



## FOUNDATIONS OF PREDICTIVE ANALYTICS IN PYTHON (PART 1)

# Introduction and basetable structure

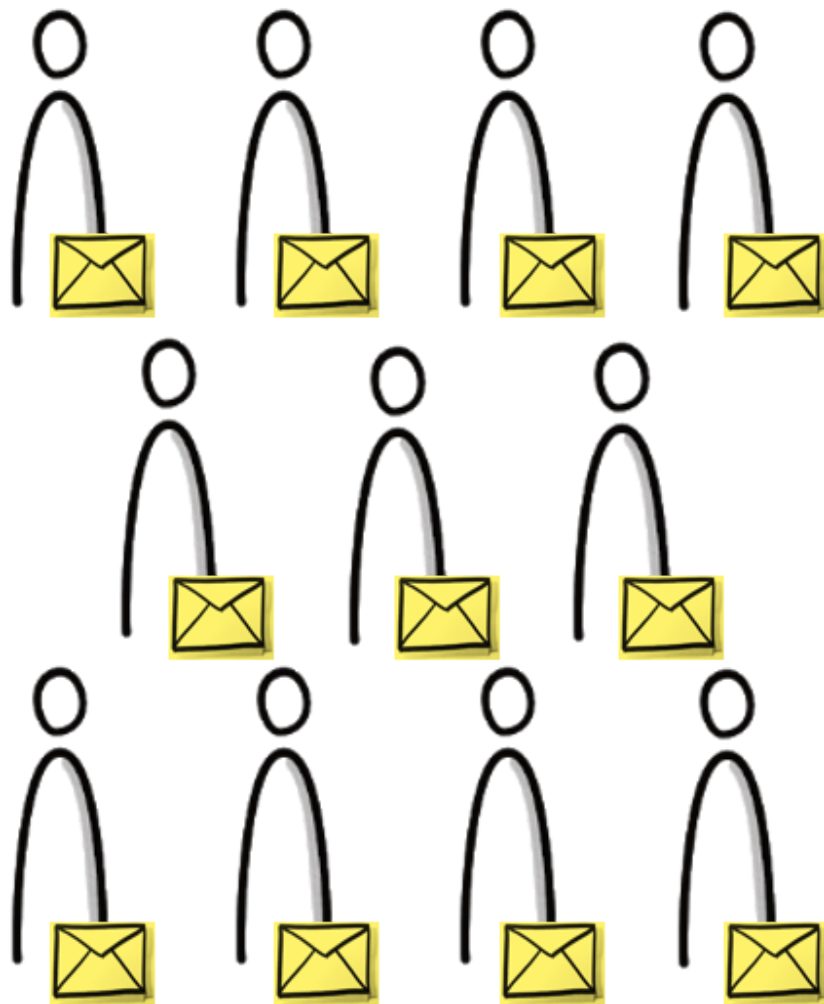
Nele Verbiest, Ph.D

Data Scientist

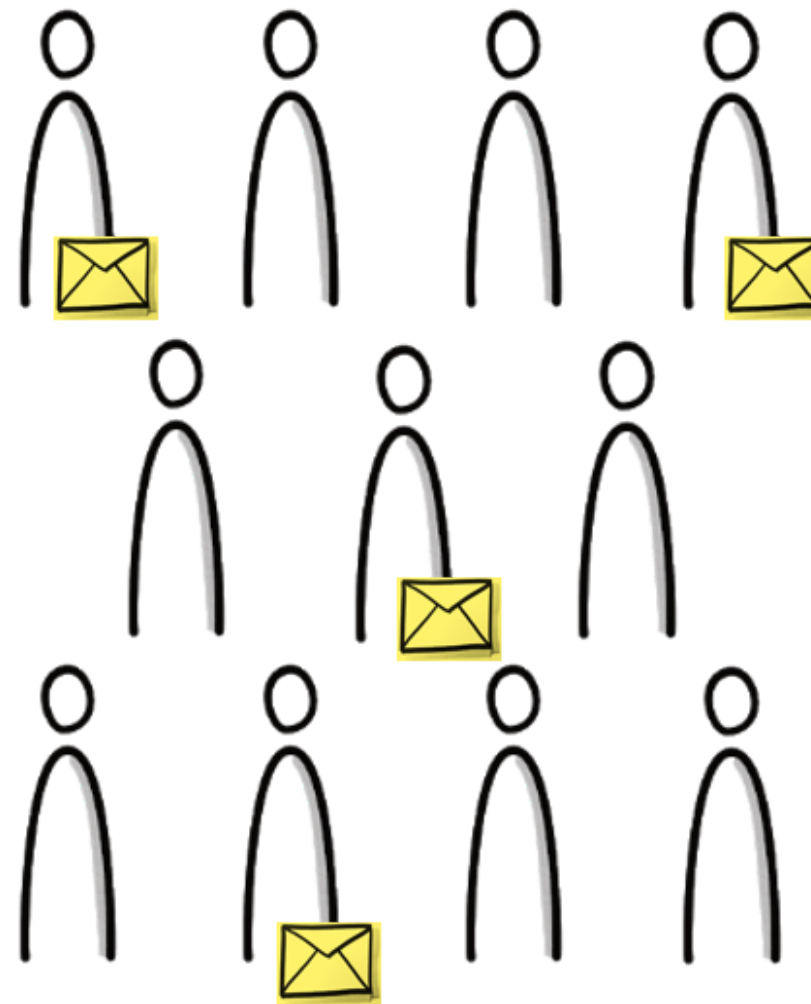
