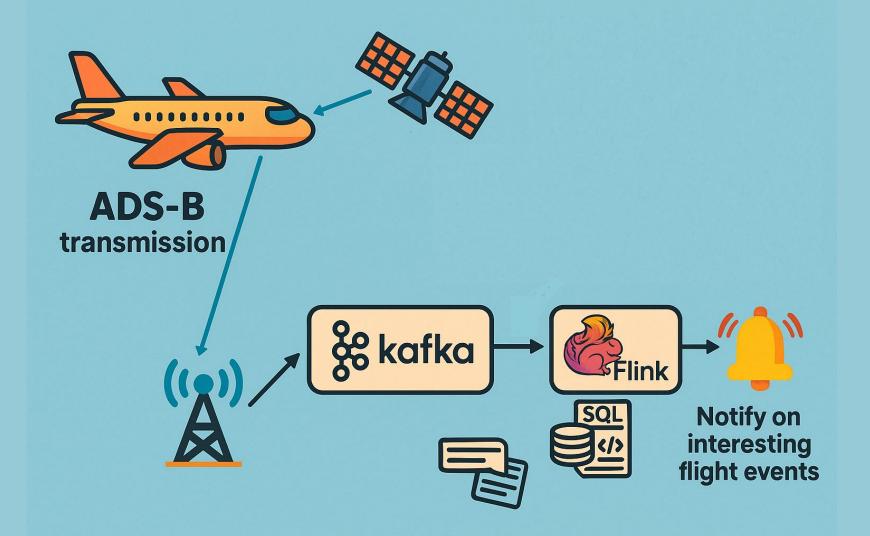


### Complex event processing of ADS-B aviation data with Apache Flink

Apache Kafka x Apache Flink Meetup - July 2025



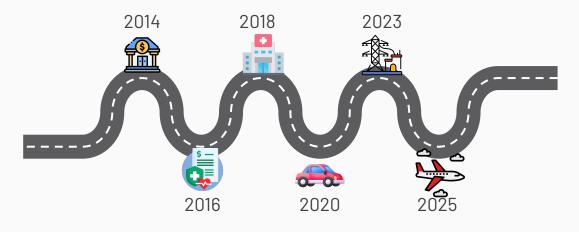




### Simon Aubury

Data Geek









### Can I find

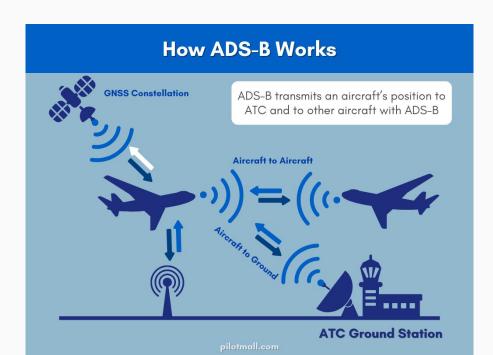
- 1. Missed approach (or go-around) during aircraft landing
- 2. Paired flight paths where the same aircraft land (or takeoff) on parallel runways.

### Tracking planes ADS-B



Automatic Dependent Surveillance Broadcast, or ADS-B provides an updated way for pilots to view each other's positions and for ATC to manage air traffic.

- Position (GPS)
- Altitude
- Velocity
- Heading



https://www.pilotmall.com/



### ADS-B capture using a Raspberry Pi

To capture the aircraft transmissions

- Raspberry Pi
- RTL2832U USB dongle
- dump1090
- A small antennae





### ADS-B .. with curl

adsb.fi - a community-driven flight tracker project with a free real-time API

curl https://opendata.adsb.fi/api/v2/lat/-33.94/lon/151.17/dist/5

```
"hex": "7c6d7e",
"flight": "JST517 ",
"r": "VH-VWW",
"alt_baro": 1950,
"gs": 207.9,
"track": 134.22,
"lat": -34.002365,
"lon": 151.240315,
"nic": 8,
"rc": 186,
"seen pos": 0.296.
```



