# Diwali Sales Dataset

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# Introduction

Hi, my name is Dhanachote. I'm working on a mini-project to analyze and practice the R language, build my data visualization skills, and create a report using Rmarkdown. For this project, I'm using the 'Diwali Sales' dataset sourced from Kaggle, which you can find at the link below. Therefore, I cleaned the dataset in Excel before importing it into R programming.

### Reference

# Kaggle

Diwali Sales Dataset Source from Kaggle

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### Part I Questions and Data Visualization

In this part, I asking a serveral questions to understanding in the dataset. I use library such as tidyverse ,readr, dplyr, ggplot2, and caret before query the dataset.

# Install packages and download library

```
## Library
library(readr)
library(dplyr)
library(tidyverse)
library(ggplot2)
library(caret)
```

```
## import read.csv()
diwali_sales <- tibble(read.csv("Diwali_Sales_Data_main.csv"))</pre>
```

# Import dataset from .csv

```
## check NA

diwali_sales %>%
   complete.cases()%>%
   mean()
```

# Check NA

### ## [1] 0

I use complete.cases() to check for missing values and then use mean() to calculate the logical mean (TRUE = 1, FALSE = 0). If the mean value is 0, it means that the dataset is complete and has no missing values.

**Tip**: You can check logical values by using the as.logical() function. For example, as.logical(0) evaluates to FALSE, while 1 evaluates to TRUE.

### Prepare the dataset

## 4 Footwear & Shoes

## 5 Furniture

### Question 1: What is the most popular product category during Diwali sales?

38731504.

13660130.

```
q1 <- diwali_sales %>%
  group_by(Product_Category) %>%
  summarise(Total_amount = sum(Orders * Amount)) %>%
  arrange(desc(Total_amount)) %>%
  head(5)
print(q1)
## # A tibble: 5 x 2
##
     Product_Category
                           Total_amount
##
     <chr>
                                   <dbl>
                               83591272.
## 1 Food
## 2 Clothing & Apparel
                               41164094
## 3 Electronics & Gadgets
                               39315276
```

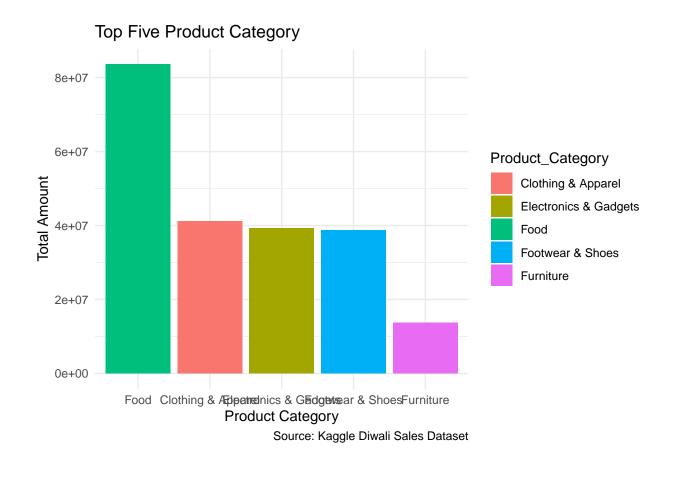
```
message("The most product category total amount is: ",
    head(q1$Product_Category,1),
    " ",
    "and",
    " ",
    "The total amount is: $ ",
    head(q1$Total_amount,1))
```

## The most product category total amount is: Food and The total amount is: \$83591271.5

```
ds_cl %>%
  group_by(Product_Category) %>%
  summarise(
    total_amount = sum(Amount * Orders)
) %>%
  top_n(5) %>%
  arrange(desc(total_amount)) %>%
  ggplot(aes(reorder(Product_Category, -total_amount), total_amount, fill = Product_Category)) +
  geom_col() +
  theme_minimal() +
  labs(
    title = "Top Five Product Category",
    x = "Product Category",
    y = "Total Amount",
    caption = "Source: Kaggle Diwali Sales Dataset"
)
```

