

NOVA

IMS

Information
Management
School



GROUP PROJECT - PREDICTIVE | DSML 2023

1. Company Presentation

Welcome to "Spice Alley" a unique restaurant that caters to everyone's dietary needs. Our menu offers a wide range of options, including meat, vegetarian, and fish dishes, all cooked to perfection by our expert chefs.

For meat lovers, we offer juicy burgers, succulent steaks, and tender ribs, all made from the finest cuts of meat. Our vegetarian dishes are just as delicious, with options like our signature quinoa salad, veggie burgers, and roasted vegetable pasta.

And for seafood lovers, we have a selection of fresh fish dishes, including pan-seared salmon, grilled shrimp skewers, and creamy seafood chowder. Our fish is sourced directly from local fishermen, ensuring the freshest and most sustainable seafood available.

But the dining experience at Spice Alley isn't just about the food. Our restaurant features a warm and welcoming atmosphere, with cozy booths and elegant lighting, making it the perfect spot for a romantic date or a family dinner.

We also have an extensive drink menu, with craft beers, fine wines, and signature cocktails that pair perfectly with our menu items. Our friendly and knowledgeable staff will be happy to recommend a drink that complements your meal.

So whether you're in the mood for a hearty steak, a refreshing salad, or a delicious seafood dish, Spice Alley has something for everyone. Come visit us and experience the perfect combination of meat, vegetarian, and fish dishes, all under one roof.

2. Data in Spice Alley

Spice Alley is an emergent restaurant that has gained notoriety for its dedication to innovation and commitment to enhancing the customer experience. With an extensive background in data collection and analysis, Spice Alley has firmly established itself as a prominent player in the restaurant industry.

Recognizing the growing potential of data analytics, Spice Alley has embraced the power of machine learning to support their customer acquisition and retention efforts. As such, they have created a unique challenge designed to identify patterns in customer behavior and improve marketing campaigns. Your team has been selected to participate in this exciting opportunity due to your impressive machine learning skills.

The data utilized in the challenge has been collected from a variety of sources, including demographic data, firmographic data, and marketing campaigns data. With Spice Alley's considerable expertise and

the high-quality data they have gathered, your team will have all the necessary resources to help their management team identify consumer behavior patterns. These patterns can then be leveraged to uncover new opportunities for expanding their business in the future.

Best of luck to your team!

3. Objectives – Predictive Project

The team's objective is to construct a predictive model that can generate the maximum profit for the upcoming sixth direct marketing campaign of the company, scheduled for next August. This campaign is geared towards promoting a new product related to frozen food to the customer database, which has a potential of up to 10,000 customers.

To create the predictive model, the team executed a pilot campaign. They contacted a random sample of 2,500 customers through mail, inquiring about the acquisition of the product. The customers who purchased the offer within the next three months were labeled with a 1, while the non-respondents were labeled with a 0.

The entire pilot campaign cost €7,500, calculated by multiplying the cost of contacting each customer (€3) by the total number of customers (2,500). Approximately 12.5% of the customers accepted the offer, which is quite remarkable, with each customer contributing €16 in revenue. However, the campaign had a negative profit of approximately -€2,500.

The team's goal is to devise a model that predicts customer behavior and apply it to the remaining customer base. Hopefully, the model will enable the company to choose customers who are more likely to purchase the new product while disregarding non-responders, resulting in a highly lucrative campaign.

4. Data sets

You have access to two different datasets:

1. The “historical.xlsx” dataset should be used to build your machine learning models. In this set, you also have the ground truth associated with each customer, i.e., if the customer adhered to the campaign (1) or not (0).
2. The “predict.xlsx” set should be used to see how well your model performs on unseen data. In this set you don’t have access to the ground truth (the DepVar variable), and the goal of your team is to predict that value (“0” or “1”) by using the model you created using the training set.

The available data contains the following attributes:

Variable	Description
CustomerID	Customer unique identification
Name	Customer’s name
Birthyear	Customer’s year of birth
Education	Customer’s level of education
Marital_Status	Customer’s marital status
Income	Customer’s yearly household income
Kid_Younger6	Number of kids younger than 6 in the household
Children_6to18	Number of children between 6 and 18 years old in the household
Date_Adherence	Date of customer adherence to company’s card
Recency	Number of days since the customer's last purchase
MntMeat&Fish	Amount spent on meat and fish dishes
MntEntries	Amount spent on entries
MntVegan&Vegetarian	Amount spent on Vegan and Vegetarian dishes
MntDrinks	Amount spent on drinks
MntDesserts	Amount spent on desserts
MntAdditionalRequests	Amount spent on additional requests
NumOfferPurchases	Number of purchases made using promotional offers
NumAppPurchases	Number of purchases made through food delivery apps
NumTakeAwayPurchases	Number of take-away purchases
NumInStorePurchases	Number of in-store purchases
NumAppVisitsMonth	Average number of accesses to the restaurant in food delivery apps

Response_Cmp1	Flag indicating whether the customer accepted the offer in campaign 1
Response_Cmp2	Flag indicating whether the customer accepted the offer in campaign 2
Response_Cmp3	Flag indicating whether the customer accepted the offer in campaign 3
Response_Cmp4	Flag indicating whether the customer accepted the offer in campaign 4
Response_Cmp5	Flag indicating whether the customer accepted the offer in campaign 5
Complain	Flag indicating whether the customer has made a complaint
CostContact	New campaign's cost per contact
Revenue	Campaign's positive answer expected revenue
Depvar	Binary variable indicating if customer accepted (1) or not (0) a marketing offer from the new campaign. Dependent variable of the problem.

