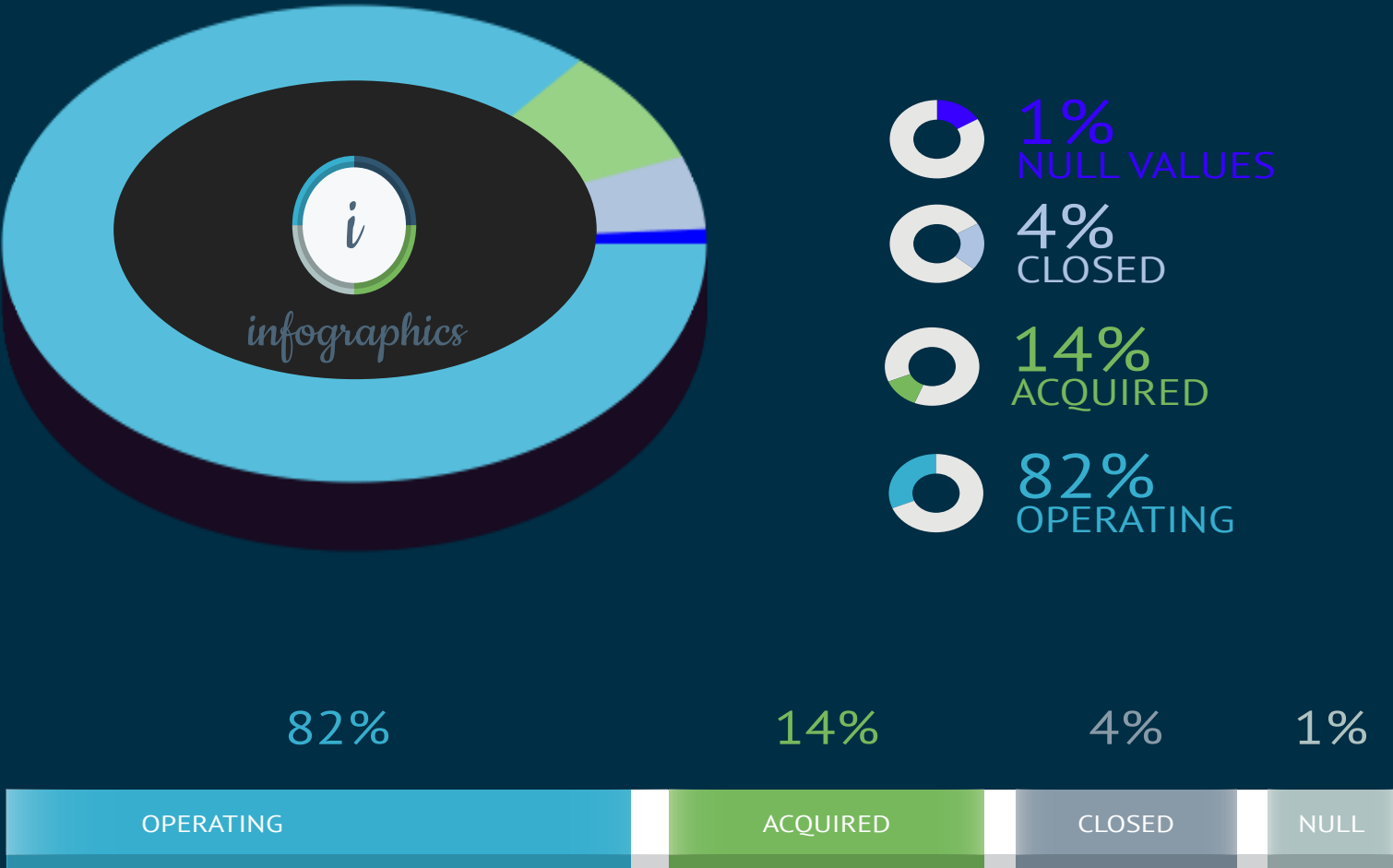


# ANALYSIS OF STARTUPS

ABSTRACT:  
The data was extracted from Crunchbase on February 2014.  
The dataset provides information about startup companies, investment, and acquisitions via Crunchbase.

A Project By:  
MAXIMILIAN OTT  
PRIYA MATNANI  
SASCHA HAGEDORN

Since an acquisition brings a lot of money to the founders and indicates that the startup succeeded in some way, this project explains which features increase the probability of an acquisition and predicts if a so far unseen startup will be acquired or not. To get the best possible results, multiple supervised learning algorithms such as Logistic Regression, Random Forest and Neural Networks were applied after intense data preparation. Validation shows that Deep Learning has the best performance in this case.