### Flights → AVRO → Kafka

monitor\_opendata.py --airport SYD

Poll <u>adsb.fi</u> every 10s

Serialise any flights found as AVRO into the flights topic

```
def get_flights(point_lat, point_lon, dist):
   url = f'https://opendata.adsb.fi/api/v2/lat/{point_lat}/lon/{point_lon}/dist/{dist}'
    response = requests.get(url)
    response.raise for status()
    return response.json().get('aircraft', [])
def process flight(file name, flight, prd):
   # Ignore anything with a ground speed below 50 knots
   if (flight.get('gs') is None or flight.get('gs') < 50):
        return
   formatted_timestamp = datetime.now().strftime('%Y-%m-%d %H:%M:%S')
   data = f'{formatted_timestamp},{flight.get('hex')},{flight.get('flight')},{flight.get('flight')},
   with open(file_name, 'a') as f:
        f.write(f'{data}\n')
   if prd is not None:
        flight = Flight(callsign=flight.get('flight').rstrip(),
                        latitude=flight.get('lat'),
                        longtitude=flight.get('lon'),
                        altitude=flight.get('alt geom'),
                        icao=flight.get('hex'),
                        speed=flight.get('gs'),
                        airport='',
                        track=flight.get('track'),
                        sqwark=flight.get('squawk'),
                        emergency=flight.get('emergency').
        prd.do_produce(flight)
```

https://github.com/saubury/plane\_track/blob/main/monitor\_opendata.pv





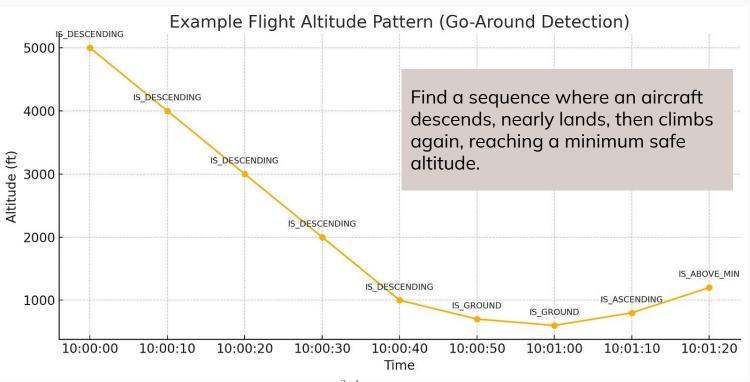
## Missed approach finding with Flink



A missed approach (go-around) is a procedure where an aircraft, during an approach to landing, discontinues the approach and climbs away from the runway.



### Missed approach





### Flink SQL

Flink SQL query with MATCH\_RECOGNIZE,

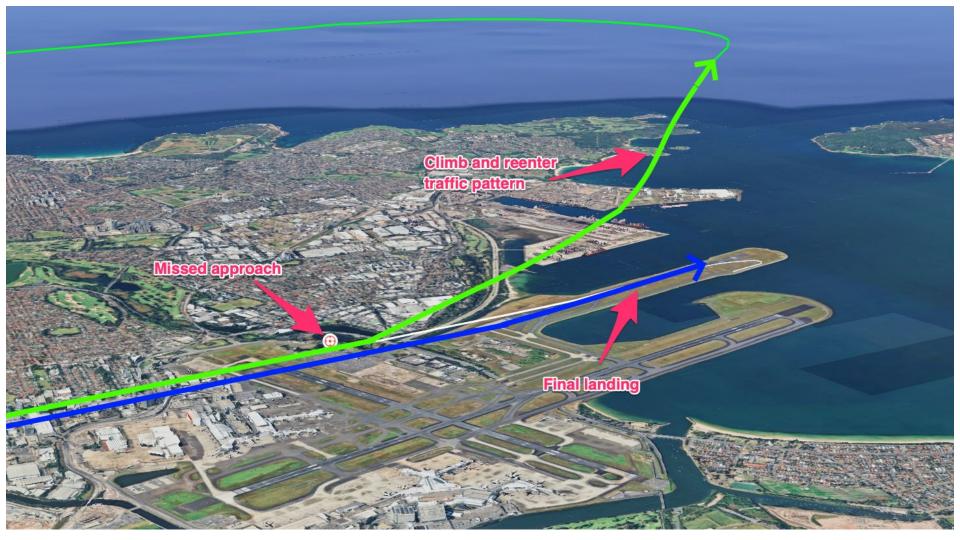
Identifies specific flight altitude patterns in a stream of aircraft data, partitioned by callsign

```
SQL Query Result (Table)
Table program finished. Page: Last of 1 Updated: 03:49:28.074

callsign
ANZI01 desc_UTC
27 Apr 2025
```

```
SELECT *
FROM flight
MATCH_RECOGNIZE(
    PARTITION BY callsign
    ORDER BY proc_time
    MEASURES
        IS DESCENDING.flightts as desc UTC,
       IS GROUND.flightts as ground UTC,
       IS ASCENDING. flightts AS asc UTC,
       IS_ABOVE_MIN.flightts AS abvm_UTC,
       IS_GROUND.altitude AS grd_altitude,
       IS_ASCENDING.altitude AS asc_altitude
    ONE ROW PER MATCH
    AFTER MATCH SKIP TO LAST IS_ASCENDING
    PATTERN (IS DESCENDING(5,) IS GROUND(1,) IS ASCENDING IS ABOVE MIN)
    DEFINE
        IS DESCENDING AS (LAST(altitude, 1) IS NULL
           AND altitude >= 1000) OR altitude < LAST(altitude, 1),
        IS_GROUND AS altitude <= 800,
        IS_ASCENDING AS altitude > last(altitude,1),
        IS ABOVE MIN AS altitude > 1000
) AS T
where TIMESTAMPDIFF(second, desc_UTC, asc_UTC) between 0 and 1000;
```