Python Predictions

# Predictive analytics in fundraising

Address all donors

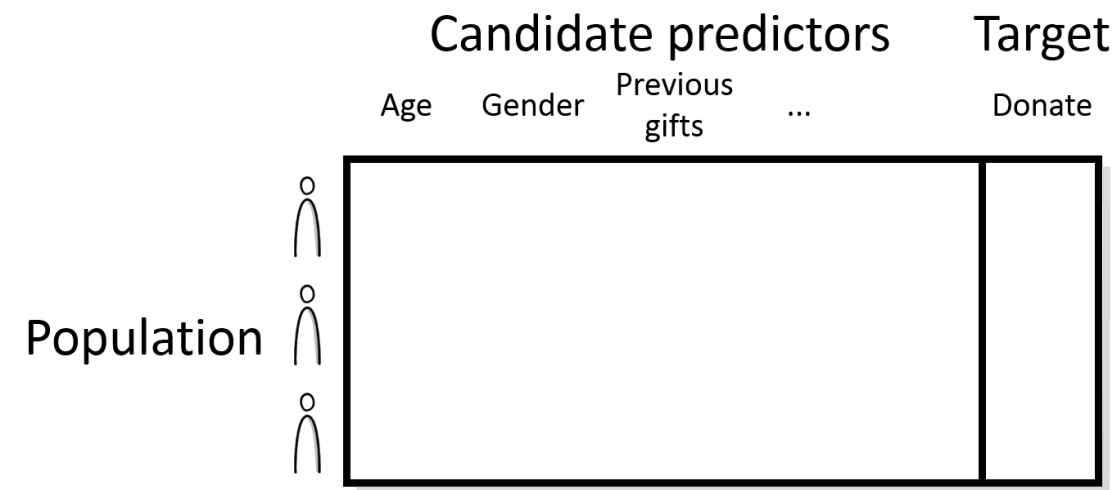


Address donors most likely to donate





