Ansh Ranjan Databricks Case Study

EXERCISE 5 – Advanced Spark Topics and Optimization

TASK 1: Implement caching and Broadcasting

- 1. Caching a dataframe in memory allows for faster reuse
- 2. To cache a dataframe run df.cache()

```
df_bronze_with_duration.cache()
df_bronze_with_duration.count()
```

3. If we are joining a large dataframe with a smaller one. We can broadcast the smaller dataframe across all worker nodes to avoid shuffling.

```
from pyspark.sql.functions import broadcast

df_joined = df_bronze_with_duration.join(
    broadcast(df_small_lookup), on="some_key", how="left"
)
```

TASK 2: Use spark's advanced concepts

1. Use DataFrames and Spark SQL (not RDDs)

- DataFrames are optimized by Catalyst and Tungsten, making them much faster.
- Avoid low-level RDDs unless absolutely necessary.

2. Cache / Persist Smartly

- Use .cache() or .persist() **only** when you reuse a DataFrame **multiple times**.
- Don't over-cache memory is limited!

3. Broadcast Small Lookup Tables

• When joining with small datasets (< 100 MB), use:

```
from pyspark.sql.functions import broadcast df_large.join(broadcast(df_small), "key")
```

4. Filter Early, Select Only Needed Columns

• Apply .filter() and .select() early to reduce data volume.

```
df.select("col1", "col2").filter("col1 > 100")
```

5. Partition Smartly

- Use .repartition() to distribute load for wide transformations or large joins.
- Use .coalesce(1) **only** for final small outputs (e.g., exports).

```
df = df.repartition(10, "some_column")
```

6. Use Delta Lake Format

- Delta tables are faster for reads, support ACID, schema evolution, and time travel.
- Use OPTIMIZE and ZORDER to improve read performance.

OPTIMIZE my_table ZORDER BY (col_name)

7. Avoid Exploding Joins & Shuffles

- Shuffles are expensive (joins, groupBy, distinct).
- Repartition wisely to avoid skew.

8. Monitor with Spark UI

- Always check stages and tasks in **Spark UI** (or the **Databricks Job Run view**).
- Look out for:
 - o Long tasks
 - o Skewed stages
 - o Too many small files