https://github.com/saubury/plane\_track





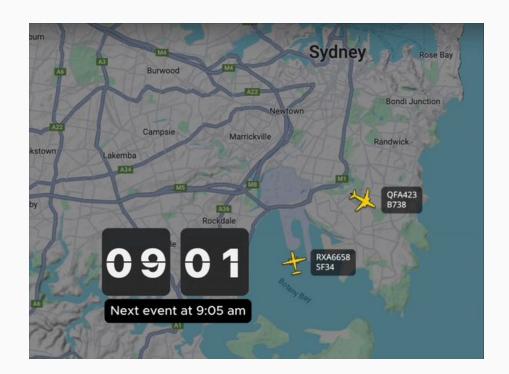


### Finding paired flights with Flink



### Twin flying

Paired flight landings occur when aircraft land on parallel runways.





### Flink UDF's

To measure the distance between aircraft using a Flink user-defined function (UDF)

By adding a distance scalar Java function I could calculate distance between two aircraft.

```
public class Distance extends ScalarFunction €
   public static final String NAME = "calculateDistanceKm";
   // Equirectangular approximation to calculate distance in km between two points
   public float eval(float lat1, float lon1, float lat2, float lon2) {
       float EARTH RADIUS = 6371;
       float lat1Rad = (float) Math.toRadians(lat1);
       float lat2Rad = (float) Math.toRadians(lat2);
       float lon1Rad = (float) Math.toRadians(lon1);
       float lon2Rad = (float) Math.toRadians(lon2);
       float x = (float) ((lon2Rad - lon1Rad) * Math.cos((lat1Rad + lat2Rad) / 2)):
       float v = (lat2Rad - lat1Rad);
       float distance = (float) (Math.sqrt(x * x + y * y) * EARTH_RADIUS);
       return distance:
             add jar '/target-jars/udf example-1.0.jar';
             CREATE FUNCTION distancekm AS 'com.example.my.Distance';
             SHOW USER FUNCTIONS:
             -- Straight line distance (km) between Sydney and Melbourne
             SELECT distancekm(-33.9401302, 151.175371, -37.840935, 144.946457)
             as dist_km;
```



### **Paired**

Find pairs of flights that were geographically close (within 1.5 km) of each other during overlapping or near-overlapping times (within 35 seconds)

```
SELECT f1.callsign AS f1,
f2.callsign AS f2,
distancekm(f1.latitude , f1.longtitude, f2.latitude, f2.longtitude) as km
FROM flight f1, flight f2
WHERE f1.flightts BETWEEN f2.flightts - interval '35' SECOND AND f2.flightts
AND f1.callsign < f2.callsign
AND distancekm(f1.latitude , f1.longtitude, f2.latitude, f2.longtitude) < 1.5;
```

efresh: 1 s	SQL Query Result (Table) Page: Last of 12	Updated:
f1	f2	km
QFA749	TGW13	1.3
QFA749	TGW13	1.1
ANZ109	JST724	1.3
ANZ109	JST613	1.3

https://github.com/saubury/plane\_track

### What about ... †the type of plane?

### **Annotating**

# "hex": "7c6d7e", "flight": "JST517 ", "r": "VH-VWW", "alt\_baro": 1950, "gs": 207.9, "track": 134.22, "lat": -34.002365, "lon": 151.240315, "nic": 8, "rc": 186, "seen pos": 0.296.