# The analytical basetable



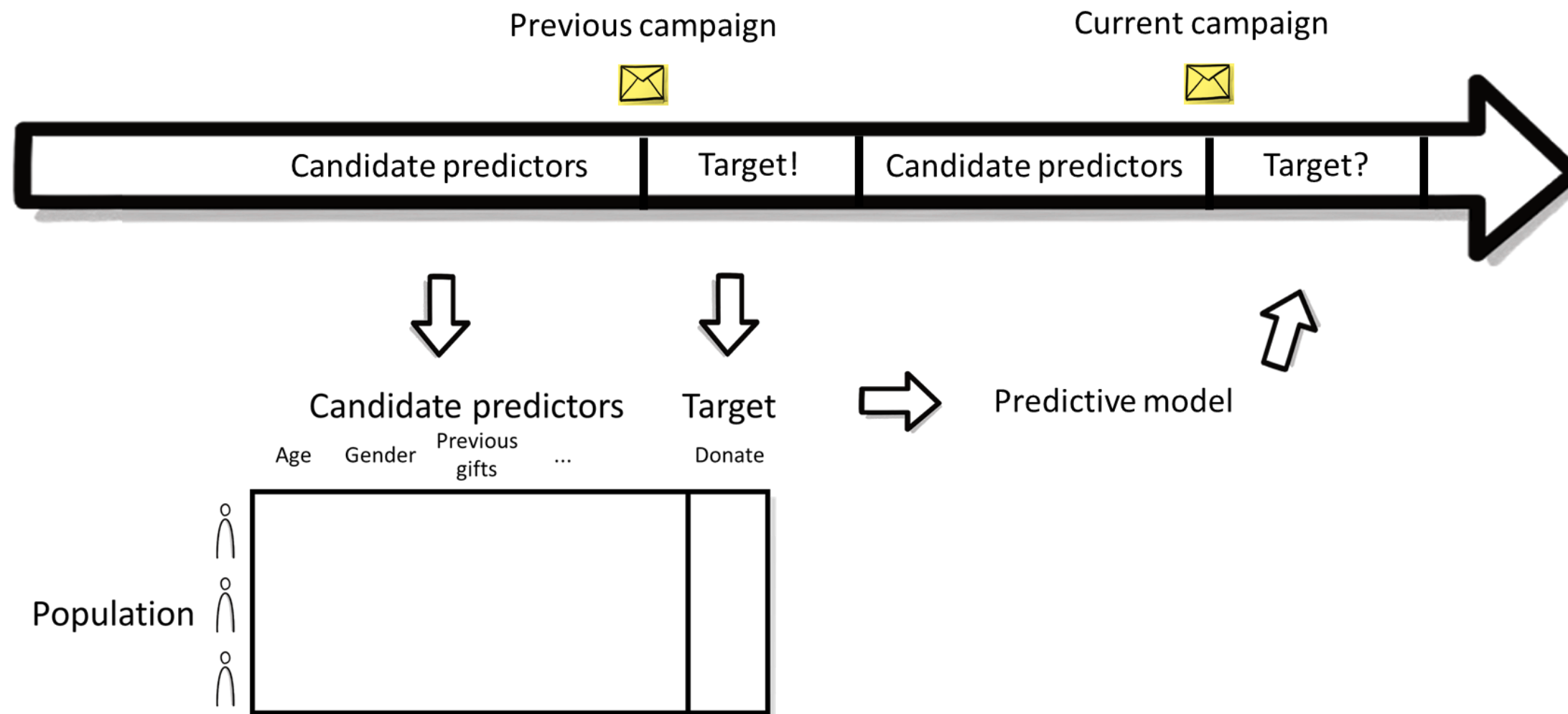
```
import pandas as pd
basetable = pd.DataFrame("import_basetable.csv")

population_size = len(basetable)

targets = sum(basetable["Target"])
```



