

# Optimizing Efficiency for Bank Marketing Campaign

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# The Dataset

The data is related with direct marketing campaigns (phone calls) of a Portuguese banking institution.

The classification goal is to predict if the client will subscribe a term deposit (binary variable  $y$ ).

Instances: 41188

# Features: 20

- Demographic: age, job, education, marital
- Financial: credit default, personal loan, housing loan
- Previous Campaign information and outcome
- Social economic factors: employment variation rate, euribor rate, consumer price and confidence index, number of employees in the market



# Motivation

## Business Problem:

By analyzing past campaign data, find out:

- whether a client will subscribe to a term deposit
- what type of client is most likely to do so

## Goal:

Ensure efficiency in marketing campaign while optimizing the number of people who subscribe through an **effective** and **reliable** solution





# Conjectures



## Demographic

'Higher' level professions and education are likely to subscribe.



## Debt

Individuals facing already existing debts are less likely to subscribe.



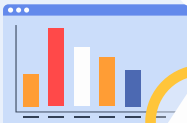
## Previous Campaign

Results from the previous marketing campaign can predict the results of this current campaign.

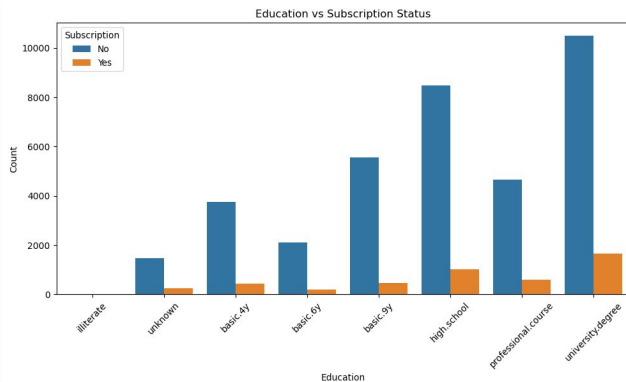
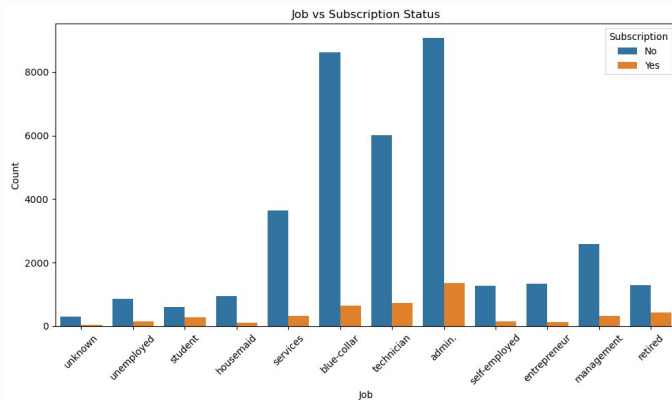


## Social Economic Indicators

The behavior of the social and economic indicators impacts the campaign's success.



# Conjecture 1: Demographic



**Student: 31%**

Self defined 'order', therefore difficult to support.



**Retirement: 25%**



**Basic Avg.: 8.8%    High School +: 12%**

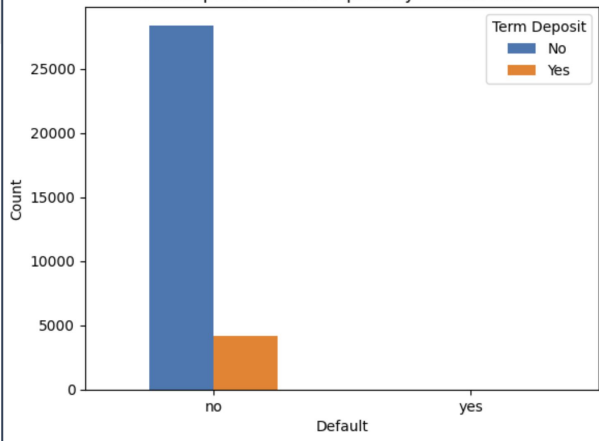
Higher subscription rates in high school and up.



