

FIT3003 Assignment 2

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1. Transformation Stage

1.1 Preparation Stage: Data Cleaning

Data cleaning is a critical step in ensuring the accuracy and reliability of a database. This section outlines the strategies used during the data cleaning process, including relevant SQL commands and illustrative screenshots for each identified issue.

1.1.1 Identifying duplicates

I looked for duplicate records in key tables (e.g., Booking and Host tables) and removed them. Duplicates can lead to inflated counts and misinterpretations in analysis.

1.1.1A Duplicates in Booking Table

There are 2 duplicate booking_id entries in the booking table.

• Booking_id 537 appears twice.

- **Identifying Duplicates**: I executed a SQL query to group the booking_id and count occurrences. This allowed me to identify which IDs had duplicates.
- **Cleaning Strategy**: To resolve this, I created a table containing distinct records from the booking table.

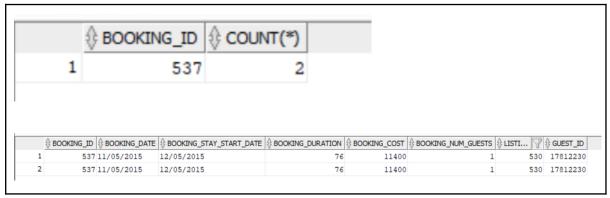


Figure 1.1.1A.1 Screenshot of Duplicate Booking IDs.

```
-- Error 1: Duplicate booking id in booking table

SELECT booking id, COUNT(*)

FROM MStay.booking

GROUP BY booking_id

HAVING COUNT(*) > 1; -- 2 duplicates

SELECT * FROM MStay.booking

WHERE booking_id = 537;

CREATE TABLE MS_booking as

SELECT DISTINCT *

FROM MStay.booking;
```

Figure 1.1.1A.2 Screenshot of SQL Commands.

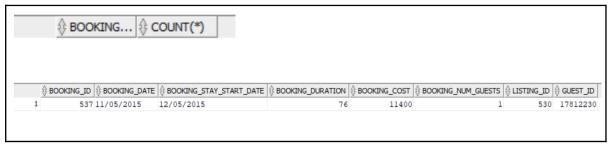


Figure 1.1.1A.3 Screenshot after cleaning

1.1.1B Duplicates in Host Table

There are 4 duplicate host_id entries.

• Host ID 7046664 is found 4 times in the host table.

- **Identifying Duplicates**: Similar to the Booking table, I used a SQL query to identify duplicates based on host_id.
- **Cleaning Strategy**:To resolve this, I created a table containing distinct records from the host table.



Figure 1.1.1B.1 Screenshot of Duplicate Host IDs

```
--Error 2: Duplicate host id in host table

SELECT host id, COUNT(*)

FROM MStay.host

GROUP BY host_id

HAVING COUNT(*) > 1; -- 4 duplicates

SELECT * FROM MStay.host

WHERE host_id = 7046664;

CREATE TABLE MS_host AS

SELECT DISTINCT *

FROM MStay.host;
```

Figure 1.1.1B.2 Screenshot SQL Commands.



Figure 1.1.1B.3 Screenshot after cleaning

1.1.2 Deleting Error Date

An error date is found in the host since column in Host table.:

• Host_since = 16/05/9999.

- **Identifying Error Dates**: I specifically searched for the unusual date to isolate problematic entries.
- **Cleaning Strategy**: I updated the erroneous date to null to remove the invalid data, then deleted records where host_since was null.



Figure 1.1.2.1 Screenshot of Error Date in host table.

```
--Error 3: Invalid date in host_since in host table

SELECT TO_CHAR(host_since, 'DD/MM/YYYY')

FROM MS_host

ORDER BY host_since DESC; --host_since : 16/05/9999

SELECT *

FROM MS_host

WHERE TO_CHAR(host_since, 'DD/MM/YYYY') = '16/05/9999';

UPDATE MS_host

SET host_since = NULL

WHERE TO_CHAR(host_since, 'DD/MM/YYYY') = '16/05/9999';

DELETE FROM MS_host

WHERE host_since IS NULL;
```

Figure 1.1.2.2 Screenshot SQL Commands

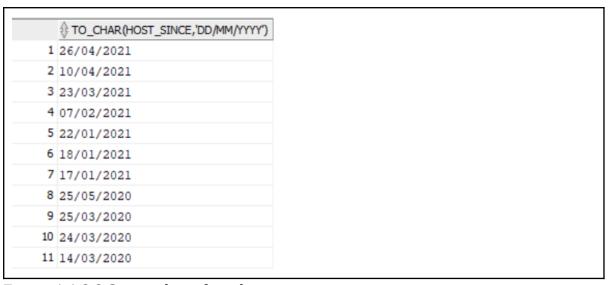


Figure 1.1.2.3 Screenshot after cleaning

1.1.3 Delete inaccurate value

A negative value (-150) is found in the listing_price column in the listing table.

- **Identifying Negative Values**: I ran a query to detect negative values in the listing_price field.
- **Cleaning Strategy**: I updated negative values to null, following which I deleted records with null prices.



Figure 1.1.3.1 Screenshot of Negative listing_price in listing table

```
--Error 4: Negative value in listing_price in listnig table

SELECT *
FROM MS_listing
WHERE listing_price < 0; -- 1 (listing_id = 99999; listing_price = -150)

UPDATE MS_listing
SET listing_price = NULL
WHERE listing_price < 0;

DELETE FROM MS_listing
WHERE listing_price IS NULL;
```

Figure 1.1.3.2 Screenshot of SQL Commands.



Figure 1.1.3.3 Screenshot after cleaning

1.1.4 Delete invalid relationship

I addressed the issues where foreign keys in some tables did not have corresponding primary keys in their parent tables, leading to invalid relationships. The goal was to clean these inconsistencies and ensure that all foreign key references in child tables correctly matched with existing records in parent tables.

1.1.4A Invalid Relationship in Review Table

The booking_id foreign key in the review table (booking_id = 500123) does not exist in the booking table.

- **Identifying Invalid Relationships**: I checked foreign keys against their corresponding primary keys to find mismatches.
- **Cleaning Strategy**: I set invalid booking_id to null, then deleted records where booking_id was null.



