BA - Assignment 2 – Online Retail Analytics

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Assignment Overview: This assignment focuses on analyzing the "Online_Retail.csv" dataset, involving various operations and visualizations.

Summary

- The total number of transactions for each country was computed, including canceled transactions. The analysis revealed that the United Kingdom had the highest number of transactions, totaling 495,478. A table was created, including only countries contributing more than 1% of the total transactions, which consisted of four countries.
- A new column named "TransactionValue" was added to the existing dataset "V," representing the product of 'Quantity' and 'UnitPrice.' The total transaction values for each country were calculated, and countries with transaction values exceeding 130,000 British Pounds were filtered and displayed. Notably, the United Kingdom led with a transaction value of 8,187,806.
- The 'InvoiceDate' column was converted into a POSIXct object, allowing the analysis of transactions by days of the week. The percentage of transactions on different days was calculated: Friday (15.17%), Monday (17.55%), Sunday (11.88%), Thursday (19.17%), Tuesday (18.79%), and Wednesday (17.45%).
- The customer with CustomerID "17841" was identified as having the highest number of transactions. In contrast, CustomerID "14646" was the most valuable customer, contributing the highest total transaction value of 279,489.
- A histogram representing the distribution of transaction values from Germany was plotted, providing insights into the spending patterns of German customers.
- The dataset revealed that only the "CustomerID" variable had missing values. Additionally, Bahrain had the fewest missing transactions with an absent CustomerID, while the United Kingdom had the most.
- The analysis calculated the average number of days between consecutive shopping sessions for French customers, indicating a return rate of approximately 2,840,169.96 days and a rate of 1.74%.
- The product generating the highest revenue for the retailer was identified as "DOTCOM POSTAGE." Additionally, the dataset contained 4,373 unique customers. This comprehensive analysis delved into customer behavior, transaction trends, and product performance, utilizing diverse techniques and visualizations to gain a comprehensive understanding of the retail dataset.

Problem

- 1. Show the breakdown of the number of transactions by countries i.e., how many transactions are in the dataset for each country (consider all records including cancelled transactions). Show this in total number and also in percentage. Show only countries accounting for more than 1% of the total transactions. (10% of total points)
- 2. Create a new variable 'TransactionValue' that is the product of the exising 'Quantity' and 'UnitPrice' variables. Add this variable to the dataframe. (10% of total points)
- 3. Using the newly created variable, TransactionValue, show the breakdown of transaction values by countries i.e. how much money in total has been spent each country. Show this in total sum of transaction values. Show only countries with total transaction exceeding 130,000 British Pound. (15% of total points)
- 4. This is an optional question which carries additional marks (golden questions). In this question, we are dealing with the InvoiceDate variable. The variable is read as a categorical when you read data from the file. Now we need to explicitly instruct R to interpret this as a Date variable. "POSIXIt" and "POSIXct" are two powerful object classes in R to deal with date and time. Click here for more information. First let's convert 'InvoiceDate' into a POSIXIt object:

Temp=strptime(Online_Retail\$InvoiceDate,format='%m/%d/%Y %H:%M',tz='GMT') Check the variable using, head(Temp). Now, let's separate date, day of the week and hour components dataframe with names as New.I.Date, I.Day.Week and New.I.Hour:

Online_Retail\$New.I.Date <- as.Date(Temp) The Date objects have a lot of flexible functions. For example knowing two date values, the object allows you to know the difference between the two dates in terms of the number days. Try this:

Online_Retail \$ New.I.Date [20000] - Online_Retail\$New.I.Date[10] Also we can convert dates to days of the week. Let's define a new variable for that Online_Retail \$ I.Day.Week = weekdays (Online_Retail\$New.I.Date) For the Hour, let's just take the hour (ignore the minute) and convert into a normal numerical value:

Online_Retail\$New.I.Hour = as.numeric(format(Temp, "%H")) Finally, lets define the month as a separate numeric variable too:

Online_Retail\$New.I.Month = as.numeric(format(Temp, "%m"))

Now answer the flowing questions.