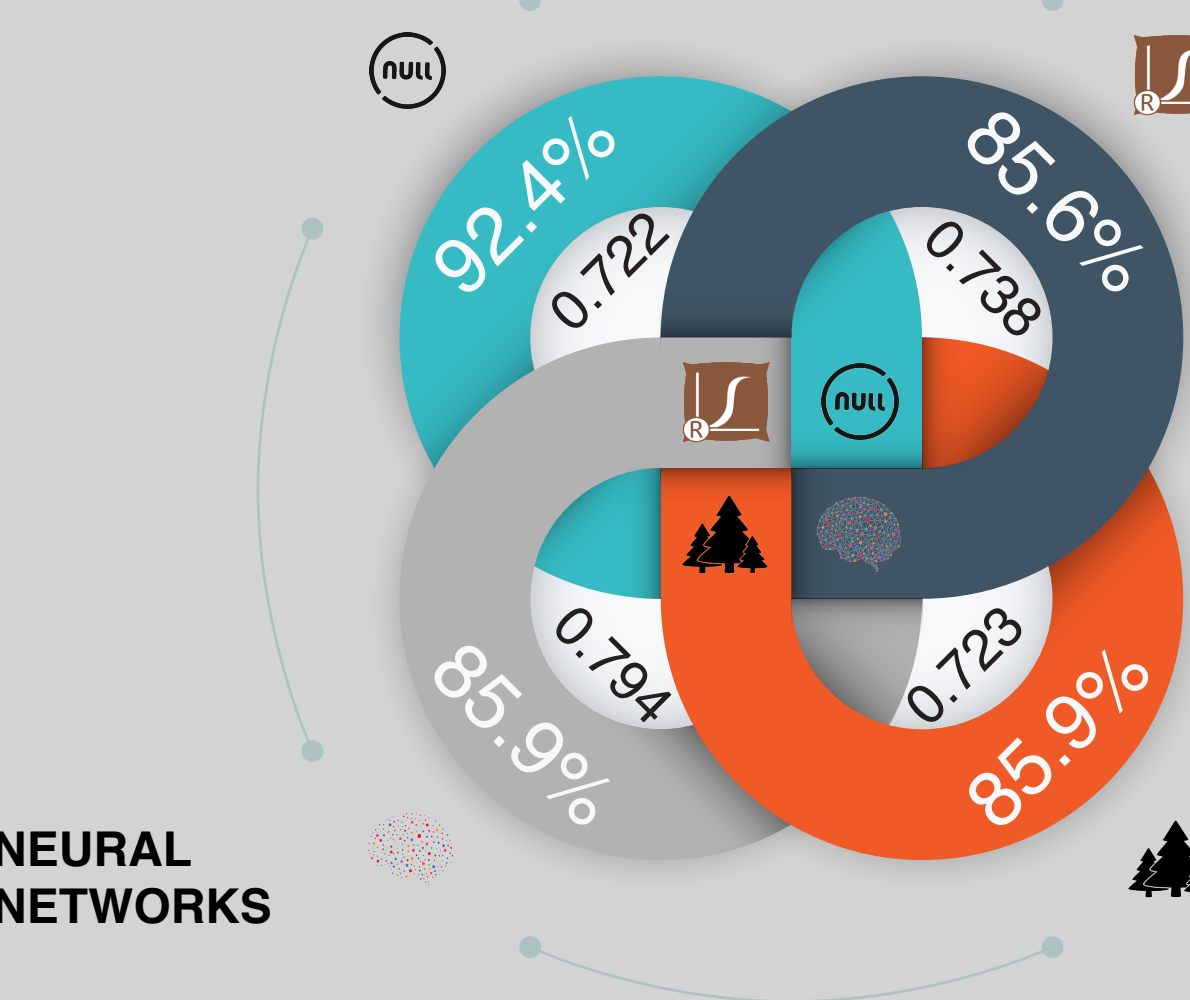


\*\* The balance observed might be a concern. Thus we also focused on AUC & not only accuracy!

# ACCURACY IMPROVEMENTS

We used different models and algorithms to predict acquisitions. In this process we found different accuracies & areas under the curve. The best performance is displayed below. Eventually we chose to combine the results of Logistic Regression with PCA & Random Forest to find the best contributing features.