Figure 1.1.4A.1 Screenshot of the invalid relationship in review table.

```
--Error 5: Invalid relationship in review table

SELECT *
FROM MS_review
WHERE booking_id NOT IN
(SELECT booking_id
FROM MS_booking); --1

UPDATE MS_review
SET booking_id = NULL
WHERE booking_id NOT IN
(SELECT booking_id
FROM MS_booking);

DELETE FROM MS_review
WHERE booking_id IS NULL;
```

Figure 1.1.4A.2 Screenshot of SQL Commands

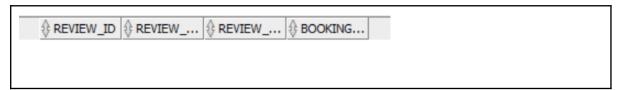


Figure 1.1.4A.3 Screenshot after cleaning

1.1.4B Invalid Relationship in Host Verification Table

The host_id foreign key (host_id = 123) in the host verification table does not exist in the host table.

- **Identifying Invalid Relationships**: I performed similar checks for the Host Verification table.
- **Cleaning Strategy**: I updated invalid host_id to null, then deleted those records.

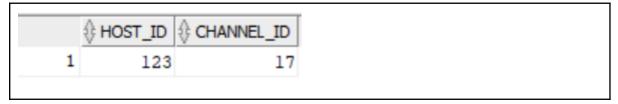


Figure 1.1.4B.1 Screenshot of the invalid relationship in Host Verification table.

```
--Error 6 : Invalid relationship in host verification table

SELECT *

FROM MS_host_verification

WHERE host_id NOT IN

(SELECT host_id

FROM MS_host);--host_id =123

UPDATE MS_host_verification

SET host_id = NULL

WHERE host_id NOT IN

(SELECT host_id

FROM MS_host);

DELETE FROM MS_host_verification

WHERE host_id IS NULL;
```

Figure 1.1.4B.2 Screenshot of SQL Commands.



Figure 1.1.4B.3 Screenshot after cleaning

1.1.4C Invalid Relationship in Property Amenity Table

After deleting null values $[\underline{1.1.5B}]$, there are 3 rows of amm_id (amm_id = 124) in the property amenity table that do not exist in the amenity table.

- **Identifying Invalid Relationships**: I checked for amm_id that were not present in the Amenity table.
- **Cleaning Strategy**: I updated invalid amm_id to null and then deleted those entries.

	<pre> PROP_ID </pre>	
1	621155	124
2	2063596	124
3	9336217	124

Figure 1.1.4C.1 Screenshot of the invalid relationship in Property Amenity table.

```
--Error 9: 3 Invalid relationship in property amenity table

SELECT *
FROM MS_property_amenity
WHERE amm_id NOT IN
(SELECT amm_id
FROM MS_amenity);

UPDATE MS_property_amenity
SET amm_id = NULL
WHERE amm_id NOT IN
(SELECT amm_id
FROM MS_amenity);

DELETE FROM MS_property_amenity
WHERE amm_id IS NULL;
```

Figure 1.1.4C.2 Screenshot of SQL Commands.

Figure 1.1.4C.3 Screenshot after cleaning

1.1.5 Delete Null Values

I identified the issue of NULL values in key columns of the dataset. Null values can affect analysis and reporting by introducing gaps in the data.

1.1.5A Null Values in Review Table

There are 2 null values in the review_comment column.

- **Identifying Null Values**: I queried the Review table to check for null entries in review_comment.
- **Cleaning Strategy**: I directly deleted records with null comments.

	\$ REVIEW_ID	REVIEW_DATE		BOOKING_ID
1	128829335	27/01/2017	(null)	749
2	276158344	13/06/2018	(null)	4417

Figure 1.1.5A.1 Screenshot of null values in Review Table.

```
--Error 7: 2 null values in review table

SELECT *
FROM MS_review

WHERE review_id IS NULL

OR review_date IS NULL

OR review_comment IS NULL; --2 rows

DELETE FROM MS_review

WHERE review_comment IS NULL;
```

Figure 1.1.5A.2 Screenshot of SQL Commands.



Figure 1.1.5A.3 Screenshot after cleaning.

1.1.5B Null Values in Amenity Table

There is 1 null value in amm_description and 1 null value in amm_id.

- **Identifying Null Values**: I checked the Amenity table for null entries in both fields.
- **Cleaning Strategy**: I executed delete commands for records with null values.



Figure 1.1.5B.1 Screenshot of null values in Amenity Table.

```
--Error 8: 2 null values in amenity table

SELECT *
FROM MS_amenity
WHERE amm_id IS NULL
OR amm_description IS NULL; --2 rows

DELETE FROM MS_amenity
WHERE amm_id IS NULL
OR amm_description IS NULL;
```

Figure 1.1.5B.2 Screenshot of SQL Commands.



Figure 1.1.5B.3 Screenshot after cleaning

1.1.6 Before and after cleaning

Number of rows for every tables before data cleaning:

Review Table: 4870 rowsBooking Table: 5002 rowsGuest Table: 9372 rows

• Listing Table : 4936 rows

• Host Table : 3883 rows

• Host Verification Table: 21749 rows

Channel Table : 20 rowsListing Type Table : 4

• Property Table: 5001 rows

• Property Amenity Table: 47027 rows

• Amenity Table: 449 rows

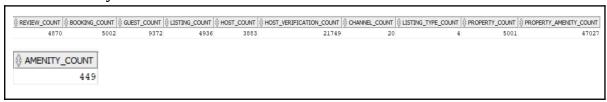


Figure 1.1.6.1 Screenshots of Data Before Cleaning

```
--Count no of rows before data cleaning

SELECT

(SELECT COUNT(*) FROM MStay.Review) AS review_count,

(SELECT COUNT(*) FROM MStay.booking) AS booking_count,

(SELECT COUNT(*) FROM MStay.guest) AS guest_count,

(SELECT COUNT(*) FROM MStay.listing) AS listing_count,

(SELECT COUNT(*) FROM MStay.host) AS host_count,

(SELECT COUNT(*) FROM MStay.host_verification) AS host_verification_count,

(SELECT COUNT(*) FROM MStay.channel) AS channel_count,

(SELECT COUNT(*) FROM MStay.listing_type) AS listing_type_count,

(SELECT COUNT(*) FROM MStay.property) AS property_count,

(SELECT COUNT(*) FROM MStay.property_amenity) AS property_amenity_count,

(SELECT COUNT(*) FROM MStay.Amenity) AS amenity_count

FROM dual;
```

Figure 1.1.6.2 Screenshot of SQL Commands.