- a. Show the percentage of transactions (by numbers) by days of the week (extra 1% of total points)
- b. Show the percentage of transactions (by transaction volume) by days of the week (extra 1% of total points)
- c. Show the percentage of transactions (by transaction volume) by month of the year (extra 2% of total points)
- d. What was the date with the highest number of transactions from Australia? (extra 2% of total points)
- e. The company needs to shut down the website for two consecutive hours for maintenance. What would be the hour of the day to start this so that the distribution is at minimum for the customers? The responsible IT team is available from 7:00 to 20:00 every day. (extra 4% of total points)

- 5. Plot the histogram of transaction values from Germany. Use the hist() function to plot. (5% of total points)
- 6. Which customer had the highest number of transactions? Which customer is most valuable (i.e. highest total sum of transactions)? (15% of total points)
- 7. Calculate the percentage of missing values for each variable in the dataset (5% of total points). Hint colMeans():
- 8. What are the number of transactions with missing CustomerID records by countries? (10 % of total points)
- 9. On average, how often the costumers comeback to the website for their next shopping? (i.e. what is the average number of days between consecutive shopping) (5% of total points!) Hint: 1. A close approximation is also acceptable and you may find diff() function useful.
- 10. In the retail sector, it is very important to understand the return rate of the goods purchased by customers. In this example, we can define this quantity, simply, as the ratio of the number of transactions cancelled (regardless of the transaction value) over the total number of transactions. With this definition, what is the return rate for the French customers? (10% of total points). Consider the cancelled transactions as those where the 'Quantity' variable has a negative value.
- 11. What is the product that has generated the highest revenue for the retailer? (i.e. item with the highest total sum of 'TransactionValue'). (10% of total points)
- 12. How many unique customers are represented in the dataset? You can use unique() and length() functions. (10% of total points)

Loaded datasets from the necessary libraries

```
##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
## filter, lag

## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

Installed the dataset from "Online_Retail.csv"

```
\label{lem:csv} $$V \leftarrow read.csv("/Users/gauravkudeshia/Desktop/Rhistory Business Analytics/Online_Retail.csv")$
```

1. Show the breakdown of the number of transactions by countries i.e., how many transactions are in the data set for each country (consider all records including cancelled transactions). Show this in total number and also in percentage. Show only countries accounting for more than 1% of the total transactions.

```
#Determined the number of transactions conducted by each country
T_b_C <- table(V$Country)
T_b_C</pre>
```

# Australia Austria Bahrain # 1259 401 19 # Belgium Brazil Canada # 2069 32 151 # Channel Islands Cyprus Czech Republic # 758 622 30 # Denmark EIRE European Community # 389 8196 61 # Finland France Germany # 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 4 907 493 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA					
# 1259 401 19 # Belgium Brazil Canada # 2069 32 151 # Channel Islands Cyprus Czech Republic # 758 622 30 # Denmark EIRE European Community # 389 8196 61 # Finland France Germany # 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 4 Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##				
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# 2069 32 151 # Channel Islands Cyprus Czech Republic # 758 622 30 # Denmark EIRE European Community # 389 8196 61 # Finland France Germany # 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	1259	401	19	
# Channel Islands Cyprus Czech Republic # 758 622 30 # Denmark EIRE European Community # 389 8196 61 # Finland France Germany # 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Belgium	Brazil	Canada	
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# 389 8196 61 # Finland France Germany # 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	758	622	30	
# Finland France Germany # 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Denmark	EIRE	European Community	
# 695 8557 9495 # Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	389	8196	61	
# Greece Hong Kong Iceland # 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Finland	France	Germany	
# 146 288 182 # Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	695	8557	9495	
# Israel Italy Japan # 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Greece	Hong Kong	Iceland	
# 297 803 358 # Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	146	288	182	
# Lebanon Lithuania Malta # 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Israel	Italy	Japan	
# 45 35 127 # Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	297	803	358	
# Netherlands Norway Poland # 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Lebanon	Lithuania	Malta	
# 2371 1086 341 # Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	45	35	127	
# Portugal RSA Saudi Arabia # 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Netherlands	Norway	Poland	
# 1519 58 10 # Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	2371	1086	341	
# Singapore Spain Sweden # 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Portugal	RSA	Saudi Arabia	
# 229 2533 462 # Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	1519	58	10	
# Switzerland United Arab Emirates United Kingdom # 2002 68 495478 # Unspecified USA	##	Singapore	Spain	Sweden	
# 2002 68 495478 # Unspecified USA	##	229	2533	462	
# Unspecified USA	##	Switzerland	United Arab Emirates	United Kingdom	
-	##	2002	68	495478	
# 446 291	##	Unspecified	USA		
	##	446	291		

```
#Added total number of transaction
Tot_Numberof <- sum(T_b_C)
Tot_Numberof</pre>
```

```
## [1] 541909
```

```
#calculated 1% of the total number of transactions
Alper <- (0.01*Tot_Numberof)