# Plot 1:

## Selecting by total\_amount



# Question 2: Which customer has the highest total purchase amount?

683635

```
## Question2 : Who is the most spending amount
q2 <- diwali_sales %>%
  group_by(Cust_name) %>%
  summarise(
    Total_amount = sum(Orders * Amount)
  ) %>%
  arrange(desc(Total_amount)) %>%
  head(5)
print(q2)
## # A tibble: 5 x 2
##
     Cust_name Total_amount
     <chr>>
                      <dbl>
## 1 Vishakha
                     972730
## 2 Alejandro
                     718053
## 3 Vasudev
                     698923
## 4 Sudevi
                     686455
## 5 Lalita
```

```
message(head(q2$Cust_name,1),
    " ",
    "is the most spending amount in $ ",
    head(q2$Total_amount,1),
    " product category")
```

## Vishakha is the most spending amount in \$ 972730 product category

```
ds_cl %>%
  group_by(Cust_name) %>%
  summarise(
    total_amount = sum(Amount * Orders)
) %>%
  top_n(5) %>%
  ggplot(aes(reorder(Cust_name, -total_amount), total_amount, fill = Cust_name)) +
  geom_col() +
  theme_minimal() +
  labs(
    title = "Top Five Customers",
    x = "Customer Name",
    y = "Total Amount",
    caption = "Source: Kaggle Diwali Sales Dataset"
)
```

### Plot 2

## Selecting by total\_amount



# Question 3: Which state has the highest total customer purchase amount?

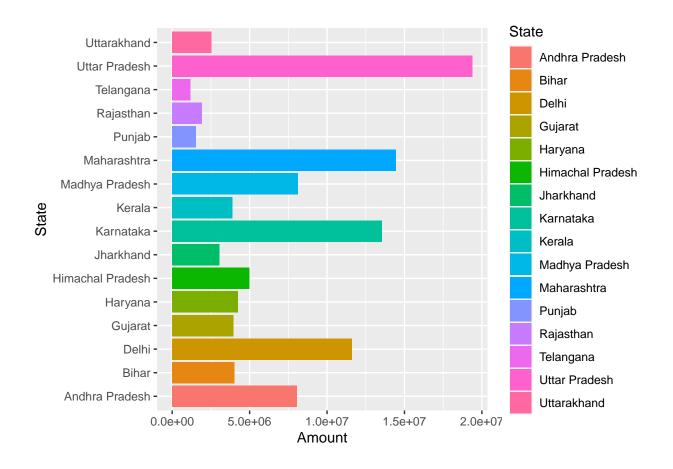
```
## # A tibble: 10 x 7
      Cust_name Gender State
##
                                          Zone
                                                   Orders Amount Total_amount
##
      <chr>
                <chr> <chr>
                                          <chr>>
                                                           <dbl>
                                                                         <dbl>
    1 Balk
                F
                        Uttar Pradesh
                                                        4 23841
                                                                        95364
##
                                          Central
    2 Ginny
                F
                        Andhra Pradesh
                                         Southern
                                                        4 23800.
                                                                        95200.
```

```
4 23718
## 3 Vasudev
              М
                     Andhra Pradesh
                                     Southern
                                                                94872
                     Andhra Pradesh
## 4 Ellis
              F
                                     Southern
                                                  4 23546
                                                                94184
              F
## 5 Mahima
                     Andhra Pradesh Southern
                                                  4 23451
                                                                93804
## 6 Daniels F
                     Andhra Pradesh Southern
                                                  4 23302
                                                                93208
## 7 Mike
              Μ
                     Himachal Pradesh Northern
                                                  4 23267
                                                                93068
## 8 Dean
              F
                     Andhra Pradesh Southern
                                                  4 23252
                                                                93008
## 9 Zypern
              M
                     Andhra Pradesh Southern
                                                  4 23239
                                                                92956
                     Andhra Pradesh Southern
## 10 Abhijit F
                                                  4 23066
                                                                92264
message("Which state is the most user spending is: ",
       head(q3$State,1))
```

## Which state is the most user spending is: Uttar Pradesh

# Question 4 : State / Zone

In this question, I provided a chart that explains which state has the highest total amount before starting the questions.