Number of rows from every tables after data cleaning:

Review Table: 4867 rows
Booking Table: 5001 rows
Guest Table: 9372 rows
Listing Table: 4935 rows
Host Table: 3879 rows

• Host Verification Table: 21749 rows

Channel Table : 20 rowsListing Type Table : 4

• Property Table: 5001 rows

• Property Amenity Table: 47024 rows

• Amenity Table: 447 rows

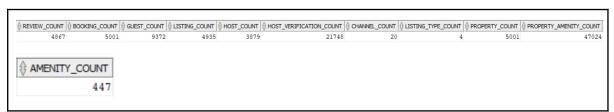


Figure 1.1.6.3 Screenshots of Data After Cleaning

```
--Count no of rows after data cleaning

SELECT

(SELECT COUNT(*) FROM MS_Review) AS review_count,

(SELECT COUNT(*) FROM MS_booking) AS booking_count,

(SELECT COUNT(*) FROM MS_guest) AS guest_count,

(SELECT COUNT(*) FROM MS_listing) AS listing_count,

(SELECT COUNT(*) FROM MS_host) AS host_count,

(SELECT COUNT(*) FROM MS_host_verification) AS host_verification_count,

(SELECT COUNT(*) FROM MS_channel) AS channel_count,

(SELECT COUNT(*) FROM MS_listing_type) AS listing_type_count,

(SELECT COUNT(*) FROM MS_property_AS property_count,

(SELECT COUNT(*) FROM MS_property_amenity) AS property_amenity_count,

(SELECT COUNT(*) FROM MS_property_amenity) AS amenity_count

FROM dual;
```

Figure 1.1.6.4 Screenshot of SQL Commands.

1.2 Design Task A: Star/Snowflakes Schema Diagrams.

The star schema in Figure 1.2 is a multi-fact star schema, consisting of three fact tables: ReviewFACT, BookingFACT, and ListingFACT. All three fact tables are connected to TimeDIM. Both BookingFACT and ListingFACT are connected to ListingTypeDIM. Additionally, BookingFACT is connected to BookingDurationDIM and BookingCostDIM, while ListingFACT is connected to ListingSeasonDIM, ListingDurationDIM, ListingPriceDIM, and HostDIM. HostDIM has a bridge table, HostChannelBRIDGE, which links it to ChannelDIM. The ReviewFACT table contains one fact measure, *No_of_Reviews*; BookingFACT includes two fact measures, *Total_No_of_Bookings* and *Total_Booking_Cost*; and ListingFACT contains one fact measure, *No_of_Listings*.

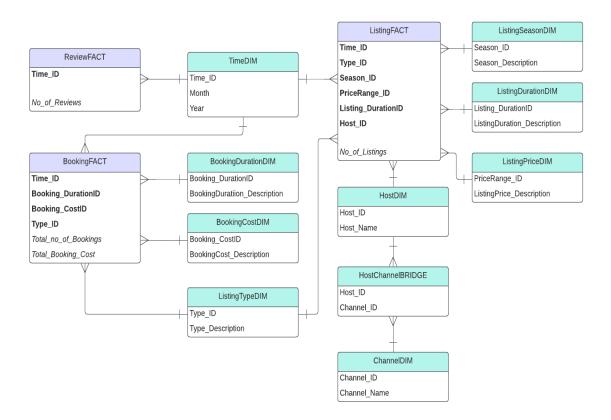


Figure 1.2 Star Schema Design

1.3 Design Task B: Star Schema with Increased Granularity.

In the star schema presented in Figure 1.3, there is an increased level of granularity compared to the schema in Figure 1.2. The key distinction between the two is that Figure 1.2 represents a highly aggregated schema, while Figure 1.3 is not aggregated.

In this new star schema, three additional dimension tables have been introduced: ReviewDIM (linked to ReviewFACT), BookingDIM (linked to BookingFACT), and ListingDIM (linked to ListingFACT). Several dimension tables from Figure 1.2, including BookingDurationDIM, BookingCostDIM, ListingSeasonDIM, ListingDurationDIM, and ListingPriceDIM, have been removed in Figure 1.3. Instead, Listing_Max_Nights replaces Listing_DurationID, and Listing_Price replaces PriceRange_ID. Additionally, TimeDIM has been removed, and date attributes have been moved into the newly created dimension tables: Review_Date in ReviewDIM, Booking_Date in BookingDIM, and Listing_Date in ListingDIM.

In summary, the schema in Figure 1.2 has a high level of aggregation, which supports simplified and generalised analysis with lower granularity. In contrast, the schema in Figure 1.3 has a lower level of aggregation, providing more detailed and specific analysis, and therefore exhibits higher granularity.

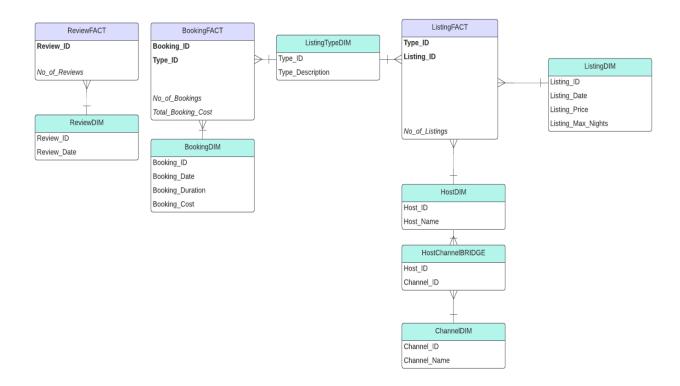


Figure 1.3 Star Schema Design with increase granularity

1.4 Implement Star/Snowflakes Schema using SQL.

Screenshots of dimension tables.

TimeDIM Table:

	∜ TIME_ID	∯ MONTH	∯ YEAR
1	201006	06	2010
2	201007	07	2010
3	201008	08	2010
4	201010	10	2010
5	201011	11	2010
6	201012	12	2010
7	201101	01	2011
8	201102	02	2011
9	201103	03	2011
10	201104	04	2011
11	201105	05	2011
12	201106	06	2011
13	201107	07	2011
14	201108	08	2011
15	201109	09	2011
16	201110	10	2011
17	201111	11	2011
18	201112	12	2011

BookingDurationDIM Table:

1 Short-term less than 30 nights
2 Medium-term 30 to 90 nights
3 Long-term more than 90 nights

$Booking CostDIM\ Table:$

	& BOOKING COSTID	⊕ BOOKINGCOST_DESCRIPTION
1	Low	less than \$5000
2	Medium	\$5000 to \$10000
3	High	more than \$10000

ListingTypeDIM Table:

	↑ TYPE_ID	↑ TYPE_DESCRIPTION
1	1	Private room
2	2	Entire home/apt
3	3	Shared room
4	4	Hotel room

${\bf Listing Season DIM\ Table:}$

		\$ SEASON_DESCRIPTION
1	Spring	9 to 11
2	Summer	12 to 2
3	Autumn	3 to 5
4	Winter	6 to 8

${\bf Listing Duration DIM\ Table:}$

7	LISTING_DURATIONID	
1	Short-term	less than 14 nights
2 1	Medium-term	14 to 30 nights
3]	Long-term	more than 30 nights

ListingPriceDIM Table:

	♦ PRICERANGE_ID	\$LISTINGPRICE_DESCRIPTION
1	Low	less than \$100
2	Medium	\$100 and \$200
3	High	more than \$200

HostDIM Table:

		♦ HOST_NAME
1	27507848	Lauren
2	315458113	Julian
3	246268921	Ginna
4	153592805	Anna
5	385643215	Vi
6	40772432	Stewart
7	347754	Wendy
8	689924	Adrian
9	1777499	Belinda
10	2716860	Jess And Kristy
11	2922619	Dean
12	5370551	Lyn
13	5523791	Jonathan
14	6432048	Sarah
15	7613976	Greg And Louise
16	9221368	Cameron

HostChannelBRIDGE Table:

	⊕ HOST_ID	⊕ CHA
1	18713716	
2	18713716	5
3	85063837	1
4	85063837	2
5	48551496	1
6	48551496	2
7	48551496	3
8	48551496	8
9	48551496	5
10	2793499	1
11	2793499	2
12	2793499	3
13	2793499	4
14	2793499	5
15	7100513	1
16	7100513	2
17	7100513	3
18	7100513	8

ChannelDIM Table:

		CHANNEL_NAME
1	1	email
2	2	phone
3	3	reviews
4	4	jumio
5	5	government_id
6	6	selfie
7	7	identity_manual
8	8	offline_government_id
9	9	facebook
10	10	work_email
11	11	manual_online
12	12	manual_offline
13	13	google
14	14	kba
15	15	weibo
16	16	None
17	18	sesame
18	19	sesame_offline

Screenshots of fact tables.

ReviewFACT Table:

	∯ TIME_ID	NO_OF_REVIEWS
1	201601	58
2	201905	46
3	201012	1
4	201908	43
5	202005	9
6	201411	58
7	201909	43
8	201812	50
9	201901	43
10	201903	47
11	201408	42
12	201409	40
13	201505	50
14	201703	51
15	201710	56
16	201401	58
17	201203	13
18	201208	15

BookingFACT Table:

	↑ TIME_ID	⊕ BOOKING_DURATIONID		↑ TYPE_ID ↑	TOTAL_NO_OF_BOOKINGS	♦ TOTAL_BOOKING_COS
1	201912	Long-term	Medium	2	1762	1907
2	201504	Short-term	Low	2	37906	2679
3	201711	Medium-term	High	2	23084	11907
4	201806	Long-term	High	2	6549	4437
5	202001	Medium-term	High	2	18421	13745
6	201412	Medium-term	Medium	2	53992	14790
7	201707	Medium-term	Medium	2	46178	13701
8	201404	Long-term	Medium	2	5829	1428
9	201508	Medium-term	Low	2	5706	1195
10	201701	Long-term	Medium	2	6041	2673
11	201502	Short-term	Low	2	30221	2996
12	201705	Medium-term	Low	2	7164	1596
13	201705	Short-term	Low	2	20110	1465
14	201809	Medium-term	Low	2	8923	2372
15	201909	Medium-term	High	2	21754	7842
16	201407	Medium-term	Medium	2	18808	5551
17	202109	Long-term	High	2	6664	2533
18	201504	Medium-term	Medium	2	55592	13483

ListingFACT Table:

	TIME_ID	↑ TYPE_ID		₱ PRICERANGE_ID	UISTING_DURATIONID	⊕ HOST_ID	♦ NO_OF_LISTINGS
1	202008	2	Winter	Low	Medium-term	164193	1
2	202011	2	Spring	Low	Medium-term	164193	2
3	201707	2	Winter	Low	Medium-term	50121	4
4	201809	2	Spring	Low	Medium-term	50121	8
5	201906	2	Winter	Low	Medium-term	50121	6
6	201912	2	Summer	Low	Medium-term	50121	13
7	201508	2	Winter	High	Long-term	390761	3
8	201210	2	Spring	Low	Medium-term	50121	2
9	201409	2	Spring	Low	Medium-term	50121	1
10	201804	2	Autumn	Low	Medium-term	50121	9
11	201810	2	Spring	Low	Medium-term	50121	10
12	202011	2	Spring	Medium	Long-term	246509	1
13	201105	2	Autumn	Medium	Medium-term	559227	1
14	201108	2	Winter	Medium	Medium-term	559227	4
15	201201	2	Summer	Medium	Medium-term	559227	2
16	201508	2	Winter	Low	Medium-term	164193	
17	201605	2	Autumn	Low	Medium-term	164193	1
18	201608	2	Winter	Low	Medium-term	164193	2

2. Data Analytic Stage

2.1 Total number of Bookings and the Average Booking Cost for each Month in 2021

The analysis below presents the booking trends in M-Stay throughout 2021, showing the total number of bookings and the average cost per booking for each month. The month with the **highest number of bookings is April**, with 140,515 bookings, while the lowest is October, with only 7,544 bookings. October also recorded the lowest average booking cost at \$3,674. In contrast, **February** had the **highest average booking cost** of \$37,226.33, with 81,353 bookings during that month.

		∯ MONTH	↑ TOTALBOOKINGS	
1	2021	04	140515	65432.5
2	2021	02	81353	37226.33
3	2021	07	78973	36480.83
4	2021	03	75404	36285.57
5	2021	01	77076	35090.67
6	2021	06	72341	32298
7	2021	05	65007	30033.83
8	2021	80	22735	14867.75
9	2021	09	20451	13959.8
10	2021	10	7544	3674

Figure 2.1.1 Screenshot of the results.

2.2 Total number of bookings for each Booking Duration type in 2015

The findings below show the total number of bookings classified by different booking duration types—short-term, medium-term, and long-term for the year 2015. The "**Medium-term**" category, representing bookings lasting 30 to 90 nights, was the most popular among the customers, as the top 12 results fall within this category.

		⊕ MONTH		
1	2015	07	Medium-term	126526
2	2015	01	Medium-term	119512
3	2015	10	Medium-term	107135
4	2015	11	Medium-term	98607
5	2015	12	Medium-term	90706
6	2015	09	Medium-term	90108
7	2015	06	Medium-term	81625
8	2015	02	Medium-term	81314
9	2015	05	Medium-term	71324
10	2015	04	Medium-term	70057
11	2015	03	Medium-term	68497
12	2015	08	Medium-term	55324
13	2015	12	Short-term	54725
14	2015	03	Short-term	48710
15	2015	07	Short-term	46044
16	2015	10	Short-term	41306
17	2015	04	Short-term	39099
18	2015	09	Short-term	35583

Figure 2.2.1 Screenshot of the results.

