AirFly Insights: Data Visualization and Analysis of Airline Operations

1: Data Foundation and Cleaning

Project: Flight Delay Analysis

Dataset: airfly_raw_data.csv (484,552 rows × 30 columns)

Project Context

Air travel delay analysis is a crucial use case for understanding operational efficiency, customer experience, and route optimization. This project aims to build a **clean**, **structured dataset** to support downstream analysis and modeling of **flight delays**, **cancellations**, and **route performance**.

The raw dataset contains U.S. domestic flight operations, including schedule times, actual times, delays, cancellation codes, and airport information.

Goals

- Build a clean and reliable data foundation for flight delay analysis.
- Define and extract **key temporal and operational features** to support modeling and visualization.
- Ensure data quality by handling missing values, formatting inconsistencies, and type mismatches.
- Store preprocessed data in a reusable format for faster downstream development.

Key KPIs

KPI	Description
Average Arrival Delay	Mean of ArrDelay by carrier and route
Cancellation Rate	Proportion of flights canceled over total
On-Time Performance	% of flights with ArrDelay <= 0
Route Popularity	Number of flights per Origin–Destination pair
Peak Departure Hour	Hour of day with highest departures

WEEK 1: Project Initialization and Dataset Setup

1. Define Goals, KPIs, and Workflow

- Project scope established for delay and cancellation analysis.
- Workflow defined: Data ingestion → Preprocessing → Feature Engineering → EDA & Modeling.
- KPIs identified to measure airline performance and flight punctuality.

2. Load CSVs Using pandas

Raw data was loaded from:

/Volumes/airfly_workspace/default/airfly_insights/airfly_raw_data.csv using pandas.read_csv().

The dataset contains:

- 484,552 rows
- 30 columns

3. Explore Schema, Types, Size, and Nulls

Check	Findings	
Schema & Dtypes	Mix of int, float, object; time columns stored as int (HHMM); dates as strings	
Size	~90 MB CSV file	
Nulls	Missing values found in ArrTime, DepTime, Org_Airport, Dest_Airport, and Cancelled	
Duplicates	Some repeated flight records by FlightNum, TailNum, Date	

4. Sampling and Memory Optimizations

- Random sample of 5,000 rows used for quick inspection.
- Columns downcasted to efficient dtypes (e.g., int32, category) to reduce memory footprint.
- Times converted only once during preprocessing to avoid repeated parsing overhead.

WEEK 2: Preprocessing and Feature Engineering

1. Handle Nulls in Delay and Cancellation Columns

- Delay columns (ArrDelay, DepDelay, CarrierDelay, etc.) \rightarrow filled with **0**.
- Cancelled \rightarrow filled with **0** where missing (interpreted as not canceled).
- CancellationCode → filled with 'None' where missing.

2. Create Derived Features

New columns added for temporal and route-based analysis:

Feature Description

Month Extracted from Date

DayOfWeekNum 0-6 representation for Monday-Sunday

DepHour Extracted from DepTime after conversion

Route Concatenation of Origin and Dest (e.g., IND-BWI)

3. Format Datetime Columns

- Date parsed as datetime with dayfirst=True to handle DD-MM-YYYY format.
- DepTime, ArrTime, and CRSArrTime converted from **HHMM integers** to datetime.time objects for proper time analysis.

4. Save Preprocessed Data for Fast Reuse

The cleaned dataset was saved in:

/Volumes/airfly_workspace/default/airfly_insights/flights_cleaned.csv and also optionally as Parquet for faster downstream reads.

Feature Dictionary

Column	Description
DayOfWeek	Day of week (1=Monday, etc.)
Date	Flight date

Column Description

DepTime Actual departure time

(HH:MM)

ArrTime Actual arrival time (HH:MM)

CRSArrTime Scheduled arrival time

UniqueCarrier Airline code

Airline Airline name

FlightNum Flight number

TailNum Aircraft tail number

ActualElapsedTime Actual flight time (minutes)

CRSElapsedTime Scheduled flight time

AirTime Airborne time (minutes)

ArrDelay Arrival delay (minutes)

DepDelay Departure delay (minutes)

Origin Origin airport code

Org Airport Origin airport name

Destination airport code

Dest Airport Destination airport name

Distance Distance in miles

Taxi In Taxi in time (minutes)

TaxiOut Taxi out time (minutes)

Cancelled 1 if flight cancelled, else 0

CancellationCode Reason for cancellation

Diverted 1 if flight diverted

CarrierDelay, WeatherDelay, NASDelay, SecurityDelay,

LateAircraftDelay

Delay causes

Month, DayOfWeekNum, DepHour, Route Derived features for analysis