

# Predicting Client Churn for *Shield International Bank*





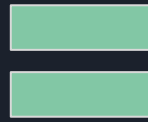
# What is Client Churn?





# What is Client Churn?

A Client stops using  
your services



A Client Churns





# Why Predict Client Churn?



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Win clients back *before* they leave



# Why Predict Client Churn?



Win clients back *before* they leave



Increase average lifetime value  
per customer

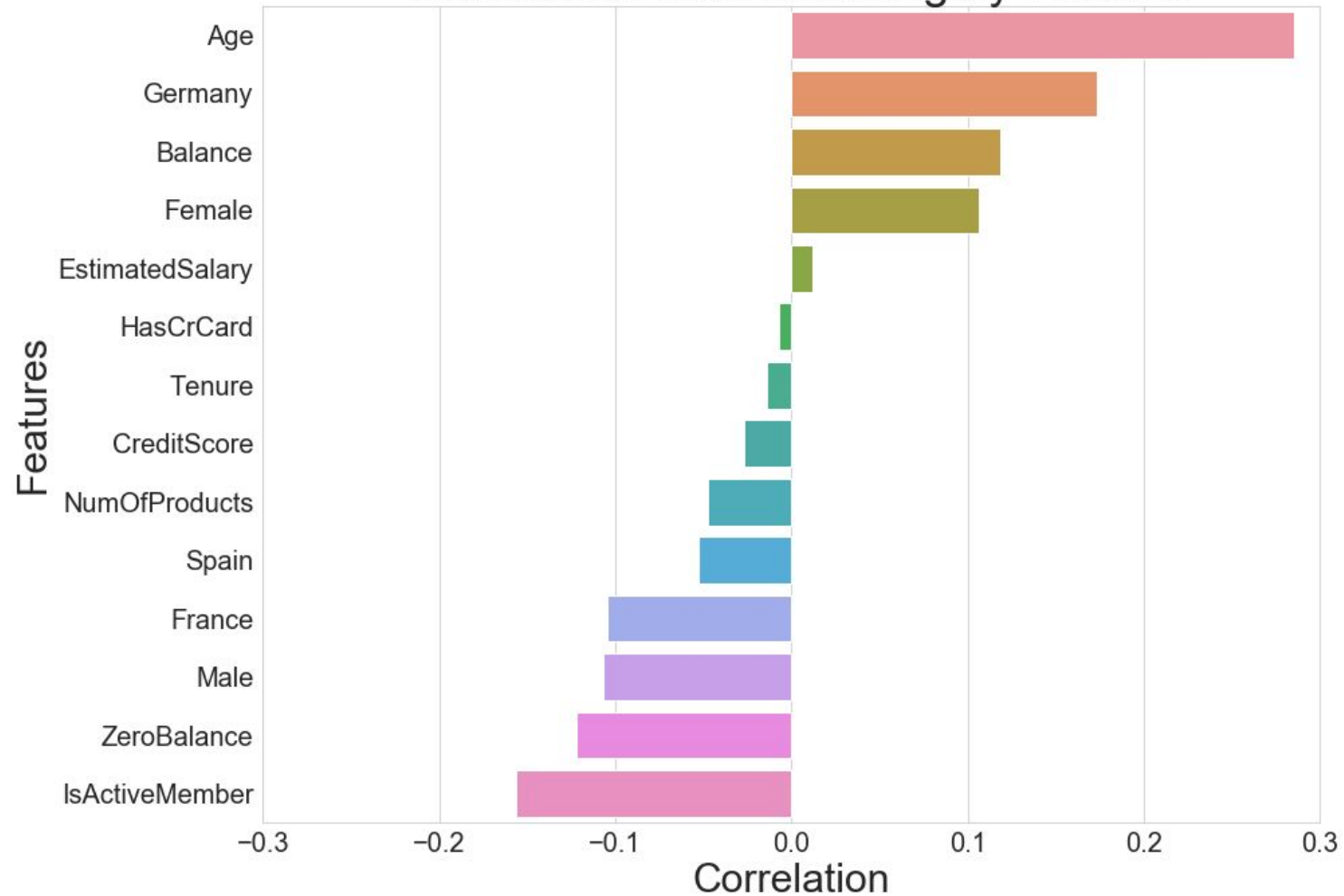


## Rule of Thumb:

Acquiring a new customer is *5x more expensive* than keeping one

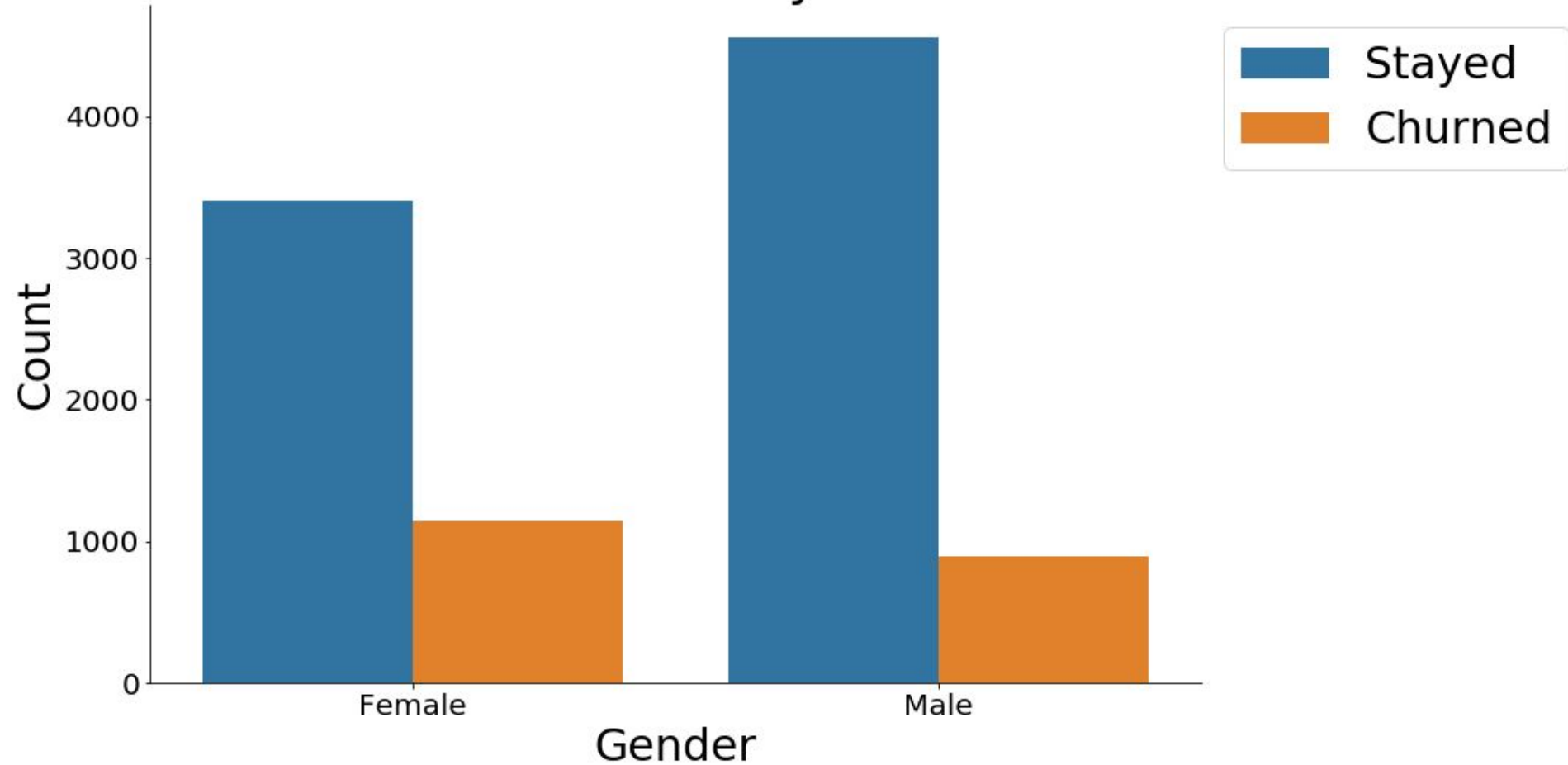


