

Visualización para grandes volúmenes de datos

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Actividad 2: Proyecto Integrador de Sistemas de Modelado, Procesamiento y Gestión

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1. Reseña escrita

El modelado y la gestión eficiente de grandes volúmenes de datos se han vuelto cruciales en la era digital actual, pues a medida que las organizaciones generan y recolecta grandes cantidades de información, la capacidad para tratar, procesar y extraer valor de estos datos se ha convertido en una necesidad y en una ventaja competitiva clave para el mundo empresarial y el desarrollo de diversos sectores.

El modelado de datos permite estructurar y organizar la información de manera que sea fácilmente accesible y analizable, lo que facilita la identificación de patrones, tendencias, correlaciones y nuevos puntos de vista que pueden impulsar la toma de decisiones con información valiosa y también la innovación. Por otro lado, una gestión eficiente garantiza que los datos se almacenen, procesen y transmitan de manera segura y rentable preservando su integridad y seguridad, esto se traduce en una ventaja competitiva clave, permitiendo a las empresas mejorar sus operaciones, personalizar productos y servicios, y anticipar tendencias futuras.

Sin embargo, el manejo de Big Data también presenta desafíos importantes que se deben superar, como lo son la integración de datos heterogéneos, el procesamiento en tiempo real, la necesidad de infraestructura adecuada, la protección de la privacidad y la garantía de la calidad de los datos. Abordar estas dificultades es esencial y fundamental para aprovechar al máximo el potencial de los grandes volúmenes de datos en nuestra sociedad y aplicarlos de una manera adecuada en el día a día de las organizaciones.

En resumen, el modelado y la gestión eficiente de grandes volúmenes de datos son fundamentales para convertir datos brutos en información valiosa, facilitando la toma de decisiones informadas, impulsando la innovación y promoviendo el progreso en diversos sectores. Su importancia radica en su capacidad para transformar la manera en que las empresas operan, investigan y evolucionan en un mundo cada vez más interesado en la información y con una dependencia creciente hacia el Big Data.

2. Airbnb Listing Data 2023



Configuración del ambiente de Google Colaboratory con Pyspark y Hadoop

```
# Download Java
!apt-get install openjdk-8-jdk-headless -qq > /dev/null
# Next, we will install Apache Spark 3.0.1 with Hadoop 2.7 from here.
!wget https://archive.apache.org/dist/spark/spark-3.5.1/spark-3.5.1-bin-hadoop3.tgz
# Now, we just need to unzip that folder.
!tar xf spark-3.5.1-bin-hadoop3.tgz

# Setting JVM and Spark path variables
import os
os.environ["JAVA_HOME"] = "/usr/lib/jvm/java-8-openjdk-amd64"
os.environ["SPARK_HOME"] = "/content/spark-3.5.1-bin-hadoop3"

# Installing required packages
!pip install pyspark==3.5.1
!pip install findspark
```

Importamos librerías

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import os
import plotly.express as px
import plotly.io as pio

import findspark
findspark.init()

from pyspark import SparkContext
from pyspark.sql import Window
from pyspark.sql import SparkSession
from pyspark.sql.types import DoubleType, IntegerType, DateType
from pyspark.sql import functions as fct
from pyspark.ml import Pipeline
from pyspark.sql import SQLContext
from pyspark.sql.functions import mean,col,split,regexp_extract,when,lit,sum,desc,to_date,expr,round,avg,max,count,regexp_replace, trim
from pyspark.ml.feature import StringIndexer, VectorAssembler
from pyspark.ml.evaluation import MulticlassClassificationEvaluator
from pyspark.ml.feature import QuantileDiscretizer
```

Creamos la sesión de Spark

```
✓ 13 s [3] SpSession = SparkSession \
        .builder \
        .appName("Airbnb Spark") \
        .getOrCreate()

✓ 0 s [4] SpContext = SpSession.sparkContext
```

Importamos los datos y los visualizamos

```
df1 = SpSession.read.csv('/content/airnb.csv', header=True, sep=",")
df1.show(5)

df2 = SpSession.read.csv('/content/airnb_desert.csv', header=True, sep=",")
df2.show(5)

df3 = SpSession.read.csv('/content/airnb_luxe.csv', header=True, sep=",")
df3.show(5)
```

```
+-----+-----+-----+-----+-----+-----+
| Title | Detail | Date | Price(in dollar) | Offer price(in dollar) | Review and rating | Number of bed |
+-----+-----+-----+-----+-----+-----+
| Chalet in Skykomi... | Sky Haus - A-Fram... | Jun 11 - 16 | 306.00 | 229.00 | 4.85 (531) | 4 beds |
| Cabin in Hancock,... | The Catskill A-Fr... | Jun 6 - 11 | 485.00 | 170.00 | 4.77 (146) | 4 beds |
| Cabin in West Far... | The Triangle: A-F... | Jul 9 - 14 | 119.00 | 522.00 | 4.91 (515) | 4 beds |
| Home in Blue Ridg... | *Summer Sizzle* 5... | Jun 11 - 16 | 192.00 | 348.00 | 4.94 (88) | 5 beds |
| Treehouse in Gran... | Luxury Treehouse ... | Jun 4 - 9 | 232.00 | 196.00 | 4.99 (222) | 1 queen bed |
+-----+-----+-----+-----+-----+-----+
```

only showing top 5 rows