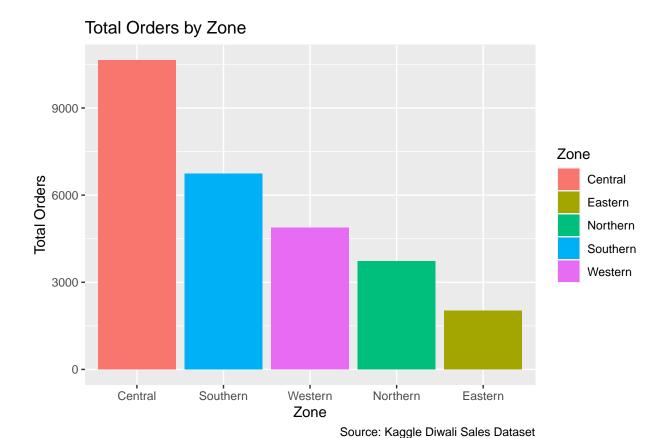


```
# count zone
diwali_sales %>%
  count(Zone)
```

Question 4.1: Count the number of orders for each zone and calculate the average order size for each zone.

```
## # A tibble: 5 x 2
     Zone
##
                  n
##
     <chr>>
              <int>
               4296
## 1 Central
## 2 Eastern
                814
## 3 Northern 1491
## 4 Southern
               2695
## 5 Western
               1955
avg_orders <- mean(diwali_sales$Orders)</pre>
  ## total and percentage avg orders
diwali_sales %>%
  select(Zone,
```

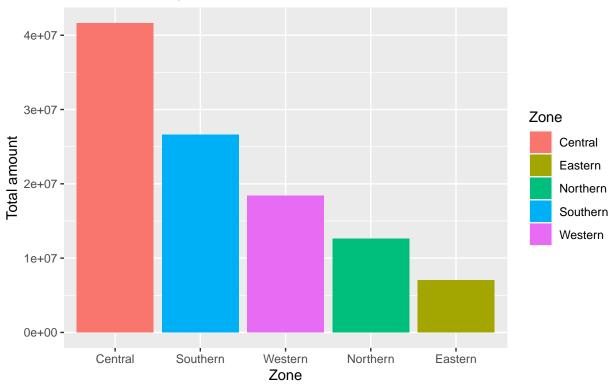
```
Product_Category,
         Orders,
         Amount) %>%
  filter(Orders >= avg_orders) %>%
  group_by(Zone) %>%
  summarise(total_avg_orders = n()) %>%
  mutate(pct_avg_orders = c(total_avg_orders / sum(total_avg_orders)) * 100) %>%
  arrange(desc(total_avg_orders))
## # A tibble: 5 x 3
    Zone
           total_avg_orders pct_avg_orders
##
     <chr>>
                        <int>
                                        <dbl>
## 1 Central
                          2087
                                        37.7
## 2 Southern
                                        24.3
                          1347
## 3 Western
                           989
                                        17.8
## 4 Northern
                           722
                                        13.0
## 5 Eastern
                                        7.18
                           398
  # total orders
 diwali_sales %>%
   select(Zone,
           Product_Category,
           Orders) %>%
    group_by(Zone) %>%
    summarise(total_orders = sum(Orders))
Question 4.2: Calculate the total number of orders across all zones.
## # A tibble: 5 x 2
##
    Zone
           total_orders
##
    <chr>>
## 1 Central
                     10640
## 2 Eastern
                      2015
## 3 Northern
                      3727
## 4 Southern
                      6744
## 5 Western
                      4881
## Plot 4.2: Calculate the total number of orders across all zones.
ds_cl %>%
  group_by(Zone) %>%
  summarise(total_orders = sum(Orders)) %>%
  arrange(desc(total_orders)) %>%
  ggplot(mapping = aes(x = reorder(Zone, -total_orders), y = total_orders, fill = Zone)) +
  geom_col() +
 labs(
   title = "Total Orders by Zone",
   x = "Zone",
   y = "Total Orders",
    caption = "Source: Kaggle Diwali Sales Dataset"
```



Question 4.3: For each zone, identify the product category with the highest number of orders.