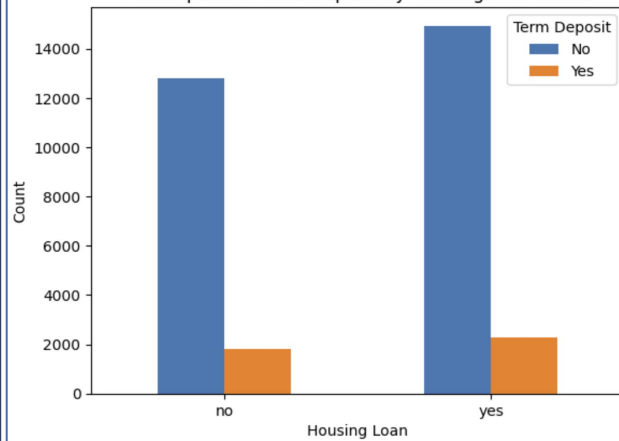


# Conjecture 2: Debt

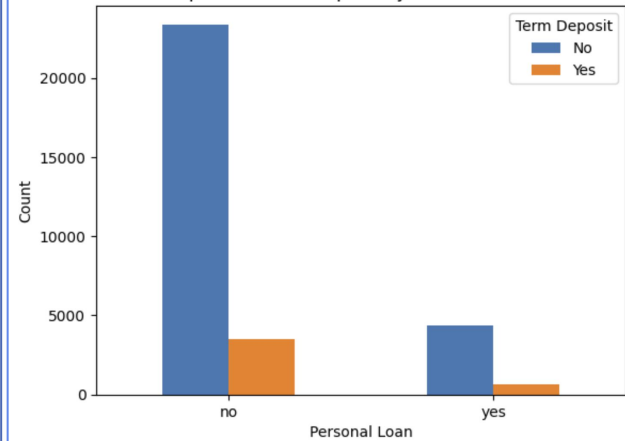
Subscription to Term Deposit by Default Status



Subscription to Term Deposit by Housing Loan Status



Subscription to Term Deposit by Personal Loan Status



## ● Default

People in default  
are less likely to  
subscribe

## ● Housing

People with a  
housing loan less  
likely to subscribe

## ● Personal

People with a  
personal loan less  
likely to subscribe





# Conjecture 3: Previous Campaign

**poutcome** ●

Previous campaign  
outcome



● **y**

Target variable,  
subscribed (y/n)?

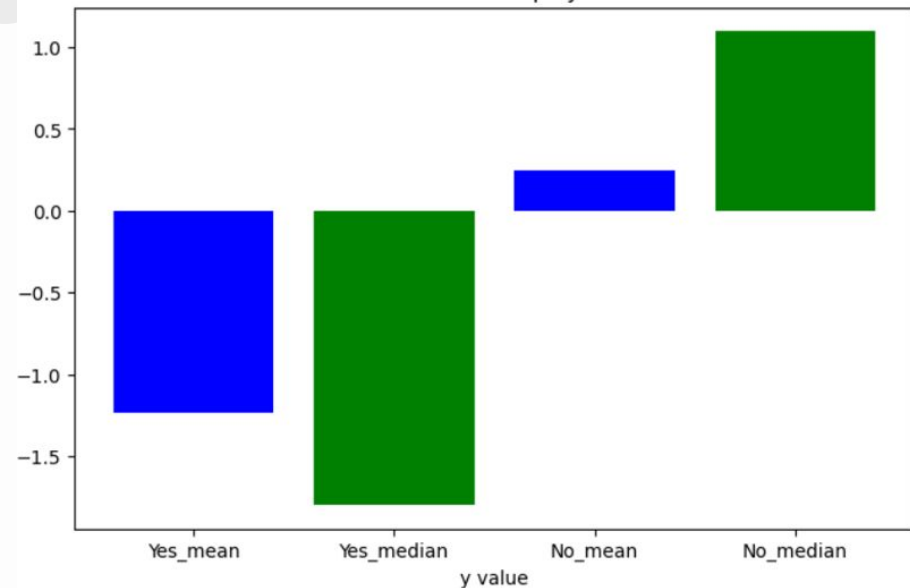
**Correlation Coefficient: 0.19**





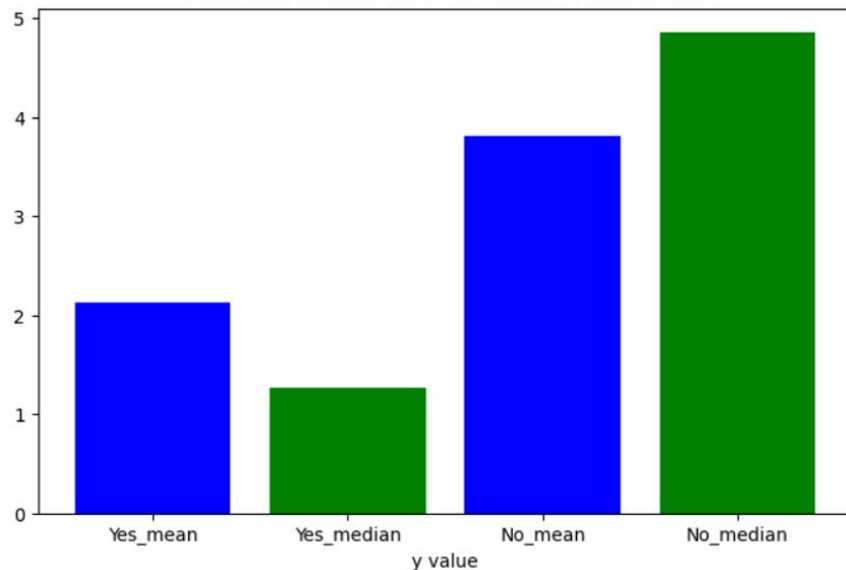
## Conjecture 4: Econ

Mean and median value of employment variation rate



During periods of economic uncertainty or job market downturns, people tend to seek a safer and more secure way to invest