## RANDOM FOREST WITH NULL VALUES



## LOGISTIC REGRESSION

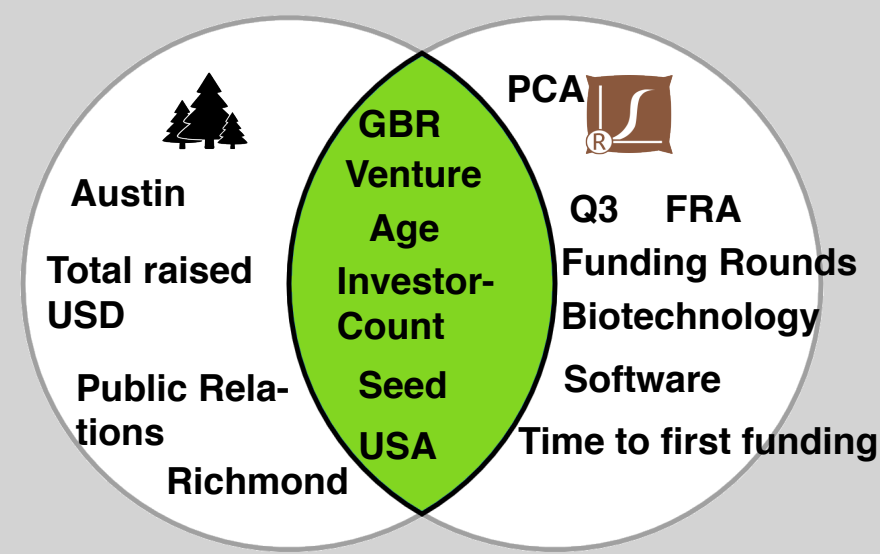


## NEURAL NETWORKS



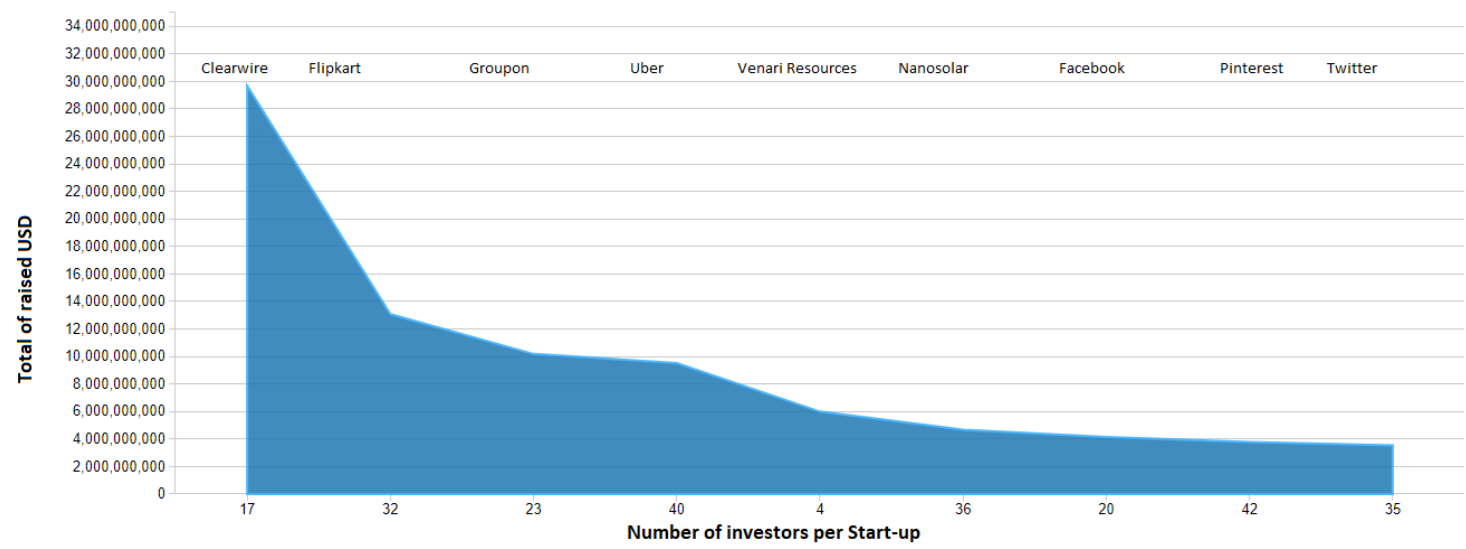
## RANDOM FOREST

FEATURE	PC-1	PC-2	PC-3
Q3	1.74E-11	0.000283819	-7.52587E-05
FRA	1.86E-11	-0.00117669	0.002562859
Software	2.24E-11	-0.00115355	0.002421146
numeric_time_to_first_fund	2.25E-11	-0.788022422	-0.52650934
seed	9.55E-11	-0.003261288	0.008146963
Biotechnology	-2.76E-11	0.001230917	-0.003046385