```
+-----+-----+-----+-----+-----+
| Desert name | Date | Price(In dollar) | Details | Rating |
+-----+-----+-----+-----+-----+
| Mhamid, Morocco | May 1 | 479.00 | Near Sahara Desert | 4.79 |
| Aqaba City, Jordan | May 1 | 2,168.00 | Near Arabian Desert | 4.92 |
| Tamesluht, Morocco | May 1 | 17,752.00 | 9,404 kilometers ... | 4.95 |
| Al Bairat, Egypt | May 1 | 1,982.00 | Near Sahara Desert | 4.88 |
| Tamesluht, Morocco | May 1 | 17,752.00 | 9,404 kilometers ... | 4.87 |
+-----+-----+-----+-----+-----+
```

only showing top 5 rows

```
+-----+-----+-----+-----+
| Luxe name | Date | Price(In dollar) | Distance |
+-----+-----+-----+-----+
| Koh Samui, Thailand | May 1 | 89,600.00 | 1,880 kilometers ... |
| Koh Samui, Thailand | May 1 | 78,459.00 | 1,880 kilometers ... |
| Koh Samui, Thailand | May 1 | 53,200.00 | 1,881 kilometers ... |
| Koh Samui, Thailand | May 1 | 35,000.00 | 1,880 kilometers ... |
| Nathon, Thailand | May 1 | 19,656.00 | 1,872 kilometers ... |
+-----+-----+-----+-----+
```

only showing top 5 rows

Exploración de esquemas

```
root
|-- Title: string (nullable = true)
|-- Detail: string (nullable = true)
|-- Date: string (nullable = true)
|-- Price(in dollar): string (nullable = true)
|-- Offer price(in dollar): string (nullable = true)
|-- Review and rating: string (nullable = true)
|-- Number of bed: string (nullable = true)

root
|-- Desert name: string (nullable = true)
|-- Date: string (nullable = true)
|-- Price(In dollar): string (nullable = true)
|-- Details: string (nullable = true)
|-- Rating: string (nullable = true)

root
|-- Luxe name: string (nullable = true)
|-- Date: string (nullable = true)
|-- Price(In dollar): string (nullable = true)
|-- Distance: string (nullable = true)
```

Características estadísticas básicas

summary	Title	Detail	Date	Price(in dollar)	Offer price(in dollar)	Review and rating	Number of bed
count	957	957	953	949	172	951	949
mean	NULL	NULL	99.0	170.51797040169134	149.90419161676647	NULL	NULL
stddev	NULL	NULL	88.1702897806285	135.57467024158484	134.32384144266746	NULL	NULL
min	A Resort by the Sea	La cabane du ...	rural tourism. Y...	1,463.00	1,089.00	1 sofa bed	1 bed
max	Yurt in Rising Fawn	Boka Bay view a...	Sep 9 - 14	Sep 16 - 21	99.00	None	9 beds

summary	Desert name	Date	Price(In dollar)	Details	Rating
count	280	280	280	280	280
mean	NULL	NULL	554.92	NULL	4.721904761904762
stddev	NULL	NULL	251.24331478828736	NULL	0.2559845438376616
min	???? ???? ??, Jordan	May 1 - 29	1,041.00	10,017 kilometers ...	3.5
max	Orzola, Spain	May 5 - Jun 2	998.00	Near Thar Desert	None

summary	Luxe name	Date	Price(In dollar)	Distance
count	280	280	280	280
mean	NULL	NULL	NULL	NULL
stddev	NULL	NULL	NULL	NULL
min	A. Thalang, Thailand	May 1 - 29	100,047.00	1,860 kilometers ...
max	Ysterni, Greece	May 6 - Jun 3	96,793.00	9,954 kilometers ...

Preparación de los datos, consultas y transformaciones:

Identificación de valores nulos

```

Valores nulos en 'Title': 0
Valores nulos en 'Detail': 0
Valores nulos en 'Date': 4
Valores nulos en 'Price(in dollar)': 8
Valores nulos en 'Offer price(in dollar)': 785
Valores nulos en 'Review and rating': 6
Valores nulos en 'Number of bed': 8

Valores nulos en 'Desert name': 0
Valores nulos en 'Date': 0
Valores nulos en 'Price(In dollar)': 0
Valores nulos en 'Details': 0
Valores nulos en 'Rating': 0