# Correlation With Churning by Feature

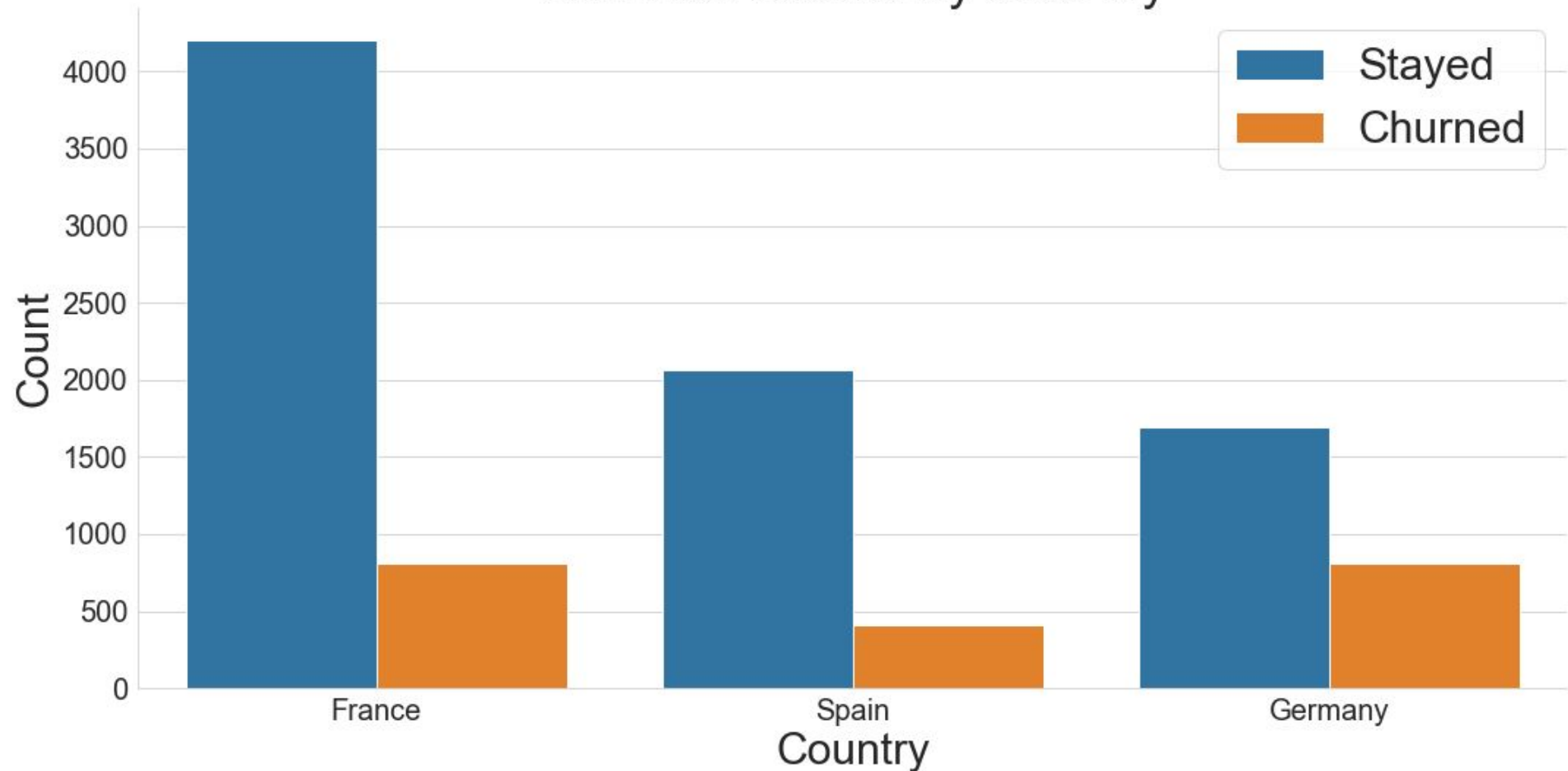




# Churned Clients by Gender



## Churned Clients by Country





# Predicting Churn

Fit a Random Forest Model to the given data

- Handles non-linear relationships well





# Predicting Churn

## Evaluation Metrics:

- Recall, Precision, and F-beta score





# Recall vs. Precision

Recall:

- What percent of the churning clients did we identify?





# Recall vs. Precision

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Precision:

- What percent of the clients we identified as churning were correct?





# Recall vs. Precision

## Recall:

- What percent of the churning clients did we identify?