venture	-6.54E-11	0.004175266	-0.009528042
GBR	-9.18E-11	0.005716466	-0.013011638
USA	-7.49E-11	0.005795564	-0.013348459
numeric_count_investor	-4.14E-09	0.017208184	-0.517671104
Software	2.24E-11	-0.00115355	0.00242115
FRA	1.86E-11	-0.00117669	0.00256286
seed	9.55E-11	-0.003261288	0.00814696
numeric_age	-7.19E-10	-0.432248567	0.36404787
numeric_funding_rounds	-8.82E-10	-0.43792418	0.56719212

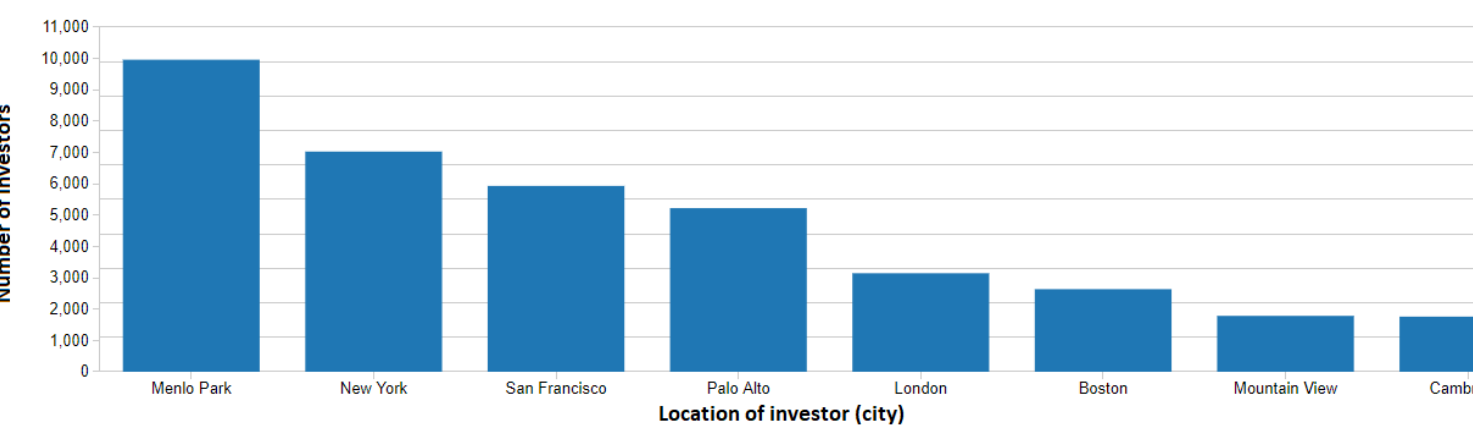
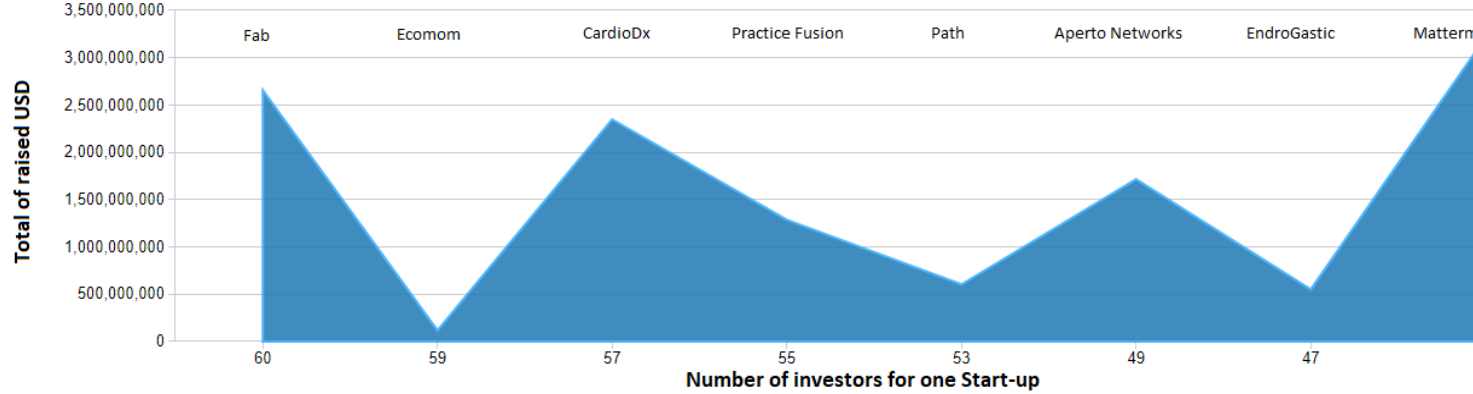


