental logic
 - Transformation/curation scripts
 - Metadata tracking logic
 - Analytical output generator
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4. Cloud Execution Instructions

A short guide describing how the pipeline runs in the cloud:

- Scheduling or trigger mechanism
- Required environment variables or configuration
- Any IAM roles, permissions, buckets, storage paths, or compute resources
- Steps to deploy or execute ingestion/transformation in the cloud

This ensures the pipeline is actually runnable in a cloud environment.

5. Final Presentation (Explanatory Walkthrough)

A presentation-style deliverable (slides, Markdown deck, Notion page, PDF, etc.) containing:

- Explanation of the analytical output
 - What insight(s) were identified
 - How the output was produced from the curated dataset
 - High-level architecture summary
 - Key technical decisions and trade-offs
 - Challenges faced and how they were solved
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Acceptance Criteria (AC)

AC1 – Both Ingestion Pipelines Implemented

- API data and crawler data are both ingested
 - Raw and processed data stored in the cloud
 - Ingestion implements incremental logic
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AC2 – Cloud-Based Execution

- At least one part of the pipeline (ingestion or transformation) executes in the cloud
 - All datasets reside in cloud storage
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AC3 – Transformation + Metadata Tracking

- Data is cleaned and normalized

- Metadata is collected per ingestion run
 - Final curated dataset successfully joins both sources
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AC4 – Analytical Output

- A programmatically generated chart/table/insight is produced
 - Output clearly uses the curated dataset
 - Output demonstrates meaningful insight (trend comparison, summary metrics, etc.)
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AC5 – Documentation & Presentation Complete

- README provided
- Final technical documentation complete and includes the architectural diagram
- Presentation explaining insights and decisions delivered