Valores nulos en 'Luxe name': 0
Valores nulos en 'Date': 0
Valores nulos en 'Price(In dollar)': 0
Valores nulos en 'Distance': 0

```

Eliminación de la columna 'OfferPrice' de df1 debido a que no es relevante para nuestro análisis

	Title	Detail	Date	Price(in dollar)	Review and rating	Number of bed
	Chalet in Skykomi...	Sky Haus - A-Fram...	Jun 11 - 16	306.00	4.85 (531)	4 beds
	Cabin in Hancock,...	The Catskill A-Fr...	Jun 6 - 11	485.00	4.77 (146)	4 beds
	Cabin in West Far...	The Triangle: A-F...	Jul 9 - 14	119.00	4.91 (515)	4 beds

only showing top 3 rows

Renombramos columnas y etiquetamos

Name	Detail	Date	Price	Review and rating	Number of bed	Category
Chalet in Skykomi...	Sky Haus - A-Fram...	Jun 11 - 16	306.00	4.85 (531)	4 beds	Standard
Cabin in Hancock,...	The Catskill A-Fr...	Jun 6 - 11	485.00	4.77 (146)	4 beds	Standard
Cabin in West Far...	The Triangle: A-F...	Jul 9 - 14	119.00	4.91 (515)	4 beds	Standard

only showing top 3 rows

Name	Date	Price	Details	Rating	Category
Mhamid, Morocco	May 1 29	479.00	Near Sahara Desert	4.79	Desert
Aqaba City, Jordan	May 1 29	2,168.00	Near Arabian Desert	4.92	Desert
Tamesluht, Morocco	May 1 29	17,752.00	9,404 kilometers ...	4.95	Desert

only showing top 3 rows

Name	Date	Price	Distance	Category
Koh Samui, Thailand	May 1 29	89,600.00	1,880 kilometers ...	Luxe
Koh Samui, Thailand	May 1 29	78,459.00	1,880 kilometers ...	Luxe
Koh Samui, Thailand	May 1 29	53,200.00	1,881 kilometers ...	Luxe

Extracción del mes de Date, filtrado y eliminación de valores atípicos

Name	Detail	Date	Price	Review and rating	Number of bed	Category	Month
Chalet in Skykomi...	Sky Haus - A-Fram...	Jun 11 - 16	306.00	4.85 (531)	4 beds	Standard	Jun
Cabin in Hancock,...	The Catskill A-Fr...	Jun 6 - 11	485.00	4.77 (146)	4 beds	Standard	Jun
Cabin in West Far...	The Triangle: A-F...	Jul 9 - 14	119.00	4.91 (515)	4 beds	Standard	Jul
Home in Blue Ridg...	*Summer Sizzle* 5...	Jun 11 - 16	192.00	4.94 (88)	5 beds	Standard	Jun
Treehouse in Gran...	Luxury Treehouse ...	Jun 4 - 9	232.00	4.99 (222)	1 queen bed	Standard	Jun

only showing top 5 rows

Name	Date	Price	Details	Rating	Category	Month
Mhamid, Morocco	May 1 29	479.00	Near Sahara Desert	4.79	Desert	May
Aqaba City, Jordan	May 1 29	2,168.00	Near Arabian Desert	4.92	Desert	May
Tamesluht, Morocco	May 1 29	17,752.00	9,404 kilometers ...	4.95	Desert	May
Al Bairat, Egypt	May 1 29	1,982.00	Near Sahara Desert	4.88	Desert	May
Tamesluht, Morocco	May 1 29	17,752.00	9,404 kilometers ...	4.87	Desert	May

only showing top 5 rows

Name	Date	Price	Distance	Category	Month
Koh Samui, Thailand	May 1 29	89,600.00	1,880 kilometers ...	Luxe	May
Koh Samui, Thailand	May 1 29	78,459.00	1,880 kilometers ...	Luxe	May
Koh Samui, Thailand	May 1 29	53,200.00	1,881 kilometers ...	Luxe	May
Koh Samui, Thailand	May 1 29	35,000.00	1,880 kilometers ...	Luxe	May
Nathon, Thailand	May 1 29	19,656.00	1,872 kilometers ...	Luxe	May

only showing top 5 rows

Casteo de Price como un valor numérico

```

+-----+-----+-----+-----+-----+-----+-----+
|          Name|          Detail|          Date|Price|Review and rating|Number of bed|Category|Month|
+-----+-----+-----+-----+-----+-----+-----+
|Chalet in Skykomi...|Sky Haus - A-Fram...|Jun 11 - 16|306.0|4.85 (531)|4 beds|Standard|Jun|
|Cabin in Hancock,...|The Catskill A-Fr...|Jun 6 - 11|485.0|4.77 (146)|4 beds|Standard|Jun|
|Cabin in West Far...|The Triangle: A-F...|Jul 9 - 14|119.0|4.91 (515)|4 beds|Standard|Jul|
|Home in Blue Ridg...|*Summer Sizzle* 5...|Jun 11 - 16|192.0|4.94 (88)|5 beds|Standard|Jun|
|Treehouse in Gran...|Luxury Treehouse ...|Jun 4 - 9|232.0|4.99 (222)|1 queen bed|Standard|Jun|
+-----+-----+-----+-----+-----+-----+-----+
only showing top 5 rows
+-----+-----+-----+-----+-----+-----+-----+
|          Name|          Date|          Price|          Details|Rating|Category|Month|
+-----+-----+-----+-----+-----+-----+-----+
|Mhamid, Morocco|May 1 | 29| 479.0|Near Sahara Desert|4.79|Desert|May|
|Aqaba City, Jordan|May 1 | 29| 2168.0|Near Arabian Desert|4.92|Desert|May|
|Tamesluht, Morocco|May 1 | 29|17752.0|9,404 kilometers ...|4.95|Desert|May|
|Al Bairat, Egypt|May 1 | 29|1982.0|Near Sahara Desert|4.88|Desert|May|
|Tamesluht, Morocco|May 1 | 29|17752.0|9,404 kilometers ...|4.87|Desert|May|
+-----+-----+-----+-----+-----+-----+-----+
only showing top 5 rows
+-----+-----+-----+-----+-----+-----+-----+
|          Name|          Date|          Price|          Distance|Category|Month|
+-----+-----+-----+-----+-----+-----+-----+
|Koh Samui, Thailand|May 1 | 29|89600.0|1,880 kilometers ...|Luxe|May|
|Koh Samui, Thailand|May 1 | 29|78459.0|1,880 kilometers ...|Luxe|May|
|Koh Samui, Thailand|May 1 | 29|53200.0|1,881 kilometers ...|Luxe|May|
|Koh Samui, Thailand|May 1 | 29|35000.0|1,880 kilometers ...|Luxe|May|
|Nathon, Thailand|May 1 | 29|19656.0|1,872 kilometers ...|Luxe|May|
+-----+-----+-----+-----+-----+-----+-----+
only showing top 5 rows

```

Extracción de los países para los df