# VISUALIZATIONS & FINDINGS

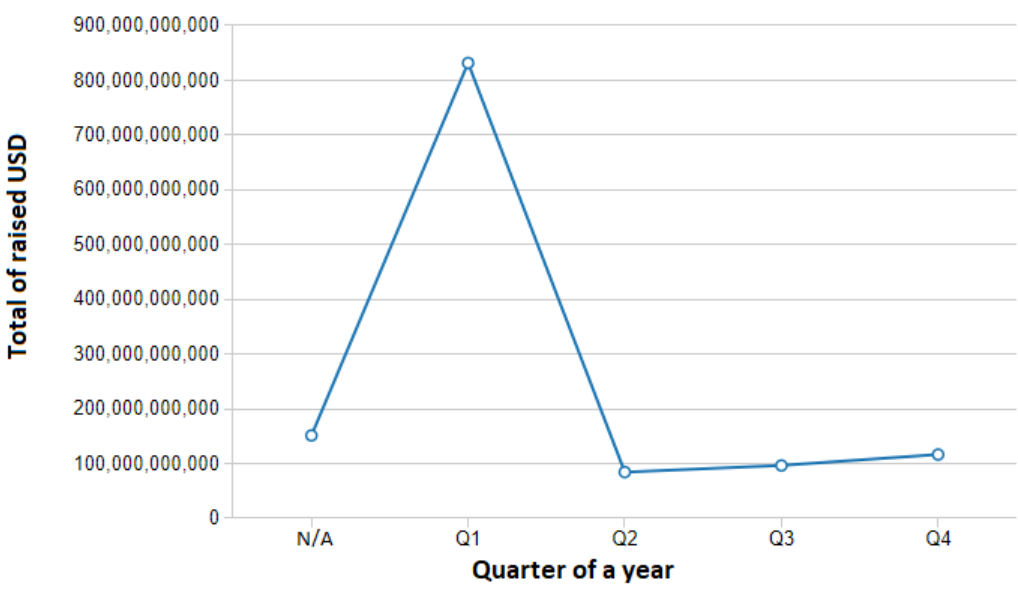
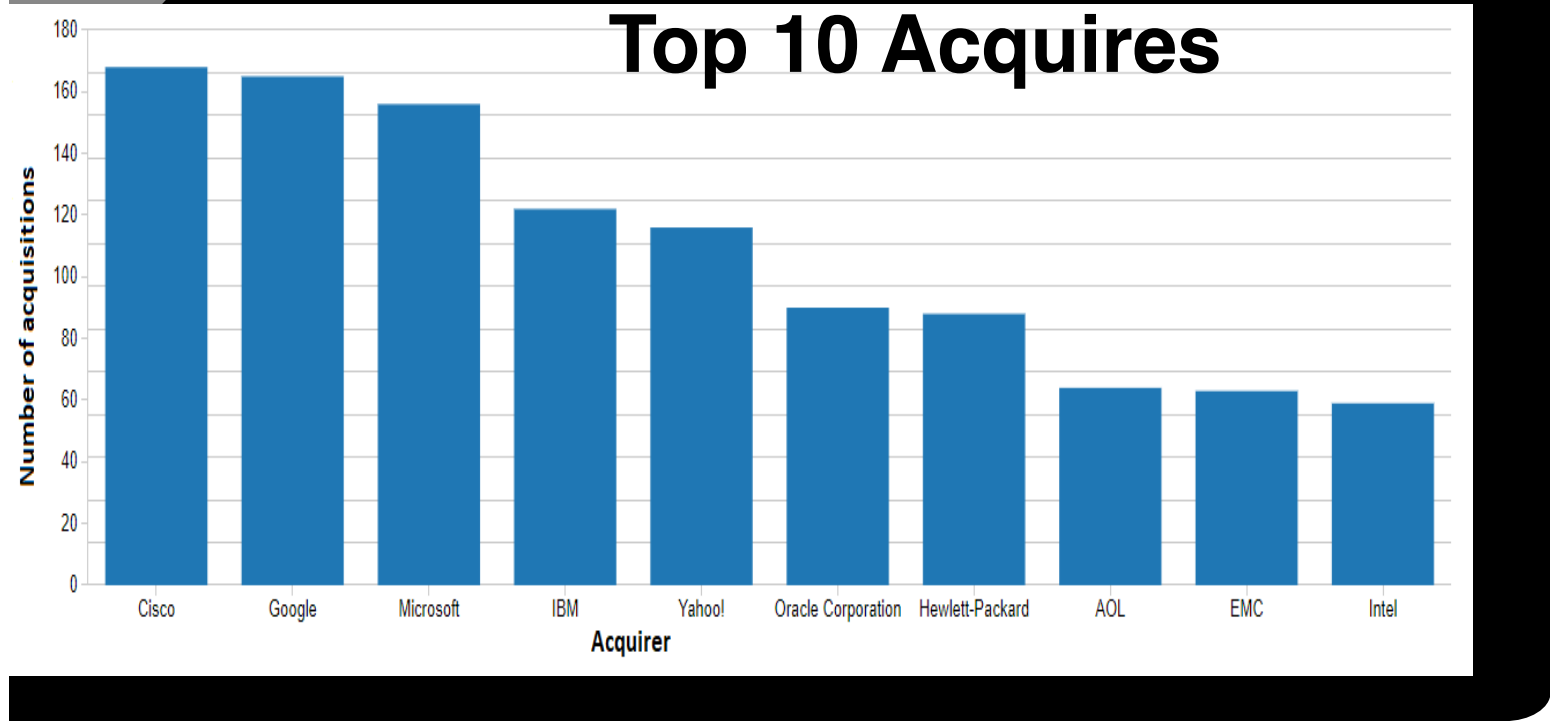
Highest number of investors does not mean highest raise of USD  
Fab has with 60 investors the maximum number of investors per company