#"True" will be for those whose value are more then 1% of total number (A) of transactions
Grater_then_one <- T_b_C >= Alper

#Calculated the countries which are more than 1% of total number (A) of transactions
Filtered_T_b_C <- T_b_C[Grater_then_one]
Filtered_T_b_C</pre>
```

```
##
## EIRE France Germany United Kingdom
## 8196 8557 9495 495478
```

#Calculated each country percent wise out of total number of transaction
Percentage.more.than.one <- Filtered_T_b_C/Tot_Numberof*100
Percentage.more.than.one</pre>

```
##
## EIRE France Germany United Kingdom
## 1.512431 1.579047 1.752139 91.431956
```

2. Create a new variable 'TransactionValue' that is the product of the exising 'Quantity' and 'UnitPrice' variables. Add this variable to the dataframe.

Added "TransactionValue" which is the product of Quantity & Unit Price to the existing data frame

```
TransactionValue=(V$Quantity*V$UnitPrice)
V=data.frame(V,TransactionValue)
```

3. Using the newly created variable, TransactionValue, show the breakdown of transaction values by countries i.e. how much money in total has been spent each country. Show this in total sum of transaction values. Show only countries with total transaction exceeding 130,000 British Pound.

```
#Analyzed the distribution of transaction values across different countries
Transaction.Values.by.Countries=V%>%
  group_by(Country)%>%
  summarize(total.t_by_each_country = sum(TransactionValue))
Transaction.Values.by.Countries
```

```
## # A tibble: 38 × 2
##
                       total.t by each country
      Country
##
      <chr>
                                          <dbl>
##
   1 Australia
                                        137077.
##
    2 Austria
                                         10154.
                                           548.
##
    3 Bahrain
##
    4 Belgium
                                         40911.
    5 Brazil
##
                                          1144.
    6 Canada
                                          3666.
##
   7 Channel Islands
##
                                         20086.
##
   8 Cyprus
                                         12946.
## 9 Czech Republic
                                           708.
                                         18768.
## 10 Denmark
## # i 28 more rows
```

```
#Filtered countries with total transaction exceeding 130,000 British Pound
Filtered.Transaction.V.B.C= Transaction.Values.by.Countries[Transaction.Values.by.
Countries$total.t_by_each_country>130000, c("Country","total.t_by_each_country")]
Filtered.Transaction.V.B.C
```

```
## # A tibble: 6 × 2
##
     Country
               total.t_by_each_country
##
     <chr>
                                       <dbl>
## 1 Australia
                                    137077.
## 2 EIRE
                                    263277.
## 3 France
                                    197404.
## 4 Germany
                                    221698.
## 5 Netherlands
                                    284662.
## 6 United Kingdom
                                   8187806.
```

4. This is an optional question which carries additional marks (golden questions). In this question, we are dealing with the InvoiceDate variable. The variable is read as a categorical when you read data from the file. Now we need to explicitly instruct R to interpret this as a Date variable. "POSIXIt" and "POSIXct" are two powerful object classes in R to deal with date and time. Click here for more information. First let's convert 'InvoiceDate' into a POSIXIt object:

Temp=strptime(Online_Retail\$InvoiceDate,format='%m/%d/%Y %H:%M',tz='GMT') Check the variable using, head(Temp). Now, let's separate date, day of the week and hour components dataframe with names as New.I.Date, I.Day.Week and New.I.Hour:

Online_Retail\$New.I.Date <- as.Date(Temp) The Date objects have a lot of flexible functions. For example knowing two date values, the object allows you to know the difference between the two dates in terms of the number days. Try this:

Online_Retail \$ New.I.Date [20000] - Online_Retail\$New.I.Date[10] Also we can convert dates to days of the week. Let's define a new variable for that Online_Retail \$ I.Day.Week = weekdays (Online_Retail\$New.I.Date) For the Hour, let's just take the hour (ignore the minute) and convert into a

normal numerical value:

Online_Retail\$New.I.Hour = as.numeric(format(Temp, "%H")) Finally, lets define the month as a separate numeric variable too:

Online_Retail\$New.I.Month = as.numeric(format(Temp, "%m"))

```
#Directly converted 'InvoiceDate' into a POSIXct object and extract its components
V$New.I.Date <- as.POSIXct(V$InvoiceDate, format='%m/%d/%Y %H:%M', tz='GMT')
V$I.Day.Week <- weekdays(V$New.I.Date)
V$New.I.Hour <- as.numeric(format(V$New.I.Date, "%H"))
V$New.I.Month <- as.numeric(format(V$New.I.Date, "%m"))</pre>
```

a) Show the percentage of transactions (by numbers) by days of the week