```

+-----+-----+
|          Country|
+-----+-----+
|          Tunisia|
|Dominican Republic|
|          Colombia|
|          Ireland|
|          Cuba|
|          Taiwan|
|          El Salvador|
|          Canada|
|          Germany|
|          Curaçao|
|          US|
|          UK|
|          Spain|
|          Vietnam|
|          Czechia|
|          Philippines|
|          Jamaica|
|          Puerto Rico|
|          Malaysia|
|          Switzerland|
+-----+-----+
only showing top 20 rows

```


Country
Tunisia
Australia
Israel
Aswan
Spain
Egypt
Oman
Morocco
Jordan
Namibia
Morocco
India
Saudi Arabia
Greece
South Africa
UAE

Country
Croatia
Australia
Maldives
Sri Lanka
Mauritius
Turkey
Montenegro
Koh Samui
Italy
Sweden
Austria
Norway
Indonesia
Thailand
Greece
Finland
South Africa

Unión de los df con algunas columnas

```
+-----+-----+-----+-----+
|          Name | Price | Category | Country |
+-----+-----+-----+-----+
| Chalet in Skykomi... | 306.0 | Standard | US |
| Cabin in Hancock,... | 485.0 | Standard | US |
| Cabin in West Far... | 119.0 | Standard | US |
| Home in Blue Ridg... | 192.0 | Standard | US |
| Treehouse in Gran... | 232.0 | Standard | US |
+-----+-----+-----+-----+
only showing top 5 rows
```

Filtro de propiedades con precio mayor a 1000 USD