Clearwire raised with 17 investors more than any other company  
The number of raised number varies over the number of investors per company



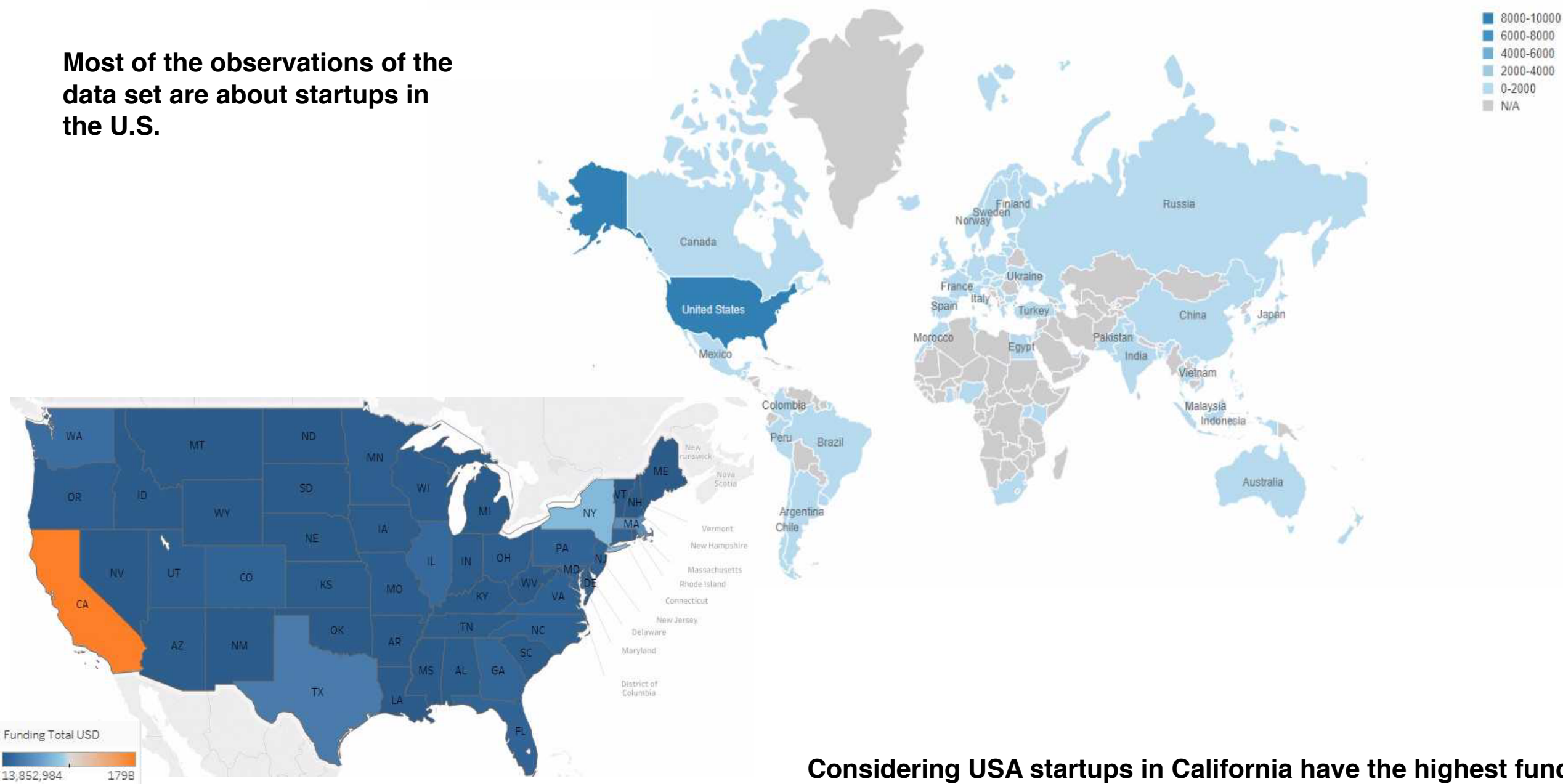
Startups find the most investors in Menlo Park, New York or San Francisco  
In Europe, London is the capital of investors