```
day.week.counts <- table(V$I.Day.Week)
day.week.P <- (day.week.counts / nrow(V)) * 100
day.week.P</pre>
```

```
##
## Friday Monday Sunday Thursday Tuesday Wednesday
## 15.16731 17.55110 11.87930 19.16503 18.78692 17.45035
```

b) Show the percentage of transactions (by transaction volume) by days of the week

```
day_of_week_transaction_values <- tapply(V$TransactionValue, V$I.Day.Week, sum)
day_of_week_transaction_percentages <- (day_of_week_transaction_values / sum(V$Tra
nsactionValue)) * 100
day_of_week_transaction_percentages</pre>
```

```
## Friday Monday Sunday Thursday Tuesday Wednesday
## 15.804787 16.297194 8.265282 21.671867 20.170636 17.790232
```

c) Show the percentage of transactions (by transaction volume) by month of the year

```
month_transaction_values <- tapply(V$TransactionValue, V$New.I.Month, sum)
month_transaction_percentages <- (month_transaction_values / sum(V$TransactionValu
e)) * 100
month_transaction_percentages</pre>
```

```
## 1 2 3 4 5 6 7 8

## 5.744919 5.109515 7.009487 5.059703 7.420519 7.090080 6.989308 7.003469

## 9 10 11 12

## 10.460751 10.984123 14.995836 12.132290
```

d) What was the date with the highest number of transactions from Australia?

```
australia_dates <- V$New.I.Date[V$Country == "Australia"]
highest_transactions_date <- as.Date(names(sort(table(australia_dates), decreasing
= TRUE)[1]))
print(paste("date with the highest number of transactions from Australia:",highest
_transactions_date))</pre>
```

```
## [1] "date with the highest number of transactions from Australia: 2011-06-15"
```

e) The company needs to shut down the website for two consecutive hours for maintenance. What would be the hour of the day to start this so that the distribution is at minimum for the customers? The responsible IT team is available from 7:00 to 20:00 every day.

```
hourly_transaction_counts <- table(V$New.I.Hour)
optimal_maintenance_hour <- names(which.min(hourly_transaction_counts))
print(paste("Hour of the day to start:",optimal_maintenance_hour))</pre>
```

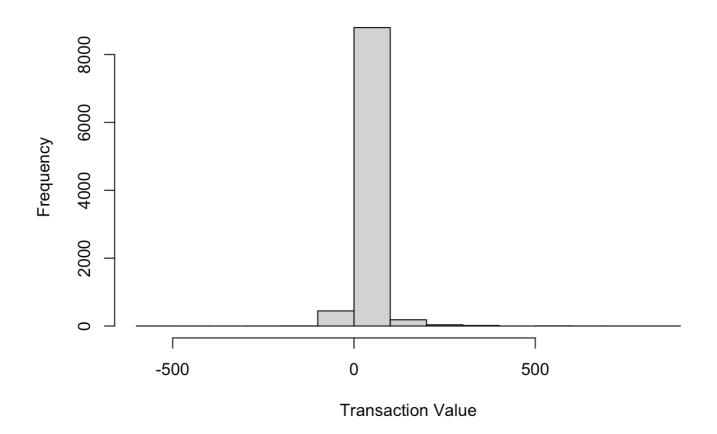
```
## [1] "Hour of the day to start: 6"
```

5. Plot the histogram of transaction values from Germany. Use the hist() function to plot.

Loaded required libraries

```
library(ggplot2)
```

Histogram of Transaction Values from Germany



6. Which customer had the highest number of transactions? Which customer is most valuable (i.e. highest total sum of transactions)?

Identified the customer with the highest number of transactions

```
highest.trans.no <- names(sort(table(V$CustomerID), decreasing = TRUE)[1])
print(paste("Customer with highest number of transactions:", highest.trans.no))</pre>
```

```
## [1] "Customer with highest number of transactions: 17841"
```

Identified the customer who is most valued

```
#Computed the overall transaction value for each customer
Cust.Tran.V <- aggregate(TransactionValue ~ CustomerID, data = V, sum)
#Identified the customer with the highest total transaction amount
most.valuable.cust <- Cust.Tran.V[which.max(Cust.Tran.V$TransactionValue), ]
#Displayed the outcome
most.valuable.cust</pre>
```