## Precision:

- What percent of the clients we identified as churning were correct?





# Predicting Churn

Assumed recall was *5x more valuable* than precision  
based on 'Rule of Thumb'







# Predicting Churn

Assumed recall was *5x more valuable* than precision based on 'Rule of Thumb'

Used F-beta score to optimize parameters of model

- *Beta* is chosen such that recall is *beta* times more important than precision

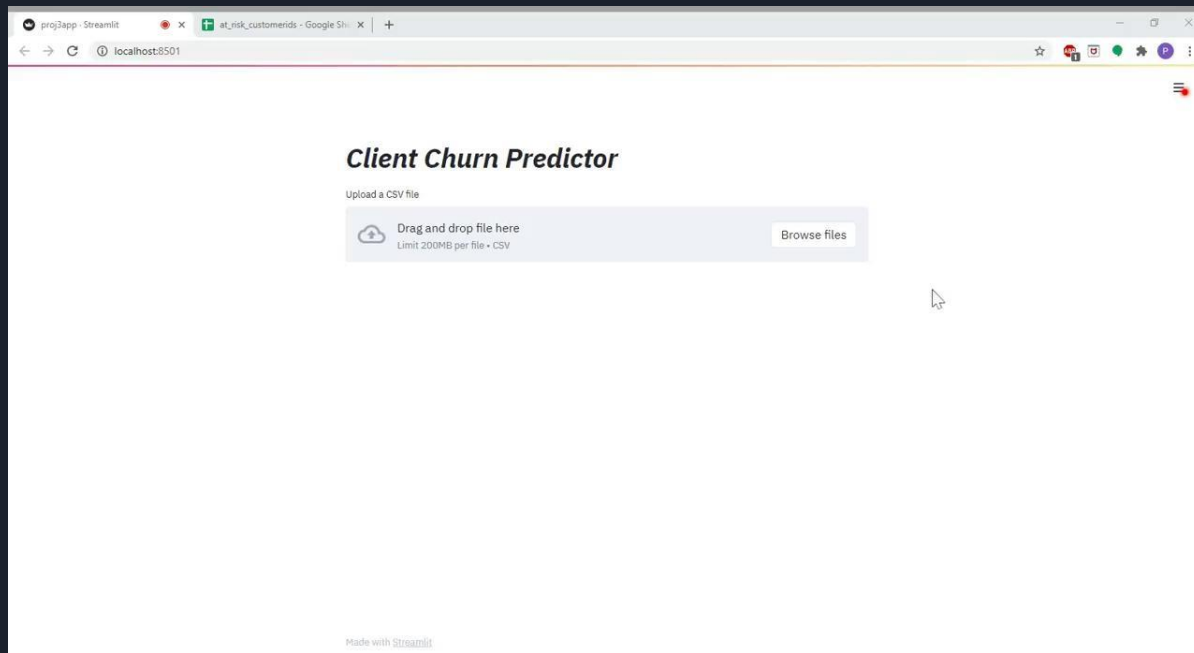




# Results



# App Demo





# Results

1250 clients out of 2000 in holdout set labeled as at-risk of churning (63%)





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1250 clients out of 2000 in holdout set labeled as at-risk of churning (63%)

Model Recall: **92%**

Model Precision: **30%**





# Results

Compare to Random Selection of Clients:





# Results

Compare to Random Selection of Clients:

**Recall:** 61% --- 31% lower than model

**Precision:** 18% --- 12% lower than model





# Future Work

Improve model precision without lowering recall







# Future Work

Improve model precision without lowering recall

- Add features
- Neural Networks/Deep Learning



A decorative graphic in the top-left corner consisting of a blue parallelogram and a light green parallelogram, both tilted at an angle.