The summary of this question involves visualizing the highest amount of orders by zone.

# Total amount by Zone



Source: Kaggle Diwali Sales Dataset

# Central

# Western

```
## Western
diwali_sales %>%
```

```
select(Zone,
           Product_Category,
           Orders,
           Amount) %>%
    group_by(Product_Category) %>%
   filter(Zone == "Western") %>%
    summarize(Total_order = sum(Orders)) %>%
   arrange(desc(Total order)) %>%
   head(2)
## # A tibble: 2 x 2
   Product_Category
                       Total_order
##
   <chr>
                              <int>
## 1 Food
                               1435
## 2 Clothing & Apparel
                               1118
```

### Southern

### Eastern

### Northern

```
## Northern
  diwali_sales %>%
    select(Zone,
           Product_Category,
           Orders,
           Amount) %>%
   group_by(Product_Category) %>%
   filter(Zone == "Northern") %>%
    summarize(Total_order = sum(Orders)) %>%
   arrange(desc(Total_order)) %>%
   head(2)
## # A tibble: 2 x 2
    Product_Category
                           Total_order
##
     <chr>
                                 <int>
## 1 Electronics & Gadgets
                                  1316
## 2 Clothing & Apparel
                                  1103
```

Question 4.4: Identify the product category with the highest total sales amount each zone.

```
## # A tibble: 10 x 2
##
                            Total_Amount
     Product_Category
##
      <chr>>
                                   <dbl>
## 1 Food
                               13685560.
## 2 Footwear & Shoes
                                8468991.
## 3 Clothing & Apparel
                                5744202
## 4 Electronics & Gadgets
                                3907342
## 5 Furniture
                                2067178
## 6 Beauty
                                1420386
```

```
## 7 Games & Toys
                                1382910
## 8 Stationery
                                1266360.
## 9 Sports Products
                               1023434
## 10 Decor
                                532002
  # which product category is the most spent in Western?
diwali_sales %>%
  select(Zone, Product_Category, Amount) %>%
  group_by(Product_Category) %>%
  filter(Zone == "Western") %>%
  summarize(Total_Amount = sum(Amount)) %>%
  arrange(desc(Total Amount)) %>%
  head(10)
## # A tibble: 10 x 2
##
      Product_Category
                            Total_Amount
##
      <chr>
                                   <dbl>
## 1 Food
                                 7764072
## 2 Clothing & Apparel
                                 2698534
## 3 Electronics & Gadgets
                                 2230270
## 4 Sports Products
                                 1041627
## 5 Games & Toys
                                  979280
## 6 Furniture
                                 966517
## 7 Footwear & Shoes
                                 929332
## 8 Household items
                                 377449
## 9 Tupperware
                                  362751
## 10 Stationery
                                  246502
 # which product category is the most spent in Southern?
diwali sales %>%
  select(Zone, Product Category, Amount) %>%
  group_by(Product_Category) %>%
  filter(Zone == "Southern") %>%
  summarize(Total_Amount = sum(Amount)) %>%
  arrange(desc(Total_Amount)) %>%
  head(10)
## # A tibble: 10 x 2
##
      Product_Category
                            Total_Amount
##
      <chr>
                                   <dbl>
## 1 Food
                                7326461
## 2 Footwear & Shoes
                                5436504
## 3 Electronics & Gadgets
                                3882459
## 4 Clothing & Apparel
                                3649326
## 5 Furniture
                                1295949.
## 6 Auto
                                1237453.
## 7 Games & Toys
                               1001066
## 8 Sports Products
                                845462
## 9 Household items
                                526144
## 10 Books
                                478963
```

```
# which product category is the most spent in Eastern?
diwali sales %>%
  select(Zone, Product_Category, Amount) %>%
  group_by(Product_Category) %>%
  filter(Zone == "Eastern") %>%
  summarize(Total_Amount = sum(Amount)) %>%
  arrange(desc(Total_Amount)) %>%
  head(10)
## # A tibble: 10 x 2
##
      Product_Category
                            Total_Amount
##
      <chr>
                                   <dbl>
## 1 Food
                                 2209777
## 2 Clothing & Apparel
                                 1772370
## 3 Electronics & Gadgets
                                 1632873
## 4 Footwear & Shoes
                                  315519
## 5 Games & Toys
                                  303982
## 6 Furniture
                                  302380
## 7 Sports Products
                                  236266
## 8 Auto
                                   79632
## 9 Tupperware
                                   54008
## 10 Household items
                                   48448
  # which product category is the most spent in Northern?
diwali_sales %>%
  select(Zone, Product_Category, Amount) %>%
  group_by(Product_Category) %>%
  filter(Zone == "Northern") %>%
  summarize(Total_Amount = sum(Amount)) %>%
  arrange(desc(Total_Amount)) %>%
  head(10)
## # A tibble: 10 x 2
##
      Product_Category
                            Total_Amount
##
                                   <dbl>
      <chr>
## 1 Electronics & Gadgets
                                 3990902
## 2 Food
                                 2948013
## 3 Clothing & Apparel
                                 2630587
## 4 Furniture
                                  808028
## 5 Games & Toys
                                  664456
## 6 Sports Products
                                  489144
## 7 Footwear & Shoes
                                  424863
## 8 Books
                                  140896
## 9 Tupperware
                                   98820
## 10 Household items
                                   94974
```