5. Deliverables

1. A **Jupiter notebook** that contains all the code needed to obtain the results presented and explored in the report. The file should be named "DSML_202223_Predictive_GroupXX_Notebook.ipynb", where "GroupXX" is your group number.
2. A **report** that describes the analytical processes and the conclusions obtained, with at most 8 pages, and the following formatting conditions:
 - Heading 1: Arial, Size 12 pt, in bold
 - Heading 2 (if needed): Arial, Size 11 pt, in bold and italic
 - Text: Arial, Size 10 pt, line space of 1.5 points.
 - Margins: The default ones in word (Top, Bottom, Left and Right as 1").

All figures and tables should be included in the annexes, located at the end of the report, and referenced in the body text.

The cover page, index, references, and annexes are not included in the limit of the 8 pages.

Please note that the report will be penalized if it does not adhere to the specified conditions.

3. **Additionally**, the final submission in Kaggle must be selected (please check the provided pdf file "*How to submit and select the final submission on Kaggle*") before the deadline.

The file should be named “DSML_202223_Predictive_GroupXX_Report.pdf”, where “GroupXX” is your group number.

6. Notes

- All topics mentioned will be evaluated based on the report - a well-structured and succinct report will have a big weight on the evaluation.
- The Jupyter Notebook will only be analyzed in the event of any doubts concerning the report's credibility. Please note that any steps performed in the Jupyter Notebook that are not described in the report will not be evaluated. As an example, let's suppose that you check the outliers, and at the end of your project, you decide to keep them. In the report, you should mention how you checked for outliers, what the steps were to remove them and why did you decide to keep them at the end, among other insights that can be relevant. The jupyter notebook should be delivered with all the cells already ran.
- Both the report and the code will undergo a plagiarism check.
- The report should clearly refer (on a cover or on the first page if no cover is included) the group number, the students' names and the students' numbers.
- **For more information, please read the Kaggle competition rules carefully.**
- The deadline for submission of all documents is set until the end of June 4, 2023. Your report (pdf format) and your Jupiter notebook (ipynb format) should be submitted in moodle by this date. Additionally, the final submission in Kaggle must be selected (please check the provided pdf file *“How to submit and select the final submission on Kaggle”*) before the deadline.
- One submission per group is enough. For each day of delay, there will be a discount of 1 value on the final grade. The maximum possible number of days of delay is three days (with a penalization of 3 values out of 20).

7. Evaluation Criteria

The following table quantifies the major evaluation criteria.

Criteria	Percentage	Maximum Grade
Kaggle Performance	25%	5
Report Quality and StoryTelling	10%	2
Introduction and Methodology	5%	1
Exploration	5%	1
Preprocessing	10%	2
Modelling	15%	3
Performance Assessment	5%	1
Other predictive models (not given during classes)	7.5%	1.5
Creativity & Other Self-Study	7.5%	1.5
Conclusions	10%	2
TOTAL	100%	20

In order to achieve the highest score of 20 for their project, students must apply self-study and creativity in addition to utilizing the techniques and methodologies taught in the practical classes. A project that solely employs the latter will receive a maximum score of 17, leaving room for an additional 3 marks to be obtained through the incorporation of original and well-explained contributions.

This bullet-list provides some details about each aspect:

- **Kaggle performance:** The performance obtained on Kaggle, on the submission selected (F1 Score)
- **Report-quality and Storytelling:** The report should adhere to the provided structure and detail the steps taken and key insights discovered throughout the project. Clarity, conciseness, objectivity, and contextualization within the business are highly valued. It is important to justify decisions and steps based on previous findings (when possible), and to relate hypotheses and discoveries to the business problem at hand.
- **Introduction and Methodology:** The introduction should provide a broad overview of the topic and main objective of the project, while the methodology should outline the general approach taken and describe the various stages of the project.
- **Exploration:** The population studied should be described using statistical measures, visualizations, and business insights that reflect the most significant findings.

- **Preprocessing:** This stage includes all the necessary steps to transform raw data into prepared data to model, encompassing data cleaning, transformation, and reduction. It also entails business-related transformations of the input features and the creation of new features, and their accompanying explanations. If new variables are created, those should be mentioned and described clearly on a table (to be included in the annexes).
- **Modelling:** Implementation and reasoning behind any predictive model used in the project and addressed in classes. The application of additional models not given during classes are optional and considered as points in “Other predictive models”.
- **Performance Assessment:** The comparison of different models and their performance.
- **Other predictive models:** A theoretical explanation of additional algorithms should be provided in the annex (not included in the 8 pages). Involves the depth and the quality of the comparative analysis provided by the different algorithms, the theoretical explanation of the algorithm itself and the justification of the chosen parameters.
- **Creativity and Other Self-Study:** If other techniques not given during practical classes are applied, a theoretical explanation of the algorithm should be provided in the annex (not included in the 8 pages). This topic includes not only the application of different techniques but also aspects of creativity, such as the the quality of visualizations, plots and others.
- **Conclusions:** The key ideas discussed throughout the project should be summarized and emphasized.
- All aspects will be evaluated by comparing the work submitted by the different groups.
- Theoretical explanations of any techniques or algorithms applied should only be provided for topics not covered during practical classes and be included in the annex.
- The report should not mention the specific code techniques used to obtain the results, such as "To fill missing values, we used the fillna() method from pandas."