#### Investigating the Education Consultancy Business

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DSI 13

# Agenda

## Agenda

- Problem Statement
- Data
- Modelling
- Discussion
- Limitations
- Questions

## Problem Statement

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# How much do I sell for?

Every business owner ever

## Problem Statement

The real one.

#### GeBiz

- One-stop G2B Procurement
- Transparency
- Fair and Open Competition
- Value for Money

#### Education Consultancies

- Pricing
- Business Development

# Data

#### Data

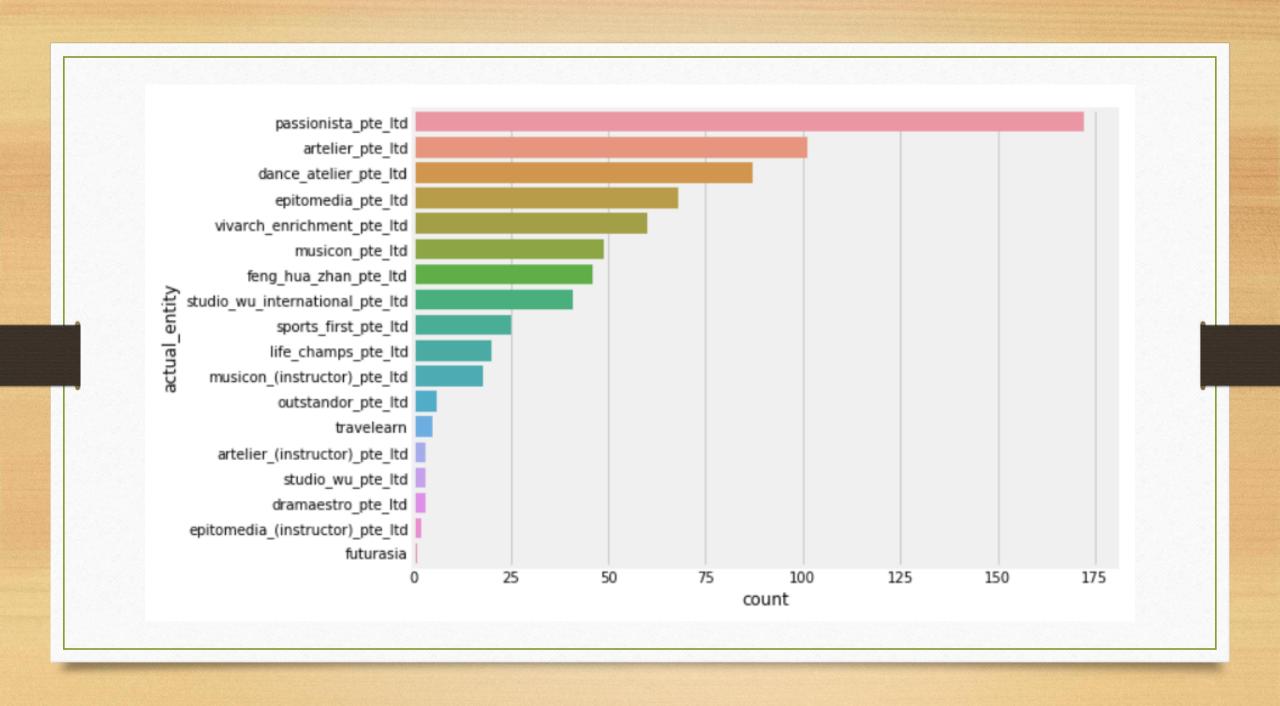
#### 2018 Sales Data

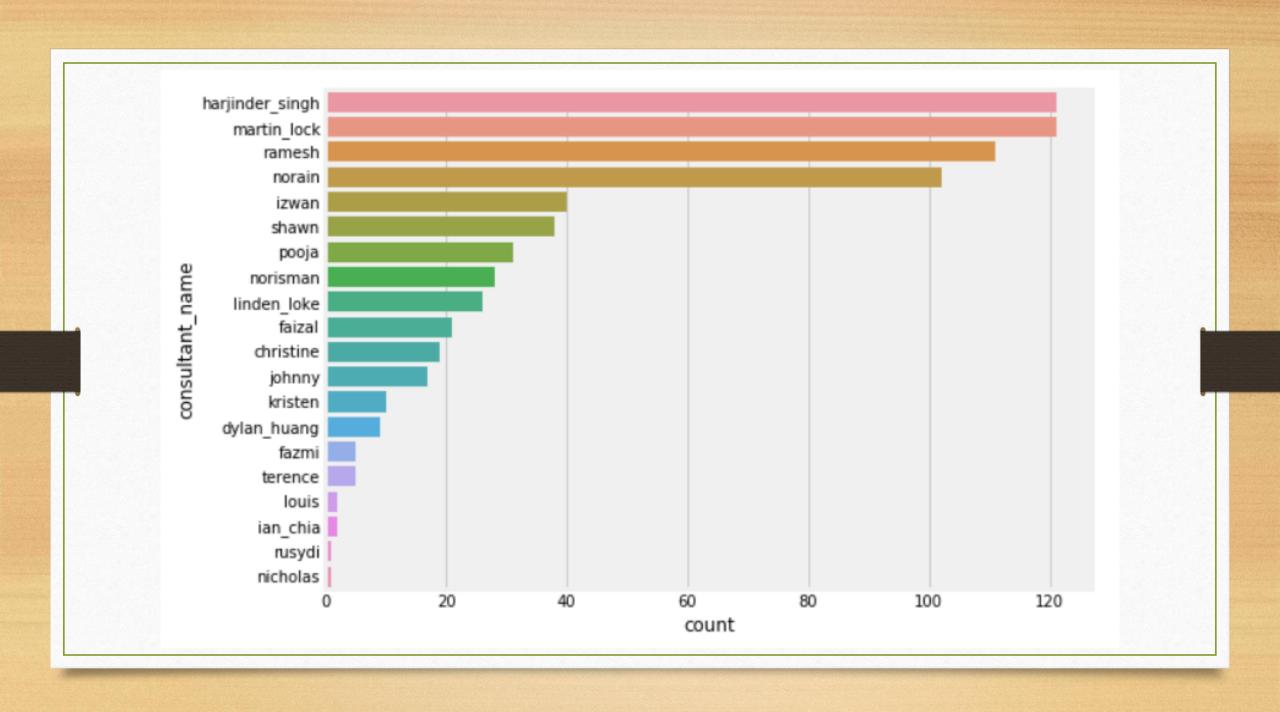
- Business Entities
- Consultants
- Zones
- UOM