2.3 Number of listings in each price range for each year

This section shows the distribution of listings across different price ranges for each month and year. The **highest number of listings** fell within the **medium price range** in **September 2014**. Out of the top 18 results, most listings belong to the medium price range, with only two listings in the low price range and none in the high price range.

		⊕ MONTH	₱ PRICERANGE_ID	NUMBER_OF_LISTINGS
1	2014	09	Medium	40
2	2016	09	Medium	38
3	2016	06	Medium	38
4	2017	03	Medium	36
5	2016	12	Medium	36
6	2018	01	Medium	35
7	2015	01	Medium	35
8	2017	12	Low	35
9	2016	10	Medium	35
10	2016	01	Medium	34
11	2013	12	Medium	34
12	2016	11	Medium	34
13	2019	08	Medium	33
14	2017	11	Low	33
15	2019	10	Medium	32
16	2017	01	Medium	32
17	2015	06	Medium	32
18	2015	11	Medium	32

Figure 2.3.1 Screenshot of the results.

2.4 Total number of listings for each season

The finding below shows the number of listings by season. The **highest number of listings** is observed in the **summer of 2016,** with 179 listings, followed closely by spring 2017, with 176 listings. The top 18 results are mostly for listings from 2015 onward.

	∜ YEAR		NUMBER_OF_LISTINGS
1	2016	Summer	179
2	2017	Spring	176
3	2018	Spring	169
4	2017	Summer	169
5	2015	Winter	167
6	2019	Spring	166
7	2017	Winter	165
8	2016	Spring	165
9	2016	Autumn	164
10	2014	Spring	164
11	2015	Spring	163
12	2015	Summer	162
13	2017	Autumn	162
14	2019	Summer	161
15	2019	Autumn	156
16	2018	Summer	154
17	2016	Winter	154
18	2018	Winter	153

Figure 2.4.1 Screenshot of the results.

2.5 Calculate the total number of reviews for each year

The screenshot below displays the trends in the total number of reviews per year. The **lowest number of reviews** is observed in **2010**, with only **3 reviews**, while 2017 has the highest number of reviews. In general, the number of reviews remained high between 2015 and 2019, with over 600 reviews each year. After a consistent increase from 2010 to 2019, there is a significant drop in reviews in 2020.

	∜ YEAR	NUMBER_OF_REVIEWS
1	2010	3
2	2011	40
3	2012	205
4	2013	425
5	2014	541
6	2015	640
7	2016	637
8	2017	680
9	2018	647
10	2019	608
11	2020	263
12	2021	178

Figure 2.5.1 Screenshot of the results.

3. Appendix (SQL Code)

```
--Explore Data
SELECT * FROM MStay.Review;
SELECT * FROM MStay.booking;
SELECT * FROM MStay.guest;
SELECT * FROM MStay.listing;
SELECT * FROM MStay.host;
SELECT * FROM MStay.host_verification;
SELECT * FROM MStay.channel;
SELECT * FROM MStay.listing_type;
SELECT * FROM MStay.property;
SELECT * FROM MStay.property_amenity;
SELECT * FROM MStay. Amenity;
-- Drop tables
drop table MS_review;
drop table MS_booking;
drop table MS_guest;
drop table MS_listing;
drop table MS host;
drop table MS_host_verification;
drop table MS_channel;
drop table MS_listing_type;
drop table MS_property;
drop table MS_property_amenity;
drop table MS_amenity;
-- Data Cleaning
-- Error 1: Duplicate booking id in booking table
SELECT booking_id, COUNT(*)
FROM MStay.booking
GROUP BY booking_id
HAVING COUNT(*) > 1; -- 2 duplicates
SELECT * FROM MStay.booking
WHERE booking_id = 537;
CREATE TABLE MS_booking as
SELECT DISTINCT*
```

FROM MStay.booking;

SELECT COUNT(*) FROM MStay.booking; --5002 rows SELECT COUNT(*) FROM MS_booking; --5001 rows

--Proof no more duplicates
SELECT booking_id, COUNT(*)
FROM MS_booking
GROUP BY booking_id
HAVING COUNT(*) > 1;

SELECT * FROM MS_booking WHERE booking_id = 537;

--Error 2: Duplicate host id in host table SELECT host_id, COUNT(*) FROM MStay.host GROUP BY host_id HAVING COUNT(*) > 1; -- 4 duplicates

SELECT * FROM MStay.host WHERE host_id = 7046664;

CREATE TABLE MS_host AS SELECT DISTINCT * FROM MStay.host;

SELECT COUNT(*) FROM MStay.host; --3883 rows SELECT COUNT(*) FROM MS_host; --3880 rows

--Proof no more duplicates SELECT host_id, COUNT(*) FROM MS_host GROUP BY host_id HAVING COUNT(*) > 1;

SELECT * FROM MS_host WHERE host_id = 7046664;

```
-- Create tables
      -- MS booking, MS host are created during data cleaning
      create table MS review as select * from MStav.Review;
      create table MS_guest as select * from MStay.guest;
      create table MS listing as select * from MStay.listing;
      create table MS_host_verification as select * from MStay.host_verification;
      create table MS_channel as select * from MStay.channel;
      create table MS_listing_type as select * from MStay.listing_type;
      create table MS_property as select * from MStay.property;
      create table MS property amenity as select * from
MStay.property_amenity;
      create table MS_amenity as select * from MStay.amenity;
      --Error 3: Invalid date in host_since in host table
      SELECT TO_CHAR(host_since, 'DD/MM/YYYY')
      FROM MS_host
      ORDER BY host since DESC; --host since: 16/05/9999
      SELECT *
      FROM MS host
      WHERE TO_CHAR(host_since, 'DD/MM/YYYY') = '16/05/9999';
      UPDATE MS host
      SET host_since = NULL
      WHERE TO CHAR(host since, 'DD/MM/YYYY') = '16/05/9999';
      DELETE FROM MS host
      WHERE host since IS NULL;
      SELECT TO CHAR(host since, 'DD/MM/YYYY')
      FROM MS_host
      ORDER BY host since DESC;
      --Error 4: Negative value in listing price in listnig table
      SELECT*
      FROM MS listing
      WHERE listing_price < 0; -- 1 row(listing_id = 99999; listing_price =
-150)
```

UPDATE MS_listing

SET listing_price = NULL WHERE listing_price < 0;

DELETE FROM MS_listing WHERE listing_price IS NULL;

SELECT *

FROM MS_listing

WHERE listing_price < 0;

--Error 5: Invalid relationship in review table

SELECT *

FROM MS_review

WHERE booking_id NOT IN

(SELECT booking_id

FROM MS_booking); --1

UPDATE MS_review

SET booking_id = NULL

WHERE booking_id NOT IN

(SELECT booking_id

FROM MS_booking);