```
+-----+-----+-----+-----+
| Name          | Price  | Category | Country |
+-----+-----+-----+-----+
| Home in Moss Beach, California, US | 1463.0 | Standard | US      |
| Aqaba City, Jordan                  | 2168.0 | Desert   | Jordan  |
| Tamesluht, Morocco                 | 17752.0 | Desert   | Morocco |
| Al Bairat, Egypt                   | 1982.0 | Desert   | Egypt   |
| Tamesluht, Morocco                 | 17752.0 | Desert   | Morocco |
| Mitzpe Ramon, Israel                | 2502.0 | Desert   | Israel  |
| Tinghir, Morocco                   | 1346.0 | Desert   | Morocco |
| Mitzpe Ramon, Israel                | 2945.0 | Desert   | Israel  |
| Merzouga, Morocco                  | 2937.0 | Desert   | Morocco |
| Essaouira, Morocco                 | 5386.0 | Desert   | Morocco |
| Tzofar, Israel                     | 1821.0 | Desert   | Israel  |
| Ait Bihi, Morocco                  | 1096.0 | Desert   | Morocco |
| Al Bairat, Egypt                   | 1670.0 | Desert   | Egypt   |
| 🏠rzola, Spain                       | 2396.0 | Desert   | Spain   |
| Aglou, Morocco                     | 2792.0 | Desert   | Morocco |
| Marrakech, Morocco                 | 3561.0 | Desert   | Morocco |
| Tamesluht, Morocco                 | 12800.0 | Desert   | Morocco |
| Arad, Israel                       | 3737.0 | Desert   | Israel  |