# Thank you!

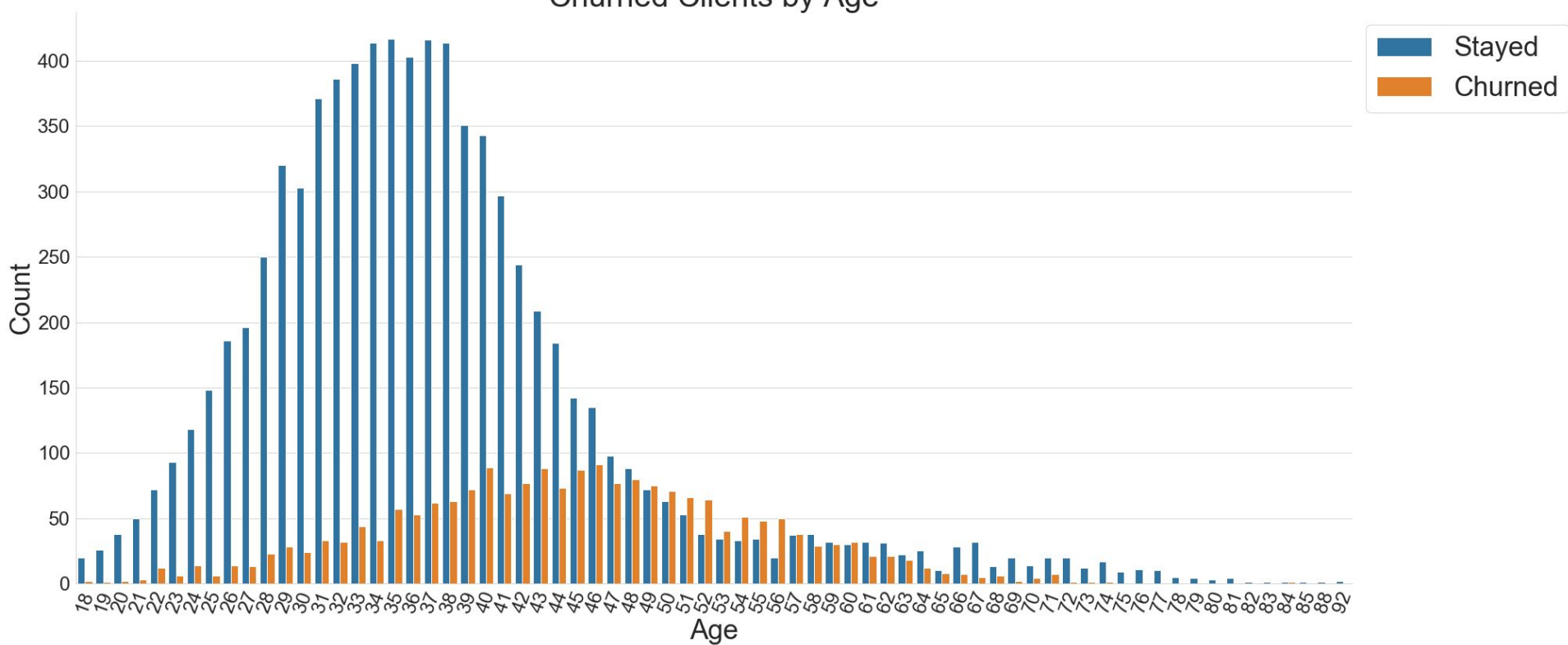
## Any questions?