DELETE FROM MS_review

WHERE booking_id IS NULL;

SELECT *

FROM MS_review

WHERE booking_id NOT IN

(SELECT booking_id

FROM MS_booking);

--Error 6 : Invalid relationship in host verification table

SELECT *

FROM MS_host_verification

WHERE host_id NOT IN

(SELECT host_id

FROM MS_host);--host_id =123

UPDATE MS_host_verification

SET host_id = NULL

WHERE host_id NOT IN (SELECT host_id FROM MS_host);

DELETE FROM MS_host_verification WHERE host_id IS NULL;

SELECT *
FROM MS_host_verification
WHERE host_id NOT IN
(SELECT host_id
FROM MS_host);
--Error 7: 2 null values in review table
SELECT *
FROM MS_review
WHERE review_id IS NULL
OR review_date IS NULL
OR review_comment IS NULL; --2 rows

DELETE FROM MS_review WHERE review_comment IS NULL;

SELECT *
FROM MS_review
WHERE review_id IS NULL
OR review_date IS NULL
OR review_comment IS NULL;

--Error 8: 2 null values in amenity table SELECT * FROM MS_amenity WHERE amm_id IS NULL OR amm_description IS NULL; --2 rows

DELETE FROM MS_amenity
WHERE amm_id IS NULL
OR amm_description IS NULL;

SELECT *

```
FROM MS_amenity
      WHERE amm id IS NULL
       OR amm_description IS NULL;
      --Error 9: 3 Invalid relationship in property amenity table
      SELECT *
      FROM MS_property_amenity
      WHERE amm id NOT IN
      (SELECT amm_id
      FROM MS_amenity);
      UPDATE MS_property_amenity
      SET amm_id = NULL
      WHERE amm_id NOT IN
      (SELECT amm_id
      FROM MS_amenity);
      DELETE FROM MS_property_amenity
      WHERE amm id IS NULL;
      -- Data Cleaning Summary
      -- No of duplicate values: 2
      -- No of relationship problems: 3
      -- No of error date: 1
      --No of incorrect value (negative value): 1
      -- No of null values: 2
      --Count no of rows before data cleaning
      SELECT
        (SELECT COUNT(*) FROM MStay.Review) AS review_count,
        (SELECT COUNT(*) FROM MStay.booking) AS booking_count,
        (SELECT COUNT(*) FROM MStay.guest) AS guest_count,
        (SELECT COUNT(*) FROM MStay.listing) AS listing_count,
        (SELECT COUNT(*) FROM MStay.host) AS host count,
        (SELECT COUNT(*) FROM MStay.host_verification) AS
host_verification_count,
```

(SELECT COUNT(*) FROM MStay.channel) AS channel_count, (SELECT COUNT(*) FROM MStay.listing_type) AS listing_type_count, (SELECT COUNT(*) FROM MStay.property) AS property_count,

(SELECT COUNT(*) FROM MStay.property_amenity) AS property_amenity_count,

(SELECT COUNT(*) FROM MStay.Amenity) AS amenity_count FROM dual;

--Count no of rows after data cleaning

SELECT

(SELECT COUNT(*) FROM MS_Review) AS review_count,

(SELECT COUNT(*) FROM MS_booking) AS booking_count,

(SELECT COUNT(*) FROM MS_guest) AS guest_count,

(SELECT COUNT(*) FROM MS_listing) AS listing_count,

(SELECT COUNT(*) FROM MS_host) AS host_count,

(SELECT COUNT(*) FROM MS_host_verification) AS

host_verification_count,

(SELECT COUNT(*) FROM MS_channel) AS channel_count,

(SELECT COUNT(*) FROM MS_listing_type) AS listing_type_count,

(SELECT COUNT(*) FROM MS property) AS property count,

(SELECT COUNT(*) FROM MS_property_amenity) AS

property_amenity_count,

(SELECT COUNT(*) FROM MS_Amenity) AS amenity_count FROM dual;

--IMPLEMENT STAR SCHEMA

- -- CREATE Dimensions
- --1. Create timeDIM

DROP TABLE timeDIM CASCADE CONSTRAINTS PURGE;

CREATE TABLE timeDIM AS

SELECT DISTINCT

TO_CHAR(TO_DATE(booking_date, 'DD/MM/YYYY'), 'YYYYMM') AS time_ID, -- Format as YYYYMM

TO_CHAR(TO_DATE(booking_date, 'DD/MM/YYYY'), 'MM') AS month, -- Extract month

TO_CHAR(TO_DATE(booking_date, 'DD/MM/YYYY'), 'YYYY') AS year

-- Extract year

FROM MS_booking

UNION

```
SELECT DISTINCT
       TO CHAR(TO DATE(review date, 'DD/MM/YYYY'), 'YYYYMM') AS
time ID. -- Format as YYYYMM
       TO_CHAR(TO_DATE(review_date, 'DD/MM/YYYY'), 'MM') AS month,
-- Extract month
       TO_CHAR(TO_DATE(review_date, 'DD/MM/YYYY'), 'YYYY') AS year
-- Extract year
     FROM MS_review
     UNION
     SELECT DISTINCT
       TO_CHAR(TO_DATE(listing_date, 'DD/MM/YYYY'), 'YYYYMM') AS
time_ID, -- Format as YYYYMM
       TO_CHAR(TO_DATE(listing_date, 'DD/MM/YYYY'), 'MM') AS month,
-- Extract month
       TO CHAR(TO DATE(listing date, 'DD/MM/YYYY'), 'YYYY') AS year
Extract year
     FROM MS_listing;
     SELECT * FROM timeDIM;
     SELECT COUNT(*) FROM timeDIM;--136 rows
     --2. CREATE listingSeasonDIM
     DROP TABLE listingSeasonDIM CASCADE CONSTRAINTS PURGE;
     CREATE TABLE listingSeasonDIM(
     season_ID VARCHAR(10) NOT NULL,
     season description VARCHAR2(20) NOT NULL);
     -- INSERT values into listing Season DIM
     --Spring: 9-11
     --Summer: 12 - 2
     --Autumn: 3-5
     --Winter : 6-8
```

INSERT INTO listingSeasonDIM VALUES('Spring','9 to 11'); INSERT INTO listingSeasonDIM VALUES('Summer','12 to 2'); INSERT INTO listingSeasonDIM VALUES('Autumn','3 to 5'); INSERT INTO listingSeasonDIM VALUES('Winter','6 to 8');

SELECT * FROM listingSeasonDIM;

--3. CREATE BookingDurationDIM

DROP TABLE BookingDurationDIM CASCADE CONSTRAINTS PURGE;

CREATE TABLE BookingDurationDIM(

Booking_DurationID VARCHAR2(20) NOT NULL,

BookingDuration_description VARCHAR2(50) NOT NULL);