# Question 5: Generation

Since the dataset does not have a Generation column, I need to create one.

```
## create generation table
diwali sales gen <- diwali sales %>%
                 select(User ID,
                         Cust_name,
                         Product_ID,
                         Gender,
                         Age.Group,
                         Age,
                         Marital_Status,
                        Marital_Status,
                         State,
                        Zone,
                         Occupation,
                         Product_Category,
                         Orders,
                         Amount) %>%
                 mutate(Generation = ifelse(Age < 26, "Gen Z",</pre>
                                       ifelse(Age < 42, "Millennials",</pre>
                                       ifelse(Age < 58, "Gen X",
                                       ifelse(Age < 68, "Baby Boomer", "Silent Generation")))))</pre>
```

Question 5.1: Which customer has spent the most money? To which generation do they belong?

```
## # A tibble: 10 x 9
##
    User ID Cust name Gender
                           Age Orders Amount Occupation
                                                        Generation
##
      <chr>>
                                   4 23841 Lawyer
## 1 1001132 Balk
                    F
                          25
                                                        Gen Z
                   F
                            26
                                   4 23800. Media
                                                        Millennials
## 2 1003650 Ginny
## 3 1001680 Vasudev M
                            26
                                   4 23718 Automobile
                                                        Millennials
                          19
25
55
72
                   F
## 4 1000113 Ellis
                                   4 23546 Govt
                                                        Gen Z
## 5 1004736 Mahima F
                                   4 23451 Banking
                                                        Gen Z
## 6 1004505 Daniels F
                                   4 23302 Healthcare
                                                        Gen X
                                                        Silent Generati~
## 7 1002520 Mike
                   M
                                   4 23267 Media
```

```
## 8 1003111 Dean F 25 4 23252 Banking Gen Z
## 9 1001182 Zypern M 16 4 23239 Food Processing Gen Z
## 10 1001726 Abhijit F 32 4 23066 Retail Millennials
## # i 1 more variable: total_amount <dbl>
```

```
## Avg amount gen z

diwali_sales_gen %>%
  group_by(Generation) %>%
  filter(Generation == "Gen Z") %>%
  summarize(
   total_amount = sum(Amount),
   avg_amount = mean(Amount),
   percentage_amount = (sum(Amount) / sum(diwali_sales_gen$Amount)) * 100
)
```