### **ICAO** codes

Aircraft ICAO codes such as 7C6D7E to airframes such as Airbus A321-231 which is 16 years old

### Flight codes

Flight code such as JST517 departs Sydney at 12:40 PM and arrives in Melbourne at 2:15 PM operating daily.



### Opensky data archive

### 600k airframes

```
7c8155, Australia, Eagle R & D, Helicycle, Private, VH-ZTZ, UHEL
7c8160, Australia, Beech Aircraft Corp., 76 Duchess, Air Gold
7c8162, Australia, North American, T-28D Trojan, Private, VH-ZU
7c8163, Australia, Piper, PA-44-180 Seminole, Airflite Pty Ltd
7c8164, Australia, Robinson, R22 Beta II, Aeroair Pty Ltd, VH-Z
7c8165.Australia, Robinson, R44 Raven II, Private, VH-ZUF, R44
7c8166, Australia, Robinson, R44 Raven II, Private, VH-ZUG, R44
7c8167, Australia, Sikorsky, S-92 A, Bristow Helicopters Austr
7c8168,Australia,Piper CREATE TABLE aircraft_lookup (
7c8169, Australia, Sikor
                            icao24 varchar(100) not null.
7c816a, Australia, North
7c816c, Australia, Piper
                            country varchar(100),
7c816d, Australia, Bell,
                            manufacturerName varchar(100),
7c816e, Australia, Sikor
                            model varchar(100),
7c8170, Australia, Sikor:
                            owner varchar(100).
7c8171, Australia, Van''
7c8173, Australia, Robins
                            registration varchar(100).
7c8174, Australia, ..., VH-
                            typecode varchar(100)
7c8175, Australia, Sikor
7c8176, Australia, Sikor ) WITH (
7c8178, Australia, Bell,
                            'connector' = 'filesystem'.
7c8184, Australia, Euroca
                            'path' = '/data_csv/aircraft_lookup_aus.csv',
7c8185.Australia.Euroci
                            'format' = 'csv'
7c8186, Australia, Airbus
```

### 420k route

```
VOLUDO, DID CON
VOZ631, CBR-SYD
VOZ632, SYD-CBR
VOZ633, CBR-SYD
VOZ634,SYD-CBR
VOZ635, CBR-SYD
VOZ636.SYD-CBR
VOZ637,CBR- CREATE TABLE route_lookup (
V0Z638, SYD-
                 flight varchar(100) not null,
VOZ640,SYD-
                 route varchar(100)
V0Z641, CBR- ) WITH (
                 'connector' = 'filesystem',
VOZ642.SYD-
                 'path' = '/data csv/flight route syd.csv',
V0Z643, CBR-
                 'format' = 'csv'
V0Z644.SYD-
V0Z645, CBR-
VOZ646, SYD-CBR
VOZ647, CBR-SYD
```



### Same plane types

```
create or replace view flight_decorated
as
select f.*, a.model, a.owner, a.typecode, r.route
from flight f
left join aircraft_lookup a on (f.icao = a.icao24)
left join route_lookup r on (f.callsign = r.flight)
;
```

```
SELECT f1.flightts,
f1.callsign || ' (' || COALESCE(f1.route, '-') ||')' || ' ' || f1.typecode
CAST(ROUND(DISTANCEKM(f1.latitude , f1.longtitude, f2.latitude, f2.longtitu
f2.callsign || ' (' || COALESCE(f2.route, '-') ||')' || ' ' || f2.typecode
FROM flight_decorated f1, flight_decorated f2
WHERE f1.flightts BETWEEN f2.flightts - interval '20' SECOND AND f2.flightt
AND f1.callsign < f2.callsign
AND f1.typecode = f2.typecode
AND DISTANCEKM(f1.latitude , f1.longtitude, f2.latitude, f2.longtitude) < 1
```

https://github.com/saubury/plane\_track





### TLDR ...





### Take-away's

### Stream analysis

ADS-B signals provide a rich data source that, when processed in real-time can find cool events

### Open-source + curiosity

With just a basic radio receiver & streaming framework you can build meaningful analytics pipelines

### CEP makes sense of data.

Apache Flink can detect patterns in event streams .. and slow to spot with batch analytics.

### Apply beyond aviation

The techniques for identifying anomalies or sequences are transferable to other industries











Do you have any questions?



in X @SimonAubury

Blog / code



CREDITS: This presentation template was created by **Slidesgo**, and includes icons by Flaticon, and infographics & images by Freepik