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* BIA 652-WS – Multivariate Data Analysis
* Final Project: Understanding Customer Behavior and Churn Risk in E-Commerce
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* Semester: Spring 2025
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* Objective:
* This program imports a cleaned customer-level dataset and applies the following
* multivariate techniques in alignment with course methods:
* - Descriptive Statistics & Normality Checks
* - Exploratory Factor Analysis (EFA)
* - Multiple Regression Analysis
* - Logistic Regression for Churn Prediction
* - Cluster Analysis for Customer Segmentation
* - MANOVA for Country-Based Group Comparison
*
* Dataset Source:
* UCI Online Retail Dataset (https://archive.ics.uci.edu/ml/datasets/Online+Retail)
* Cleaned and engineered in Python, imported here for SAS-based statistical modeling.
*
* All procedures and logic below follow the structure and statistical techniques
* taught and practiced in class.
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/* Step 1: Import cleaned Python file */

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proc import datafile="/home/u64166562/sasuser.v94/retail_customer_summary (1).csv"
    out=retail_raw
    dbms=csv
    replace;
    getnames=yes;
run;

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/* Step 2: Rename variables to match SAS class structure */

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data retail;
    set retail_raw;

    X1 = Recency;
    X2 = PurchaseFrequency;
    X3 = TotalSpend;
    X4 = AvgOrderValue;
    X5 = AvgUnitPrice;
    X6 = TotalQuantity;
    X7 = Churn;
    X8 = ReturnedQuantity;
    X9 = ReturnRate;
    X10 = CustomerID;
    X11 = Country;
run;

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/* Step 3: Descriptive stats and normality */

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proc means data=retail n mean std min max;
    var X1-X6;
run;

proc univariate data=retail normal plot;

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var X1 X3 X4 X5 X9; /* Recency, Spend, AOV, Price, ReturnRate */
run;

/* Step 4: Factor analysis on behavioral traits */
proc factor data=retail method=principal rotate=varimax msa plots=scree nFactors=2;
var X1 X2 X3 X4 X5 X9; /* Recency, Frequency, Spend, AOV, Unit Price, ReturnRate */
run;

/* Step 5: Regression - Predict TotalSpend */
proc reg data=retail plots(unpack);
model X3 = X1 X2 X4 X5 X6 X9 / vif stb influence tol;
run;

/* Check residual normality */
proc reg data=retail;
model X3 = X1 X2 X4 X5 X6 X9;
output out=reg_out r=residuals;
run;

proc univariate data=reg_out normal plot;
var residuals;
run;

/* Step 6a: Check class distribution for Churn */
proc freq data=retail;
tables X7 / nocum nopercnt;
run;

/* Step 6b: Logistic regression - Refined model to avoid separation */
/* Dropping TotalSpend (X3) as it is highly correlated with Churn */
proc logistic data=retail descending;
model X7 = X1 X4 X9; /* Recency, AOV, ReturnRate */
run;

/* Step 7a: Standardize variables to mean=0, std=1 */
proc standard data=retail mean=0 std=1 out=retail_std;
var X1 X3 X4 X5 X9; /* Recency, TotalSpend, AOV, UnitPrice, ReturnRate */
run;

/* Step 7b: Cluster analysis (K-means) */
proc fastclus data=retail_std maxclusters=4 out=clustered;
var X1 X3 X4 X5 X9;
run;

/* Step 7c: Use MANOVA to validate cluster differences */
proc glm data=clustered;
class cluster;
model X1 X3 = cluster; /* Test whether Recency & Spend vary by cluster */
manova h=cluster / mstat=exact;
run;

/* Step 7d: ANOVA Cluster Profile Validation - Test each variable across clusters */
proc glm data=clustered;
class cluster;
model X1 = cluster; /* Recency */
means cluster / tukey;
run;
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proc glm data=clustered;
  class cluster;
  model X3 = cluster; /* TotalSpend */
  means cluster / tukey;
run;

proc glm data=clustered;
  class cluster;
  model X4 = cluster; /* AvgOrderValue */
  means cluster / tukey;
run;

proc glm data=clustered;
  class cluster;
  model X5 = cluster; /* AvgUnitPrice */
  means cluster / tukey;
run;

proc glm data=clustered;
  class cluster;
  model X9 = cluster; /* ReturnRate */
  means cluster / tukey;
run;

/* Step 7e: Export final clustered dataset to CSV */
proc export data=clustered
  outfile="/home/u64166562/sasuser.v94/retail_customer_summary (1).csv"
  dbms=csv replace;
run;

/* Step 8a: MANOVA to compare behavior across countries */
proc glm data=retail;
  class X11; /* Country */
  model X2 X3 = X11; /* Frequency and Spend */
  means X11 / hovtest=levene hovtest=bf hovtest=bartlett;
  manova h=X11 / mstat=exact;
run;

proc export data=retail
  outfile="/home/u64166562/sasuser.v94/retail_customer_summary (1).csv"
  dbms=csv replace;
run;

proc export data=clustered
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