| Mhamid, Morocco                    | 1145.0 | Desert   | Morocco |
| ???????, Morocco                   | 1149.0 | Desert   | Morocco |
+-----+-----+-----+-----+
only showing top 20 rows
```

Los 10 hospedajes más baratos

Name	Price
Campsite in Rif, Iceland	16.0
Campsite in Rif, Iceland	16.0
Hotel in Nha Trang, Vietnam	17.0
Hut in Guarne, Colombia	18.0
Apartment in Bangkok, Thailand	19.0
Home in Jumilhac-le-Grand, France	20.0
Earthen home in Mueang Chiang Mai District, Thailand	22.0
Earthen home in Mueang Chiang Mai District, Thailand	22.0
Condo in Melaka, Malaysia	23.0
Place to stay in Thành phố Hội An, Vietnam	24.0

only showing top 10 rows

Filtro de hospedajes por país únicamente en Colombia

Name	Price	Category	Country
Tiny home in Medellín, Colombia	67.0	Standard	Colombia
Cabin in Medellín, Colombia	51.0	Standard	Colombia
Place to stay in Retiro, Colombia	107.0	Standard	Colombia
Chalet in Cajicá, Colombia	40.0	Standard	Colombia
Cabin in El Peñol, Colombia	220.0	Standard	Colombia
Cabin in Santa Marta, Colombia	61.0	Standard	Colombia
Hut in Guarne, Colombia	18.0	Standard	Colombia

Orden de acuerdo al rating o calificación del hospedaje

Name	Detail	Date	Price	Review and rating	Number of bed	Category	Month	city	country
Home in Los Angeles	Hollywood Sunset ...	May 13 - 18	272.0	5.0 (99)	2 king beds	Standard	May	NULL	NULL