# The timeline





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**Let's practice!**



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# Logistic regression

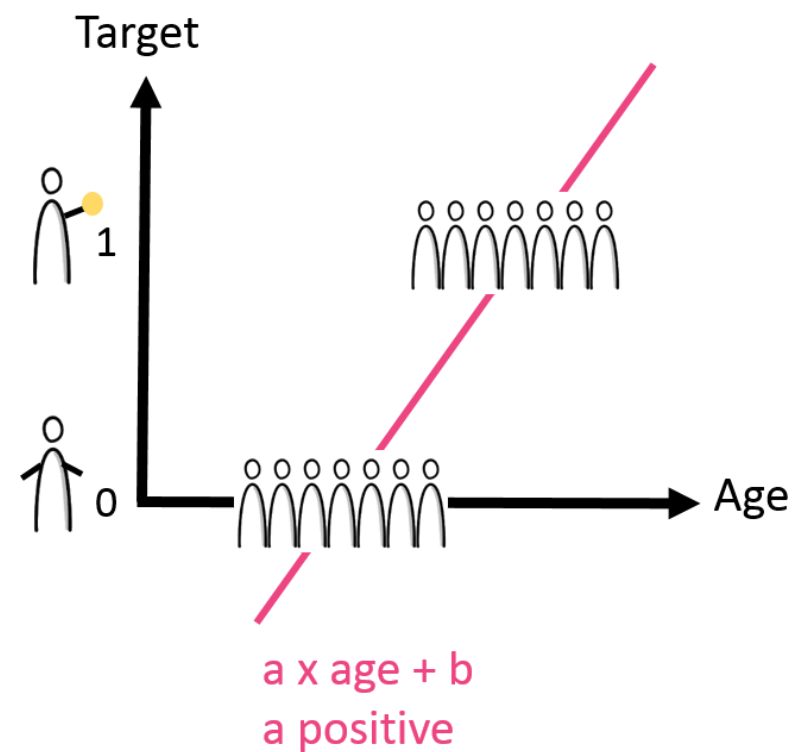
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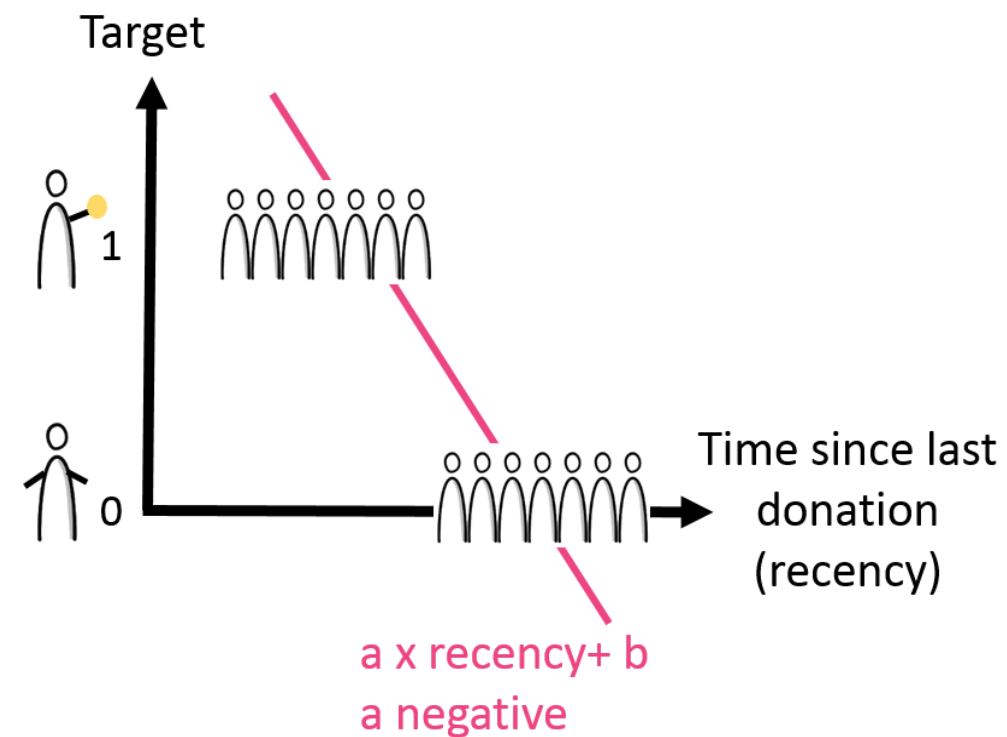