Mean and median value of euribor 3 month rate



- Employment variation rate, number of employees, and euribor rate have the highest correlation coefficient to "y", and the three factors are highly correlated with each other





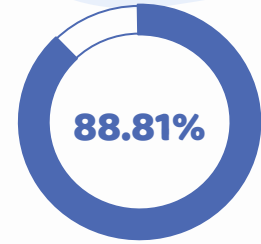
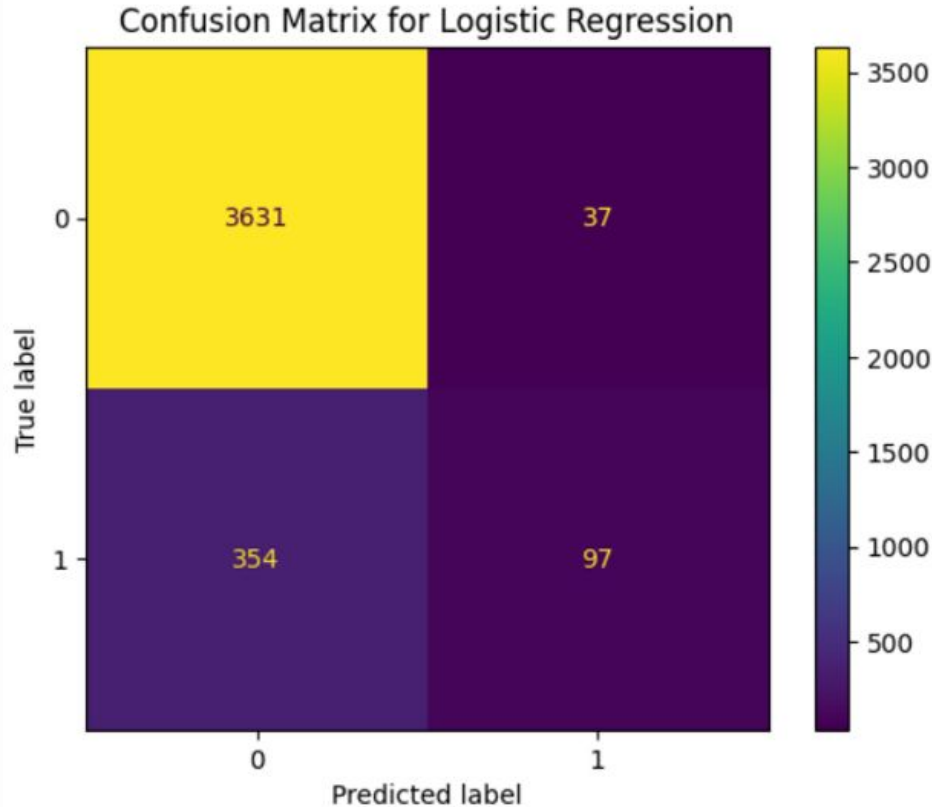
**Based on the outcome of our conjectures, we developed classification models and tested for feature importance.**

	Feature	Coefficient	Abs_Coefficient
12	cons.price.idx	0.323182	0.323182
14	euribor3m	-0.181200	0.181200
11	emp.var.rate	-0.166905	0.166905
4	default	-0.082857	0.082857
2	marital	-0.078254	0.078254
3	education	0.057127	0.057127
7	campaign	-0.054267	0.054267
13	cons.conf.idx	0.025195	0.025195
9	previous	0.021180	0.021180
1	job	-0.019857	0.019857
6	loan	0.008175	0.008175
5	housing	-0.007399	0.007399
0	age	0.006030	0.006030
15	nr.employed	-0.005762	0.005762
10	poutcome	-0.005166	0.005166
8	pdays	-0.001808	0.001808

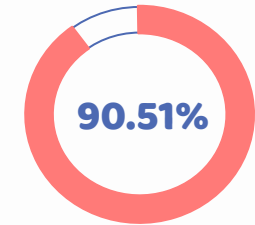
# Model Accuracy

Eg. Bank reach out to 37+97=134 candidates out of all, 97 of them will subscribe

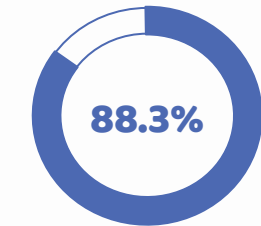
-> 72.4%



**Random forest**



**Logistic Regression**



**KNN Classification**



**Thank you...**  
**Questions?**