Villa in Kathu, T...	Tiny Poolvilla in...	Jul 25 - 30	119.0	5.0 (98)	1 king bed	Standard	Jul	Thailand	Thailand
Villa in Kathu, T...	Tiny Poolvilla in...	Jul 25 - 30	119.0	5.0 (98)	1 king bed	Standard	Jul	Thailand	Thailand
Villa in Morongo ...	Pink Galaxy Pri...	Jun 7 - 12	283.0	5.0 (9)	1 queen bed	Standard	Jun	California	US
Farm stay in Sark...	Off-Grid vineyard...	Jun 7 - 13	144.0	5.0 (9)	3 beds	Standard	Jun	Turkey	Turkey
Cottage in Boscas...	A Boscastle barn...	Jun 11 - 16	141.0	5.0 (9)	1 king bed	Standard	Jun	UK	UK
Room in Wien, Aus...	Central luxury /H...	Sep 17 - 22	92.0	5.0 (9)	3 beds	Standard	Sep	Austria	Austria
Room in Kecamatan...	Odesa Villa1 Ubud...	Jun 11 - 16	29.0	5.0 (9)	1 bed	Standard	Jun	Indonesia	Indonesia
Home in Ellington	Crystal Lake House	May 1 - 6	155.0	5.0 (9)	4 beds	Standard	May	NULL	NULL
Tiny home in Greer	*BRAND NEW* Tiny ...	May 1 - 6	90.0	5.0 (86)	2 beds	Standard	May	NULL	NULL

only showing top 10 rows

Extracción de la valoración

Name	Detail	Date	Price	Review and rating	Number of bed	Category	Month	city	country	valoración
Home in Los Angeles	Hollywood Sunset ...	May 13 - 18	272.0	5.0 (99)	2 king beds	Standard	May	NULL	NULL	5.0
Villa in Kathu, T...	Tiny Poolvilla in...	Jul 25 - 30	119.0	5.0 (98)	1 king bed	Standard	Jul	Thailand	Thailand	5.0
Villa in Kathu, T...	Tiny Poolvilla in...	Jul 25 - 30	119.0	5.0 (98)	1 king bed	Standard	Jul	Thailand	Thailand	5.0