- -- INSERT values in Booking DurationDIM
- --Short term : less than 30 nights, Medium-term: 30 to 90 nights, long term: more than 90 nights

INSERT INTO BookingDurationDIM VALUES('Short-term', 'less than 30 nights');

INSERT INTO BookingDurationDIM VALUES('Medium-term', '30 to 90 nights');

INSERT INTO BookingDurationDIM VALUES('Long-term', 'more than 90 nights');

SELECT * FROM BookingDurationDIM;

--4. CREATE listing DurationDIM

DROP TABLE listingDurationDIM CASCADE CONSTRAINTS PURGE;

CREATE TABLE listing Duration DIM(

listing_DurationID VARCHAR2(20) NOT NULL,

listingDuration description VARCHAR2(50) NOT NULL);

- -- INSERT values in listing Duration DIM
- --'Short-term':'less than 14 nights',Medium-term: 14 to 30 nights, Long-term: more than 30 nights

INSERT INTO listingDurationDIM VALUES('Short-term', 'less than 14 nights');

INSERT INTO listingDurationDIM VALUES('Medium-term', '14 to 30 nights');

INSERT INTO listingDurationDIM VALUES('Long-term', 'more than 30 nights');

SELECT * FROM listingDurationDIM;

--5. CREATE bookingCostDIM

DROP TABLE bookingCostDIM CASCADE CONSTRAINTS PURGE;

CREATE TABLE bookingCostDIM(
booking_CostID VARCHAR2(20) NOT NULL,
bookingCost_description VARCHAR2(50) NOT NULL);

- -- INSERT Value bookingCostDIM
- --low: less than \$5000, medium : \$5000 to \$10000, high: more than \$10000

INSERT INTO bookingCostDIM VALUES('Low', 'less than \$5000'); INSERT INTO bookingCostDIM VALUES('Medium', '\$5000 to \$10000'); INSERT INTO bookingCostDIM VALUES('High', 'more than \$10000');

SELECT * FROM bookingCostDIM;

--6. CREATE listingPriceDIM
DROP TABLE listingPriceDIM CASCADE CONSTRAINTS PURGE;
CREATE TABLE listingPriceDIM(
priceRange_ID VARCHAR2(20) NOT NULL,
ListingPrice_description VARCHAR2(50) NOT NULL);

- -- INSERT Value
- --low: less than \$100, medium: \$100 to \$200, high: more than \$200 INSERT INTO listingPriceDIM VALUES('Low', 'less than \$100'); INSERT INTO listingPriceDIM VALUES('Medium', '\$100 and \$200'); INSERT INTO listingPriceDIM VALUES('High', 'more than \$200');

SELECT * FROM listingPriceDIM;

--7. CREATE listingTypeDIM
DROP TABLE listingTypeDIM CASCADE CONSTRAINTS PURGE;
CREATE TABLE listingTypeDIM AS
SELECT * FROM MS_listing_type;

SELECT * FROM listingTypeDIM;

--8. CREATE hostDIM
DROP TABLE hostDIM CASCADE CONSTRAINTS PURGE;
CREATE TABLE hostDIM AS
SELECT host_ID,host_name FROM MS_HOST;

```
SELECT * FROM hostDIM;
     SELECT COUNT(*) FROM hostDIM;--3879 rows
     --9. CREATE ChannelDIM
     DROP TABLE channelDIM CASCADE CONSTRAINTS PURGE;
     CREATE TABLE channelDIM AS
     SELECT channel_id, channel_name FROM MS_Channel;
     SELECT * FROM channelDIM;
     SELECT COUNT(*) FROM channelDIM;--20 rows
     --10. CREATE HostChannelBRIDGE
     DROP TABLE HostChannelBRIDGE CASCADE CONSTRAINTS PURGE;
     CREATE TABLE HostChannelBRIDGE AS
     SELECT * FROM MS Host Verification;
     SELECT * FROM HostChannelBRIDGE;
     SELECT COUNT(*) FROM HostChannelBRIDGE;
     -- CREATE Facts
     --1. CREATE reviewFACT (time_id,no_of_reviews[sum of Review_id])
     DROP TABLE reviewFACT CASCADE CONSTRAINTS PURGE;
     CREATE TABLE reviewFACT AS
     SELECT TO_CHAR(TO_DATE(R.review_date, 'DD/MM/YYYY'), 'YYYYMM')
AS time ID,
     COUNT(R.review_id) AS No_of_reviews
     FROM MS review R
     GROUP BY TO CHAR(TO DATE(R.review date, 'DD/MM/YYYY'),
'YYYYMM');
```

SELECT * FROM reviewFACT;

SELECT COUNT(*) FROM reviewFACT;--126 rows

- --2. CREATE bookingFACT (time_id, booking_duration, booking_cost,type_id,
 - --total_no_of_bookings, total_booking_cost,average booking cost)
 - --Create tempBookingFACT DROP TABLE tempBookingFACT CASCADE CONSTRAINTS PURGE;

CREATE TABLE tempBookingFACT AS SELECT B.Booking_date, B.booking_duration, B.booking_cost, L.type_id, B.booking_id FROM MS_Booking B, MS_Listing L WHERE B.listing_id = L.listing_id; --add column call booking_durationID ALTER TABLE tempBookingFACT ADD (booking_durationID VARCHAR(20)); UPDATE tempBookingFACT SET booking_durationID = 'Short-term' WHERE booking_duration < 30; UPDATE tempBookingFACT SET booking_durationID = 'Medium-term' WHERE booking_duration >= 30 AND booking_duration <=90; UPDATE tempBookingFACT SET booking durationID = 'Long-term' WHERE booking_duration > 90; --add column call booking_costID ALTER TABLE tempBookingFACT ADD (booking_costID VARCHAR(20)); UPDATE tempBookingFACT SET booking_costID = 'Low' WHERE booking_cost < 5000; UPDATE tempBookingFACT SET booking_costID = 'Medium' WHERE booking_cost >= 5000 AND booking_cost <=10000; UPDATE tempBookingFACT