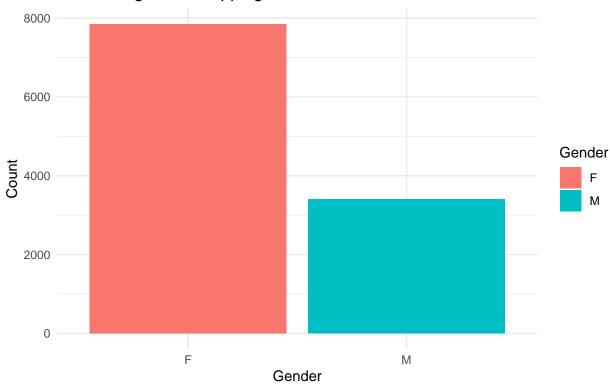
### Question 5.2: Calculate the average order amount for Generation Z customers.

```
## How many Male and Female in Gender?
diwali_sales %>%
  count(Gender)
```

# Question 5.3: Determine the number of male and female customers

```
## # A tibble: 2 x 2
##
    Gender
               n
     <chr> <int>
            7842
## 1 F
## 2 M
             3409
## Plot 3: Which gender are the most come to shopping at store
ggplot(data = ds_cl,
       mapping = aes(x = Gender, fill = Gender)) +
 geom_bar() +
 theme_minimal() +
 labs(
   title = "The most gender shopping at store",
   x = "Gender",
   y = "Count",
    caption = "Source: Kaggle Diwali Sales Dataset"
```





Source: Kaggle Diwali Sales Dataset

```
## How many Generation in Customer?

diwali_sales_gen %>%
   count(Generation)
```

# Question 5.4: Identify the number of customers belonging to each generation.

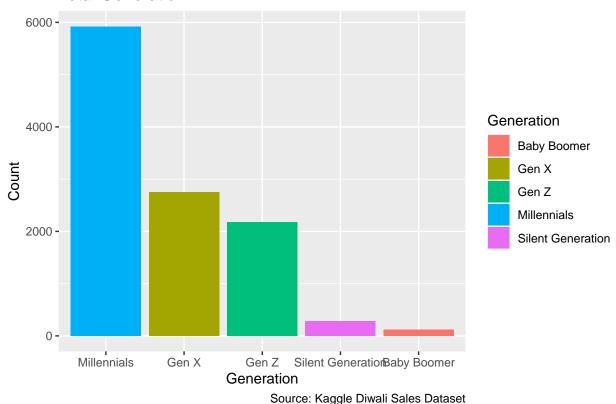
```
## # A tibble: 5 x 2
     Generation
##
                            n
##
     <chr>>
                        <int>
## 1 Baby Boomer
                          123
## 2 Gen X
                         2754
## 3 Gen Z
                         2175
## 4 Millennials
                         5916
## 5 Silent Generation
```

```
## Plot 5: Total Generation

diwali_sales_gen%>%
   group_by(Generation) %>%
   count() %>%
   ggplot(mapping = aes(x = reorder(Generation, -n), y = n, fill = Generation))+
   geom_col() +
```

```
labs(
  title = "Total Generation",
  x = "Generation",
  y = "Count",
  caption = "Source: Kaggle Diwali Sales Dataset"
)
```

# **Total Generation**



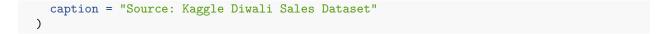
### ----

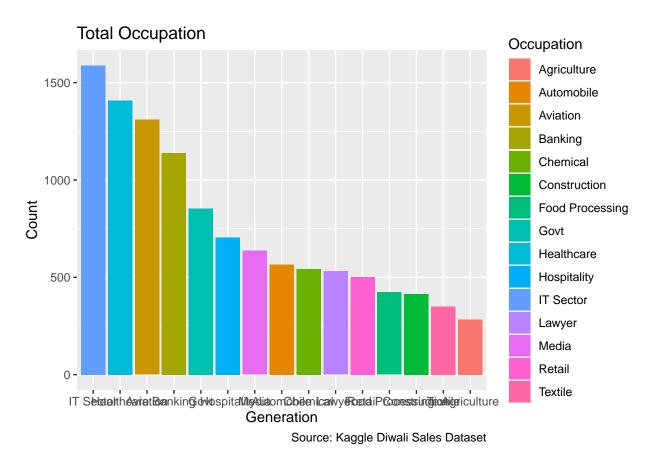
# Occupationa

Before moving on to the next question, I provided the total occupation count from the dataset.

```
## Plot 6: Total Occupation

diwali_sales_gen %>%
    group_by(Occupation) %>%
    count() %>%
    ggplot(mapping = aes(x = reorder(Occupation, -n), y = n, fill = Occupation))+
    geom_col() +
    labs(
        title = "Total Occupation",
        x = "Generation",
        y = "Count",
```





Question 6: Identify the percentage amount for each occupation.