Villa in Morongo ...	Pink Galaxy Pri...	Jun 7 - 12	283.0	5.0 (9)	1 queen bed	Standard	Jun	California	US	5.0
Farm stay in Sark...	Off-Grid vineyard...	Jun 7 - 13	144.0	5.0 (9)	3 beds	Standard	Jun	Turkey	Turkey	5.0
Cottage in Boscas...	A Boscastle barn...	Jun 11 - 16	141.0	5.0 (9)	1 king bed	Standard	Jun	UK	UK	5.0
Room in Wien, Aus...	Central luxury /H...	Sep 17 - 22	92.0	5.0 (9)	3 beds	Standard	Sep	Austria	Austria	5.0
Room in Kecamatan...	Odesa Villa1 Ubud...	Jun 11 - 16	29.0	5.0 (9)	1 bed	Standard	Jun	Indonesia	Indonesia	5.0
Home in Ellington	Crystal Lake House	May 1 - 6	155.0	5.0 (9)	4 beds	Standard	May	NULL	NULL	5.0
Tiny home in Greer	*BRAND NEW* Tiny ...	May 1 - 6	90.0	5.0 (86)	2 beds	Standard	May	NULL	NULL	5.0

only showing top 10 rows

Visualización de datos:

Cantidad de reservas por País en Airbnb - Standar

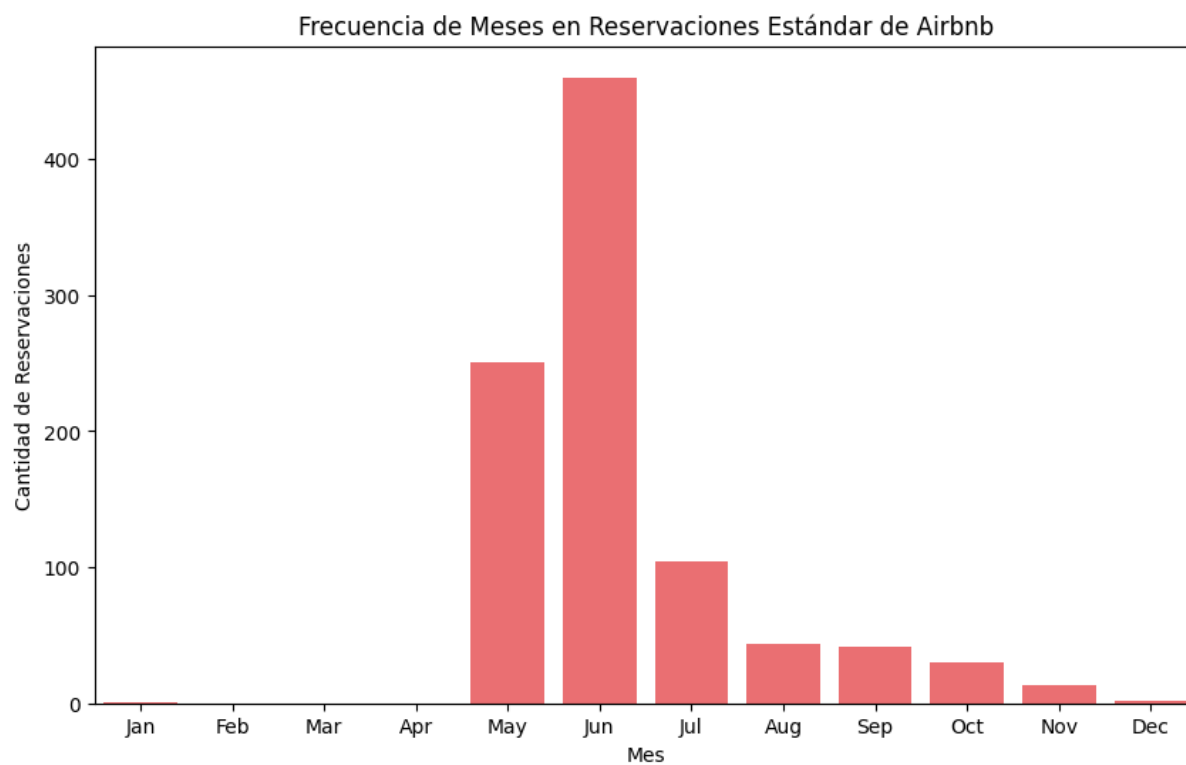
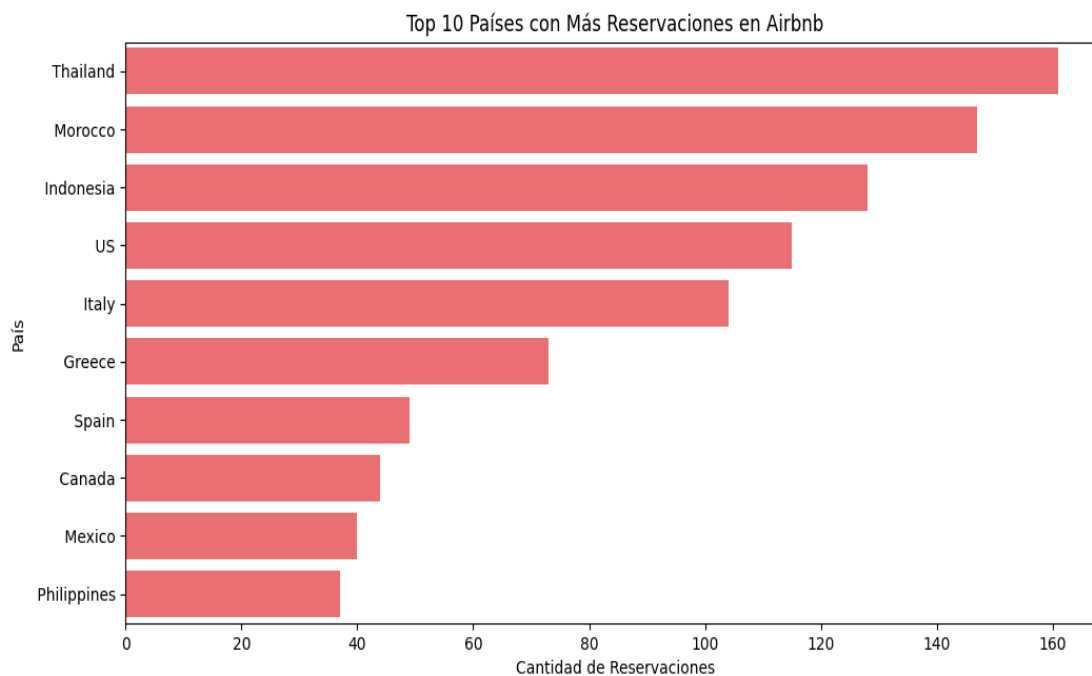


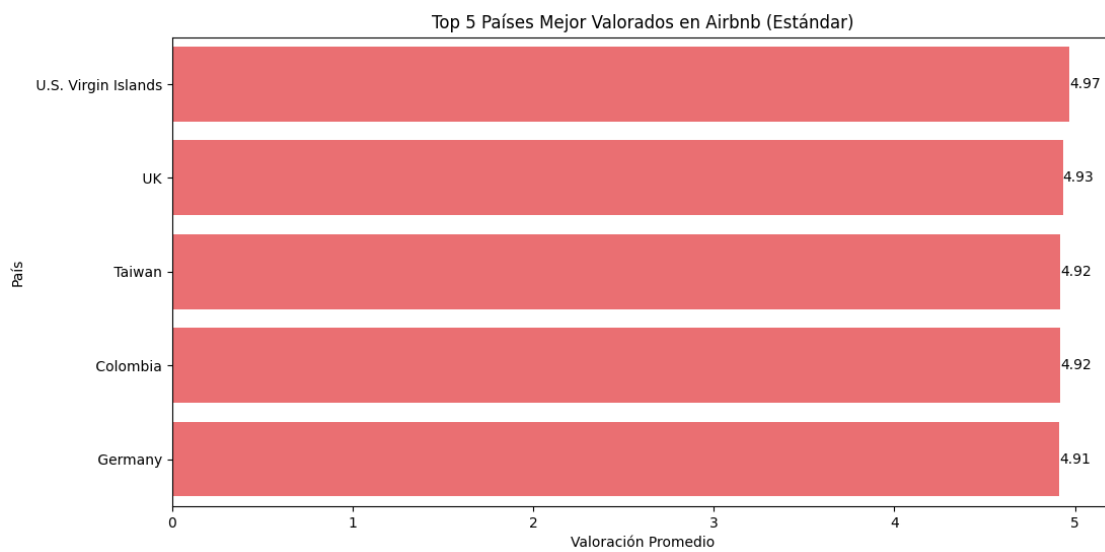
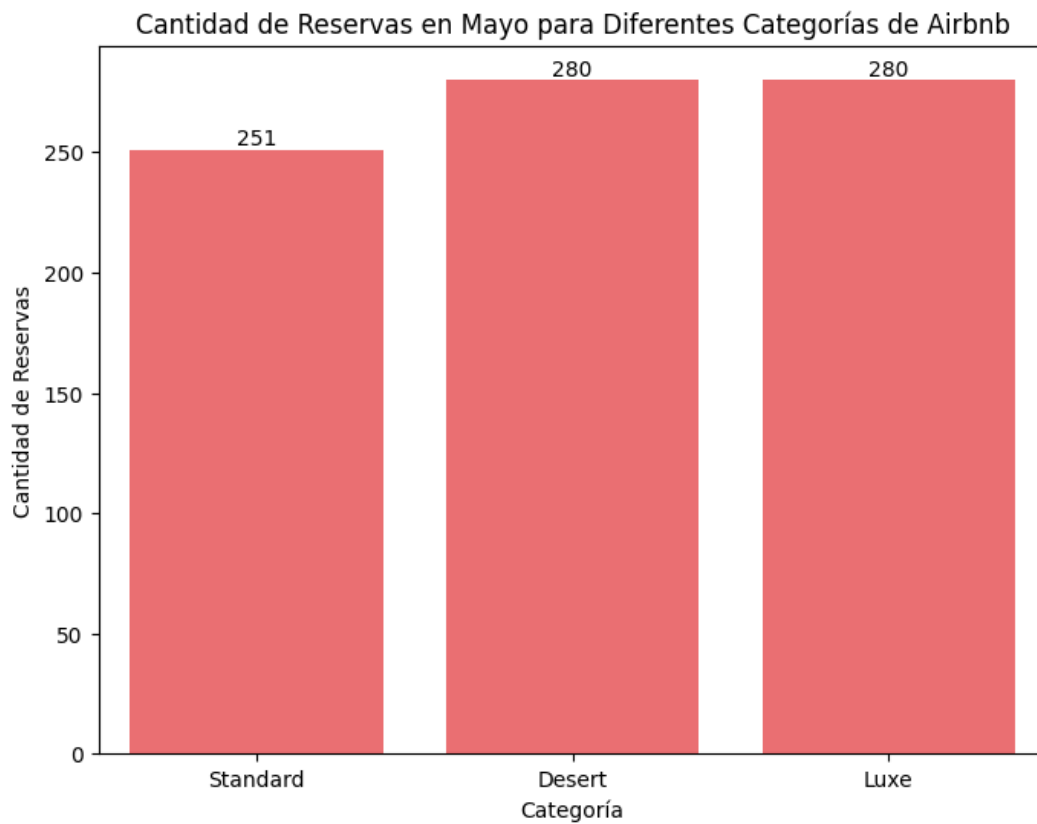
Cantidad de reservas por País en Airbnb - Desierto

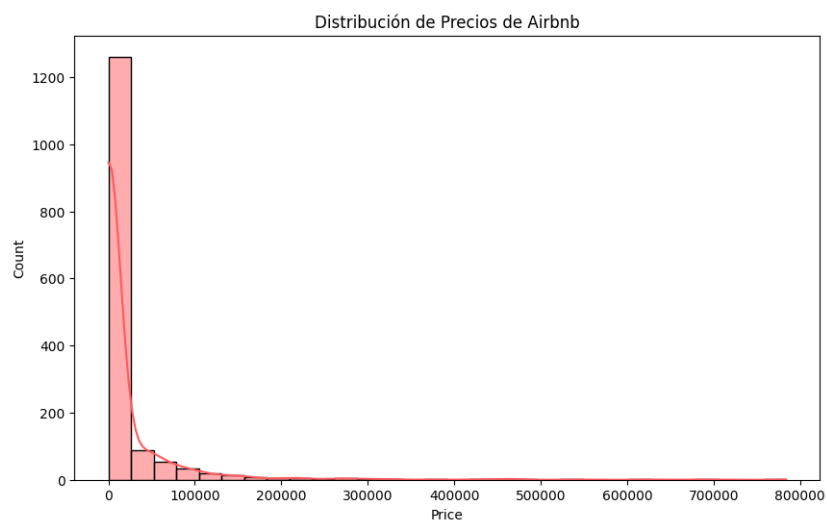
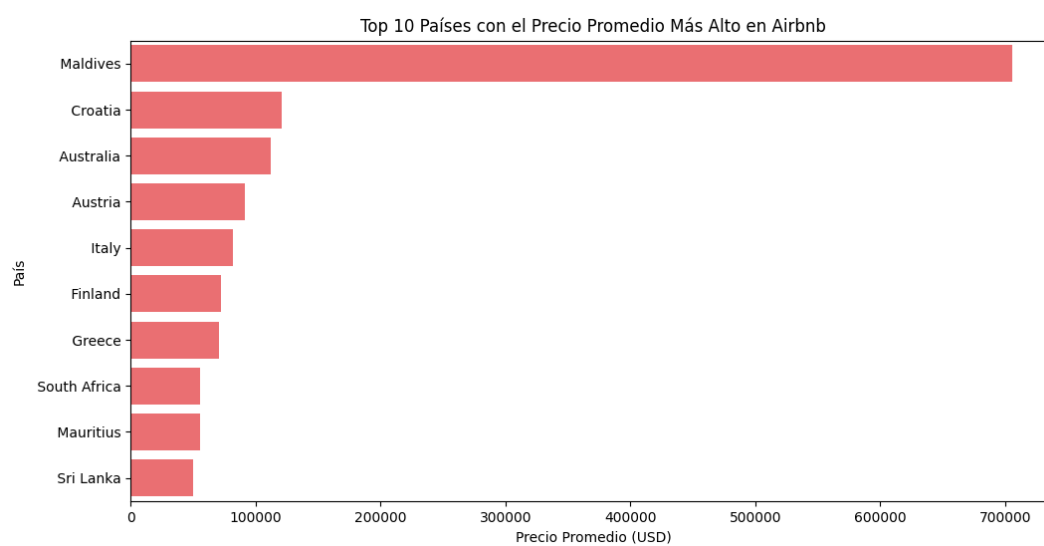
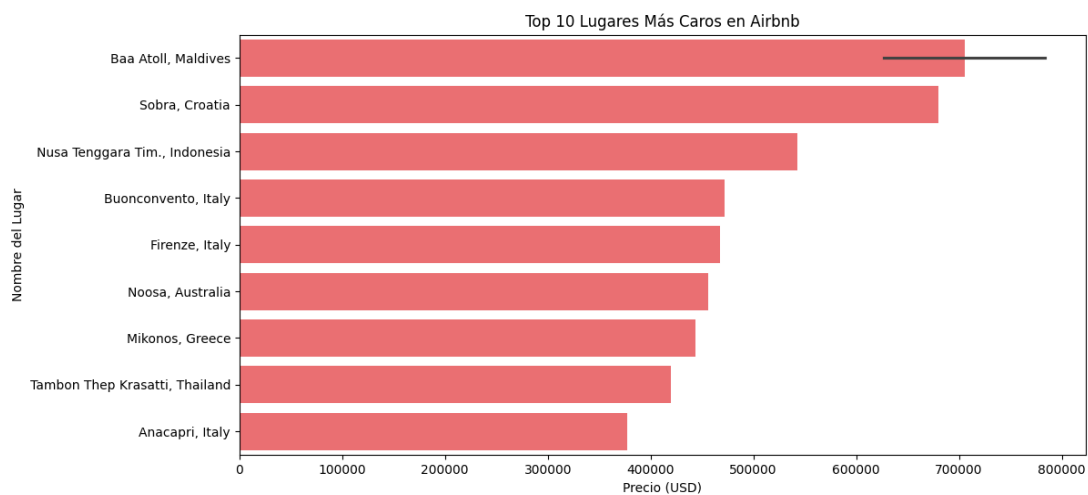


Cantidad de reservas por País en Airbnb - Luxe









3. Referencias

Joy Shil. (2023). Airbnb Listing Data 2023 [Data set]. Kaggle.
<https://doi.org/10.34740/KAGGLE/DSV/5793330>