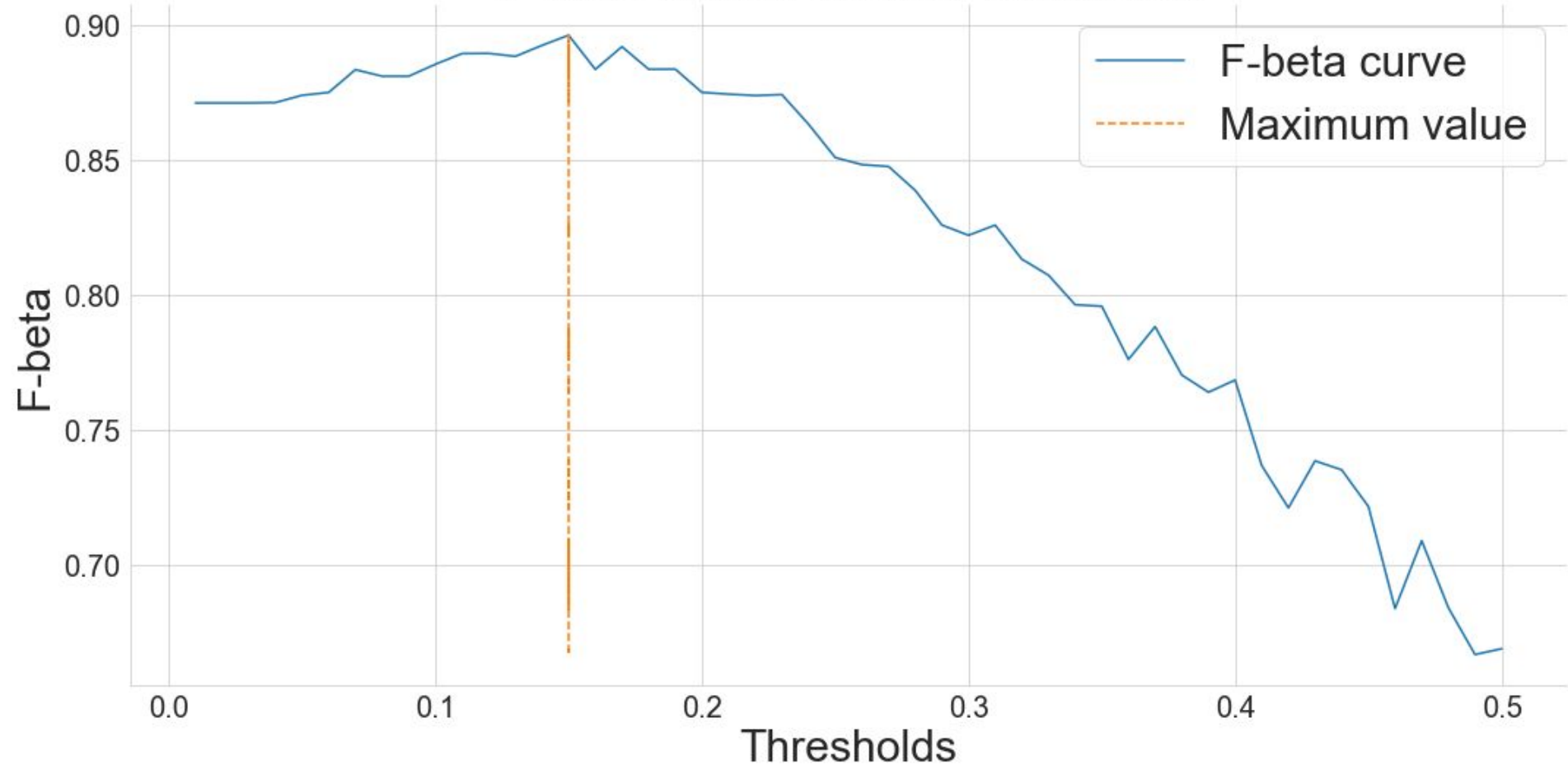


# Appendix

# Churned Clients by Age



# F-beta Score versus Threshold





# Results