<chr>

1 IT Sector

2 Healthcare

##

##

##

<dbl>

13.9

12.3

<int>

1588

1408

```
## 3 Aviation
                                  1310
                                            11.9
## 4 Banking
                                  1139
                                            10.1
                                             8.02
## 5 Govt
                                   854
## 6 Hospitality
                                   705
                                             6.00
## 7 Media
                                   637
                                             5.93
## 8 Automobile
                                   566
                                             5.05
## 9 Chemical
                                   542
                                             4.99
## 10 Lawyer
                                   531
                                             4.69
## 11 Retail
                                   501
                                             4.50
## 12 Food Processing
                                   423
                                             3.83
## 13 Construction
                                   414
                                             3.39
## 14 Textile
                                             3.02
                                   350
## 15 Agriculture
                                   283
                                             2.44
```

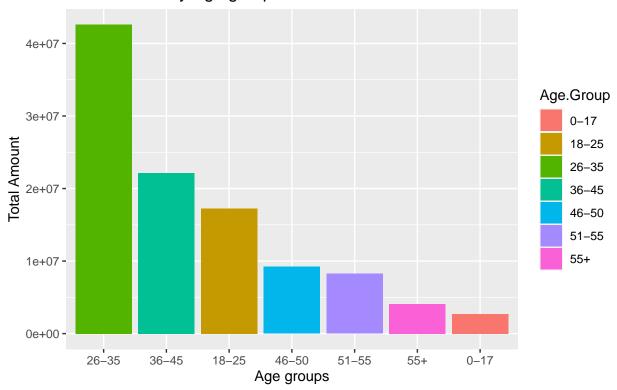
Age Group

### Question 7: What is the total amount for each age group?

```
## Question 7: What is the total amount for each age group?
diwali sales %>%
  select(Age.Group,
         Product_Category,
         Amount,
         Orders) %>%
  group_by(Age.Group) %>%
  summarise(total_amount = sum(Amount),
            pct_amount = (sum(Amount) / sum(diwali_sales_gen$Amount)) * 100) %>%
  arrange(desc(total_amount))
## # A tibble: 7 x 3
##
     Age.Group total_amount pct_amount
##
     <chr>
                      <dbl>
                                 <dbl>
## 1 26-35
                                 40.1
                  42613444.
## 2 36-45
                  22144995.
                                 20.8
## 3 18-25
                  17240732
                                 16.2
## 4 46-50
                   9207844
                                  8.67
## 5 51-55
                   8261477
                                  7.78
## 6 55+
                   4080987
                                  3.84
## 7 0-17
                   2699653
                                  2.54
## Plot 7: What is the total amount for each age group?
diwali_sales %>%
  group_by(Age.Group) %>%
  summarise(total_amount = sum(Amount)) %>%
  arrange(desc(total_amount)) %>%
  ggplot(mapping = aes( x= reorder(Age.Group, -total_amount), y = total_amount, fill = Age.Group)) +
  geom_col() +
```

```
labs(
  title = "Total amount by Age group",
  x = "Age groups",
  y = "Total Amount",
  caption = "Source: Kaggle Diwali Sales Datasets"
)
```

# Total amount by Age group



Source: Kaggle Diwali Sales Datasets

# **Summary**

In summary, the most prominent product category in the Diwali Sales dataset is food. The dataset shows that in the state of Uttar Pradesh, there are a lot of customers buying during Diwali. In terms of zones, the Central zone has the highest total amount. Lastly, the most common customer age range is 26-35, representing Generation Z. By the way, I've noticed that females spend more than males in this dataset.

# Part II: Machine Learning

# What is Machine Learing

Machine learning is a type of artificial intelligence (AI) focused on building computer systems that learn from data.