\* According to the data, during Q1 of a year companies raise most money

# GEOGRAPHIC DISTRIBUTION

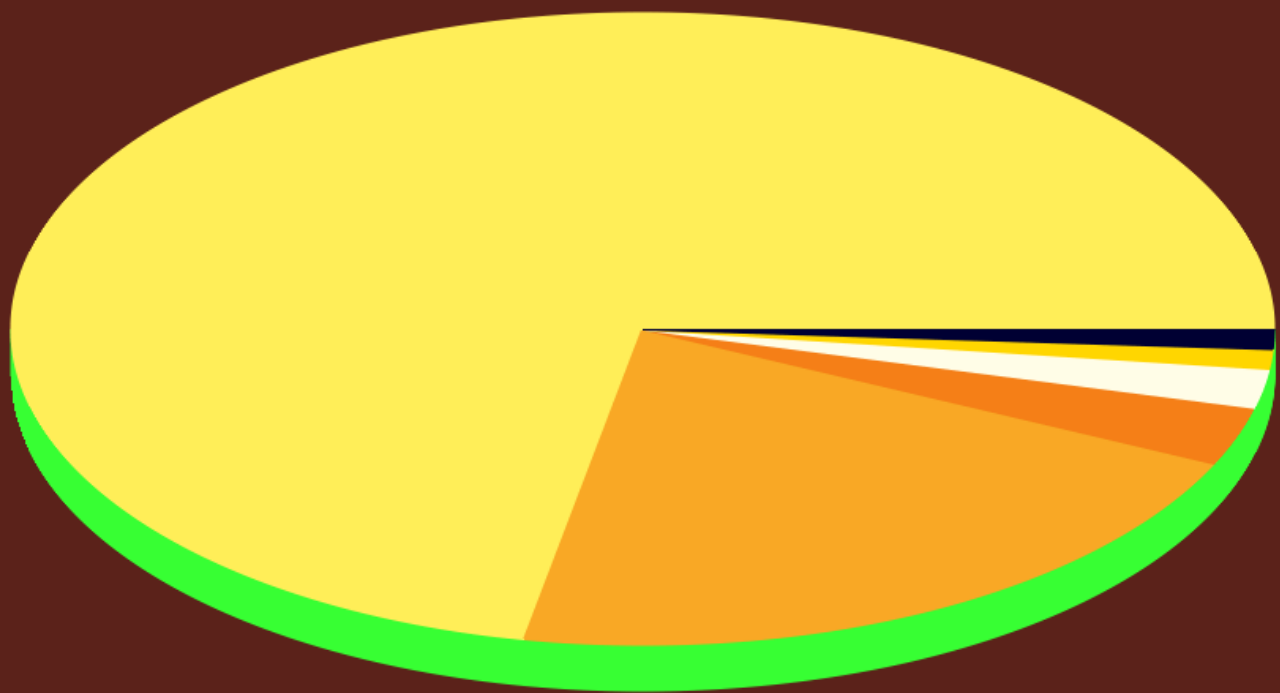
Most of the observations of the data set are about startups in the U.S.