# Logistic regression: intuition

Older people are more likely to donate

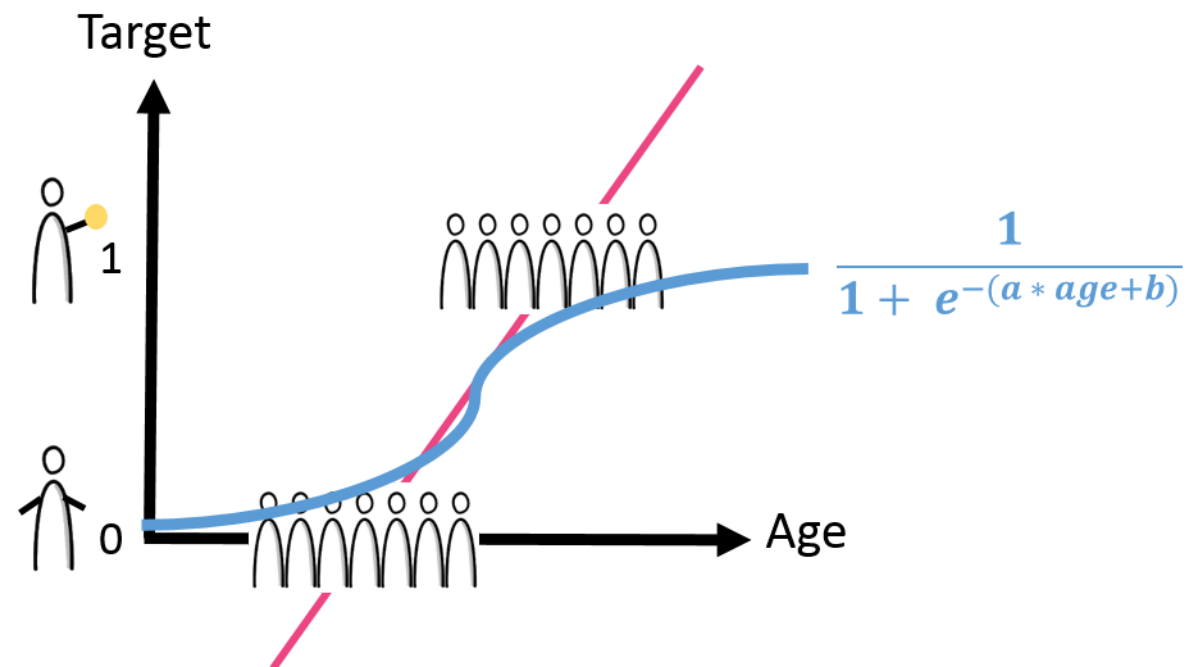


People who donated long time ago are less likely to donate



# Logistic regression: the logit function

- Output of  $a * age + b$  is a real number
- We want to predict a 0 or a 1
- Logit function transforms  $a * age + b$  to a probability







# Logistic regression in Python

```
from sklearn import linear_model

logreg = linear_model.LogisticRegression()

X = basetable[["age"]]
y = basetable[["target"]]

logreg.fit(X,y)

print(logreg.coef_)

[[ 0.02449202]]

print(logreg.intercept_)

[-4.3299131]
```



# Multivariate logistic regression

Univariate:  $ax + b$

Multivariate:  $a_1x_1 + a_2x_2 + \dots + a_nx_n + b$

```
X = basetable[["age", "max_gift", "income_low"]]
y = basetable[["target"]]

logreg.fit(X, y)

print(logreg.coef_)

[[ 0.0243308  0.03906065 -0.76793773]]

print(logreg.intercept_)

[-8.80643545]
```



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# Using the logistic regression model

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# The logistic regression function

```
0.545 * gender_F  
+ 0.021 * age  
-0.001 * time_since_last_gift  
-3.39
```

- Female (gender\_F=1)
- age 72
- 120 days since last gift

```
0.545 * 1  
+ 0.021 * 72  
-0.001 * 120  
-3.39  
= -1.45
```

$$\frac{1}{1+e^{-(-1.45)}} = 0.19$$



# Making predictions in Python

- Female (gender\_F=1)
- Age 72
- 120 days since last gift

```
logreg.predict_proba([1, 72, 120])  
array([[ 0.8204144,  0.1795856]])
```



# Making predictions in Python

```
new_data = current_data[["gender_F", "age", "time_since_last_gift"]]  
predictions = logreg.predict_proba(new_data)
```



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