**Before delving into machine learning.** I am using machine learning to predict the amount of sales during Diwali. In this section, I have broken down the topic to make it understandable for everyone, demonstrating how I code by following these steps:

- Install package
- Import dataset
- Prepare data
- Split data
- Train & Test data
- Scoring
- Evaluate model

```
## install.packages
install.packages("readr")
install.packages("dplyr")
install.packages("tidyverse")
install.packages("ggplot2")
## Library
library(readr)
library(dplyr)
library(tidyverse)
library(ggplot2)
library(caret)
## import read.csv()
diwali_sales <- tibble(read.csv("Diwali_Sales_Data_main.csv"))</pre>
## select column
ds_cl <- diwali_sales %>%
  select(User_ID,
         Cust_name,
         Product_ID,
         Product_Category,
         Gender,
         Age,
         Marital_Status,
         State,
         Zone,
         Occupation,
         Orders,
         Amount) %>%
  drop_na()
## check NA
```

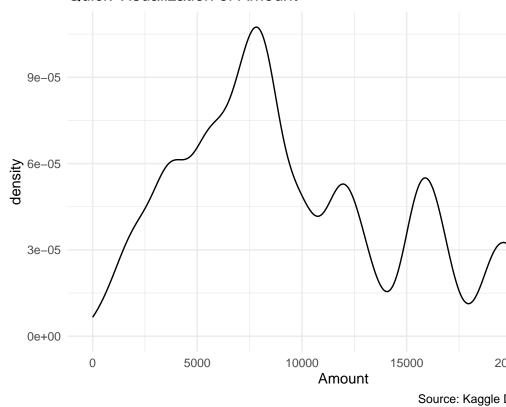
```
ds_cl %>%
  complete.cases() %>%
  mean()
```

Install package and Import dataset

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

```
ggplot(ds_cl, aes(Amount)) +
  geom_density() +
  theme_minimal() +
  labs(
    title = "Quick Visualization of Amount",
    x = "Amount",
    caption = "Source: Kaggle Diwali Sales Datasets"
)
```

# **Quick Visualization of Amount**



**Quick Visualization of Amount** 

# Split and Prep Data

# Train data

```
## Linear Regression
##
## 7875 samples
##
      1 predictor
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 7875, 7875, 7875, 7875, 7875, 7875, ...
## Resampling results:
##
##
    RMSE
              Rsquared
##
    5225.28 0.0005284117 4312.628
## Tuning parameter 'intercept' was held constant at a value of TRUE
```

```
# score <- prediction
p <- predict(lm_model, newdata = ts_df)</pre>
```

# Scoring

```
## evaluate
  # mae mse rmse
  ## create function
cal_mae <- function(actual, pred) {</pre>
  error <- actual - pred
  return(mean(abs(error)))
cal_mse <- function(actual, pred) {</pre>
  error <- actual - pred
  mean(error ** 2)
cal_rmse <- function(actual, pred) {</pre>
 error <- actual - pred
  sqrt(mean(error ** 2))
}
# check result
cal_mae(ts_df$Amount, p)
Evaluate
## [1] 4272.277
cal_mse(ts_df$Amount, p)
## [1] 26999848
cal_rmse(ts_df$Amount, p)
## [1] 5196.138
## Summary
lm_model$finalModel %>%
  summary()
```

### Summary

```
##
## Call:
## lm(formula = .outcome ~ ., data = dat)
## Residuals:
##
    Min
           1Q Median
                           3Q
                                   {\tt Max}
## -9597 -3992 -1337 3247 14498
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 9676.97 144.54 66.949 <2e-16 ***
## Orders
           -80.27
                            53.05 -1.513
                                                0.13
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## Residual standard error: 5243 on 7873 degrees of freedom
\hbox{\tt \#\# Multiple R-squared:} \quad \hbox{\tt 0.0002907,} \quad \hbox{\tt Adjusted R-squared:} \quad \hbox{\tt 0.0001637}
## F-statistic: 2.289 on 1 and 7873 DF, p-value: 0.1303
```