SET booking_costID = 'High'

```
WHERE booking_cost > 10000;
     -- CREATE BookingFACT
     DROP TABLE BookingFACT CASCADE CONSTRAINTS PURGE;
     CREATE TABLE BookingFACT AS
     SELECT TO_CHAR(TO_DATE(T.Booking_Date, 'DD/MM/YYYY'), 'YYYYMM')
AS time ID,
     T.Booking_durationID,T.Booking_CostID,T.Type_ID,
     SUM(T.Booking_ID) AS Total_No_of_Bookings,SUM(T.Booking_Cost) AS
Total Booking Cost
     FROM
       tempBookingFACT T
     GROUP BY
       TO_CHAR(TO_DATE(T.Booking_Date, 'DD/MM/YYYY'), 'YYYYMM'),
       T.Booking durationID, T.Booking CostID, T.Type ID;
     SELECT * FROM BookingFACT ORDER BY TIME ID ASC;
     SELECT COUNT(*) FROM BookingFACT;--766 rows
     --3. CREATE listingFACT (time_id, type_id, season_id, priceRange_id,
listing_duration,
     --host_id,no_of_listings[listing_id])
     -- CREATE tempListingFACT
     DROP TABLE tempListingFACT CASCADE CONSTRAINTS PURGE;
     CREATE TABLE tempListingFACT AS
     SELECT L.Listing_date,L.type_id,
     L.listing_price, L.listing_max_nights, H.Host_id, L.Listing_id
     FROM MS_Listing L, MS_Host H
     WHERE L.Host id = H.Host id;
     --add column call season_ID
     ALTER TABLE tempListingFACT
     ADD (season_ID VARCHAR(20));
     UPDATE tempListingFACT
      SET season ID = 'Spring'
     WHERE TO CHAR(Listing Date, 'MM')>= 9 AND
      TO_CHAR(Listing_Date,'MM')<=11; --mm 9 to 11
```

UPDATE tempListingFACT
SET season_ID = 'Summer'
WHERE TO_CHAR(Listing_Date,'MM')>= 12 OR
TO_CHAR(Listing_Date,'MM')<=2; --mm 12 to 2

UPDATE tempListingFACT
SET season_ID = 'Autumn'
WHERE TO_CHAR(Listing_Date,'MM')>= 3 AND
TO_CHAR(Listing_Date,'MM')<=5; --3 to 5

UPDATE tempListingFACT
SET season_ID = 'Winter'
WHERE TO_CHAR(Listing_Date,'MM')>= 6 AND
TO_CHAR(Listing_Date,'MM')<=8; --6 to 8

--add column call priceRange_ID
ALTER TABLE tempListingFACT
ADD (PriceRange_ID VARCHAR(20));

UPDATE tempListingFACT SET PriceRange_ID = 'Low' WHERE Listing_Price < 100;

UPDATE tempListingFACT

SET PriceRange_ID = 'Medium'

WHERE Listing_Price >= 100 AND Listing_Price <= 200;

UPDATE tempListingFACT SET PriceRange_ID = 'High' WHERE Listing_Price > 200;

--add column call Listing_DurationIDALTER TABLE tempListingFACTADD (Listing_DurationID VARCHAR(20));

UPDATE tempListingFACT
SET Listing_DurationID = 'Short-term'
WHERE Listing_Max_Nights < 14;

```
UPDATE tempListingFACT
      SET Listing DurationID = 'Medium-term'
      WHERE Listing_Max_Nights >= 14 AND Listing_Max_Nights <= 30;
      UPDATE tempListingFACT
      SET Listing DurationID = 'Long-term'
      WHERE Listing_Max_Nights > 30;
      -- CREATE ListingFACT
      DROP TABLE ListingFACT CASCADE CONSTRAINTS PURGE;
      CREATE TABLE ListingFACT AS
      SELECT TO_CHAR(TO_DATE(T.Listing_Date, 'DD/MM/YYYY'), 'YYYYMM')
AS time_ID,
      T.Type ID,T.Season ID,T.PriceRange ID,T.Listing DurationID,T.Host ID,
      COUNT(T.Listing_ID) AS No_of_Listings
      FROM
       tempListingFACT T
      GROUP BY
       TO CHAR(TO DATE(T.Listing Date, 'DD/MM/YYYY'), 'YYYYMM'),
       T.Type_ID,T.Season_ID,T.PriceRange_ID,T.Listing_DurationID,T.Host_ID;
      SELECT * FROM ListingFACT;
      SELECT COUNT(*) FROM ListingFACT;--2031rows
      -- Data Analytics Stage
      -- 1. total number of bookings and the average booking cost in year 2021
      SELECT t.Year, t.Month,
         SUM(bf.Total_no_of_Bookings) AS TotalBookings,
         ROUND((SUM(bf.Total_booking_cost) /
COUNT(bf.Total_no_of_Bookings)), 2) AS AVG_BookingCost
      FROM BookingFACT bf, TimeDIM t
      WHERE bf. Time ID = t. Time ID
      AND t.Year = 2021
      GROUP BY t.Year, t.Month
      ORDER BY AVG_BookingCost DESC;
      -- 2. total number of bookings for each booking duration type in 2015
```

SELECT t.Year, t.Month, bf.Booking_DurationID,

SUM(bf.Total_no_of_Bookings) AS TotalBookings FROM BookingFACT bf, TimeDIM t WHERE bf.Time_ID = t.Time_ID AND t.Year = 2015 GROUP BY t.Year, t.Month, bf.Booking_DurationID ORDER BY TotalBookings DESC;

-- 3. Count the number of listings in each price range for the year 2015 SELECT t.Year, t.Month, lf.PriceRange_ID,

SUM(no_of_listings) AS Number_of_Listings FROM ListingFACT If, TimeDIM t WHERE If.Time_ID = t.Time_ID GROUP BY t.Year, t.Month, If.PriceRange_ID ORDER BY Number_of_Listings DESC;

-- 4. Display the total number of listings for each season

SELECT t.Year, S.Season_ID,

SUM(no_of_listings) AS Number_of_Listings
FROM ListingFACT lf, TimeDIM t, ListingSeasonDIM S
WHERE lf.Time_ID = t.Time_ID
AND lf.Season_ID = S.Season_ID
GROUP BY t.Year, S.Season_ID

ORDER BY Number_of_Listings DESC;

-- 5. Calculate the total number of reviews for each year SELECT t.Year,

SUM(rf.No_of_reviews) AS Number_of_Reviews
FROM ReviewFACT rf, TimeDIM t
WHERE rf.Time_ID = t.Time_ID
GROUP BY t.Year
ORDER BY t.Year;

--Overview of FACT Tables

SELECT * FROM ReviewFACT;

SELECT * FROM BookingFACT;

SELECT * FROM ListingFACT;

--Overview of Dimension Tables

SELECT * FROM TimeDIM;

SELECT * FROM BookingDurationDIM;

SELECT * FROM BookingCostDIM;

SELECT * FROM ListingTypeDIM;

SELECT * FROM ListingSeasonDIM;

SELECT * FROM ListingDurationDIM;

SELECT * FROM ListingPriceDIM;

SELECT * FROM HostDIM;

SELECT * FROM HostChannelBRIDGE;

SELECT * FROM ChannelDIM;