```
## CustomerID TransactionValue
## 1704 14646 279489
```

7. Calculate the percentage of missing values for each variable in the dataset (5% of total points). Hint colMeans():

```
#Computed the proportion of missing values for each variable as a percentage
Per_M <- colMeans(is.na(V))*100

#Displayed the percentage of missing values for each variable
Per_M</pre>
```

##	InvoiceNo	StockCode	Description	Quantity
##	0.00000	0.00000	0.0000	0.00000
##	InvoiceDate	UnitPrice	CustomerID	Country
##	0.00000	0.00000	24.92669	0.00000
##	TransactionValue	New.I.Date	<pre>I.Day.Week</pre>	New.I.Hour
##	0.0000	0.00000	0.0000	0.00000
##	New.I.Month			
##	0.0000			

8. What are the number of transactions with missing CustomerID records by countries? (10 % of total points)

```
#Filtered the dataframe to include only rows where the 'CustomerID' value is missi
ng
Numb.Trans.miss = V[is.na(V$CustomerID),]

#Tallied the count of missing CustomerID transactions based on countries.
Miss.Cust.Trans = table(Numb.Trans.miss$Country)

#Displayed the outcomes
Miss.Cust.Trans
```

```
##
##
          Bahrain
                              EIRE
                                             France
                                                          Hong Kong
                                                                              Israel
##
                 2
                                711
                                                 66
                                                                 288
                                                                                  47
##
         Portugal
                       Switzerland United Kingdom
                                                        Unspecified
##
                                125
                                             133600
                                                                 202
                39
```

9. On average, how often the costumers comeback to the website for their next shopping? (i.e. what is the average number of days between consecutive shopping) (5% of total points!) Hint: 1. A close approximation is also acceptable and you may find diff() function useful.

```
# Converted InvoiceDate to POSIX1t object for date calculations
V$InvoiceDate <- as.POSIX1t(V$InvoiceDate, format="%m/%d/%Y %H:%M", tz="GMT")

# Sorted the dataframe by CustomerID and InvoiceDate
sorted.D <- V[order(V$CustomerID,V$InvoiceDate),]

# Calculated the time difference between consecutive transactions for each custome
r
diff.Time <- unlist(tapply(sorted.D$InvoiceDate, sorted.D$CustomerID, function(x)
c(0, diff(x))))

# Filtered out 0 time differences (transactions on the same day)
diff.Time <- diff.Time[diff.Time != 0]

# Calculated the average number of days between consecutive shopping sessions
average.days <- mean(diff.Time, na.rm = TRUE)

# Printed the result
print(paste("Average number of days between consecutive shopping:", round(average.days, 2)))</pre>
```

```
## [1] "Average number of days between consecutive shopping: 2840169.96"
```

10. In the retail sector, it is very important to understand the return rate of the goods purchased by customers. In this example, we can define this quantity, simply, as the ratio of the number of transactions cancelled (regardless of the transaction value) over the total number of transactions. With this definition, what is the return rate for the French customers? (10% of total points). Consider the cancelled transactions as those where the 'Quantity' variable has a negative value.

```
# Filtered the data to only include transactions from French customers
french.cust <- V[V$Country == "France",]

# Counted the number of cancelled transactions
cancelled.t <- french.cust[french.cust$Quantity < 0, ] %>%
nrow()

# Counted the total number of transactions
total.t <- french.cust %>% nrow()

# Calculated the return rate
r.rate <- (cancelled.t/total.t*100)

# Printed the result
print(paste("Return Rate:",r.rate))</pre>
```

```
## [1] "Return Rate: 1.7412644618441"
```

11. What is the product that has generated the highest revenue for the retailer? (i.e. item with the highest total sum of 'TransactionValue')

```
# Calculated total transaction values for each product
each.product.trans.values <- tapply(V$TransactionValue, V$Description, sum)

# Found the product with the highest total sum of 'TransactionValue'
which.product.high.revenue <- names(each.product.trans.values[which.max(each.product.trans.values)])

print(paste("product that has generated the highest revenue for the retailer:",which.product.high.revenue))</pre>
```

 $\ensuremath{\mbox{\#\#}}$ [1] "product that has generated the highest revenue for the retailer: DOTCOM PO STAGE"

12. How many unique customers are represented in the dataset? You can use unique() and length() functions. (10% of total points)

```
# Counted the unique customers in the dataset
uni.customers <- length(unique(V$CustomerID))
print(paste("Unique Customers:",uni.customers))</pre>
```

```
## [1] "Unique Customers: 4373"
```