Considering USA startups in California have the highest funding  
Washington, New York and Texas witness a decent amount

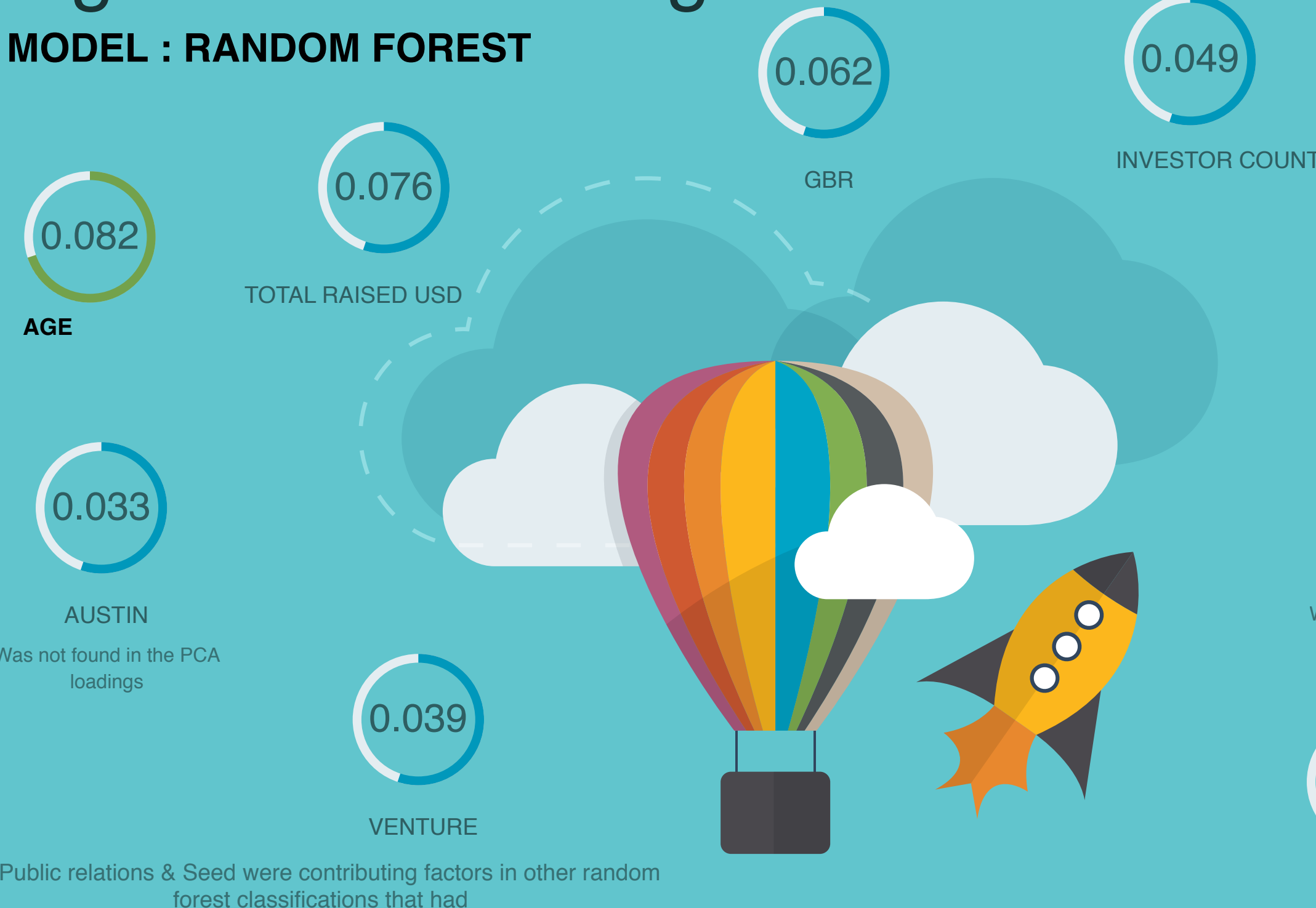
# Funding Types

72 % VENTURE  
21 % SEED  
3 % ANGEL  
3 % PRIVATE EQUITY  
1 % UNDISCLOSED  
1 % OTHER



# Highest Contributing Factors

MODEL : RANDOM FOREST



\*\*Public relations & Seed were contributing factors in other random forest classifications that had