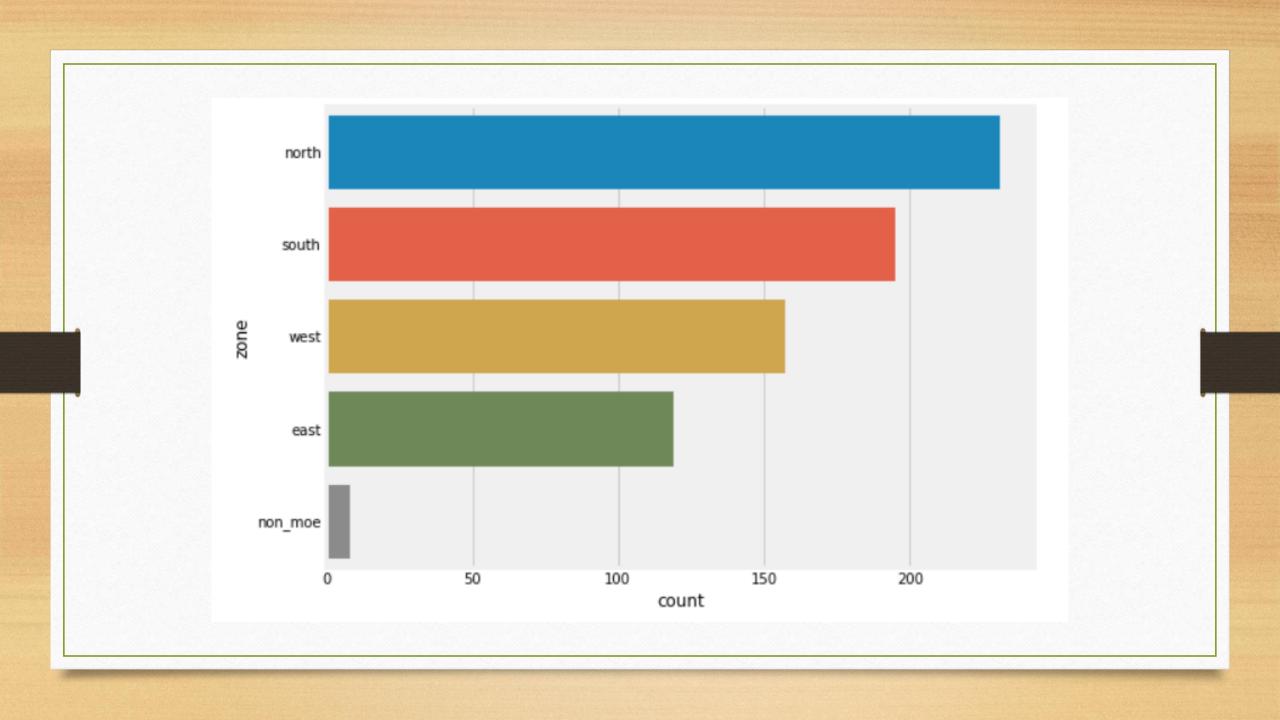
#### 2019 Sales Data

- Business Entities
- Consultants
- Zones
- UOM

# EDA







# Modelling

Objective 1

### Models

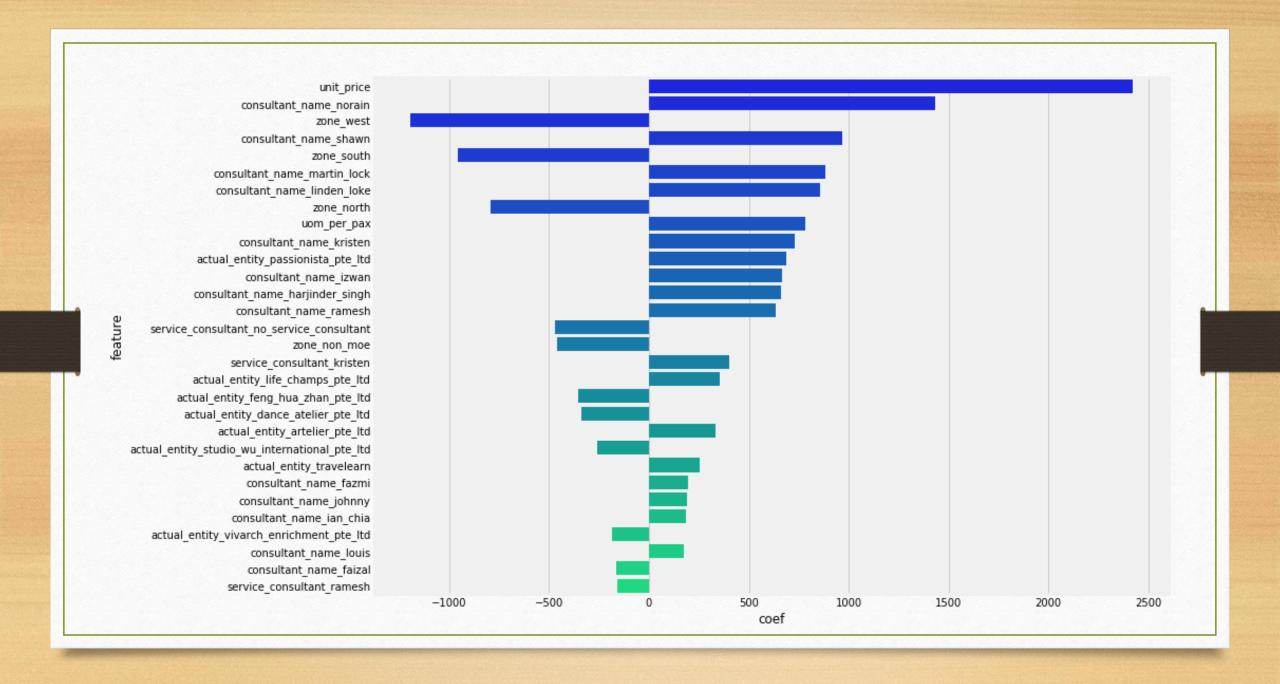
#### **Linear Regression**

- Ridge
- Lasso
- Elastic Net

#### Split Into:

- All Features
- Business Units
- Consultants
- Zones

|                            | R <sup>2</sup> Score (Train) | R <sup>2</sup> Score (Validation) | RMSE (Train) | RMSE (Validation) |
|----------------------------|------------------------------|-----------------------------------|--------------|-------------------|
| Baseline (All Features)    | 0.489088                     | 0.562626                          | 3388.069290  | 3357.637086       |
| Lasso (All Features)       | 0.452751                     | 0.552987                          | 3506.484458  | 3394.430364       |
| Ridge (All Features)       | 0.480780                     | 0.563607                          | 3415.504590  | 3353.866434       |
| Elastic Net (All Features) | 0.255492                     | 0.280693                          | 4089.912316  | 4305.903271       |
| Baseline (Entity)          | 0.119470                     | 0.051100                          | 4447.863007  | 4945.580090       |
| Lasso (Entity)             | 0.112078                     | 0.056427                          | 4466.492811  | 4931.679422       |
| Ridge (Entity)             | 0.119282                     | 0.050539                          | 4448.337114  | 4947.042968       |
| Elastic Net (Entity)       | 0.090943                     | 0.051438                          | 4519.339756  | 4944.699843       |
| Baseline (Consultant)      | 0.132197                     | 0.135346                          | 4415.601806  | 4720.936564       |
| Lasso (Consultant)         | 0.132130                     | 0.135687                          | 4415.773527  | 4720.006020       |
| Ridge (Consultant)         | 0.132105                     | 0.134826                          | 4415.837144  | 4722.356910       |
| Elastic Net (Consultant)   | 0.086963                     | 0.060551                          | 4529.220591  | 4920.889870       |
| Baseline (Zone)            | 0.050958                     | 0.002728                          | 4617.660689  | 5070.068002       |
| Lasso (Zone)               | 0.050123                     | 0.010510                          | 4619.692256  | 5050.248789       |
| Ridge (Zone)               | 0.050905                     | 0.005380                          | 4617.790087  | 5063.323554       |
| Elastic Net (Zone)         | 0.037834                     | 0.021018                          | 4649.478797  | 5023.360621       |



# Modelling

Objective 2

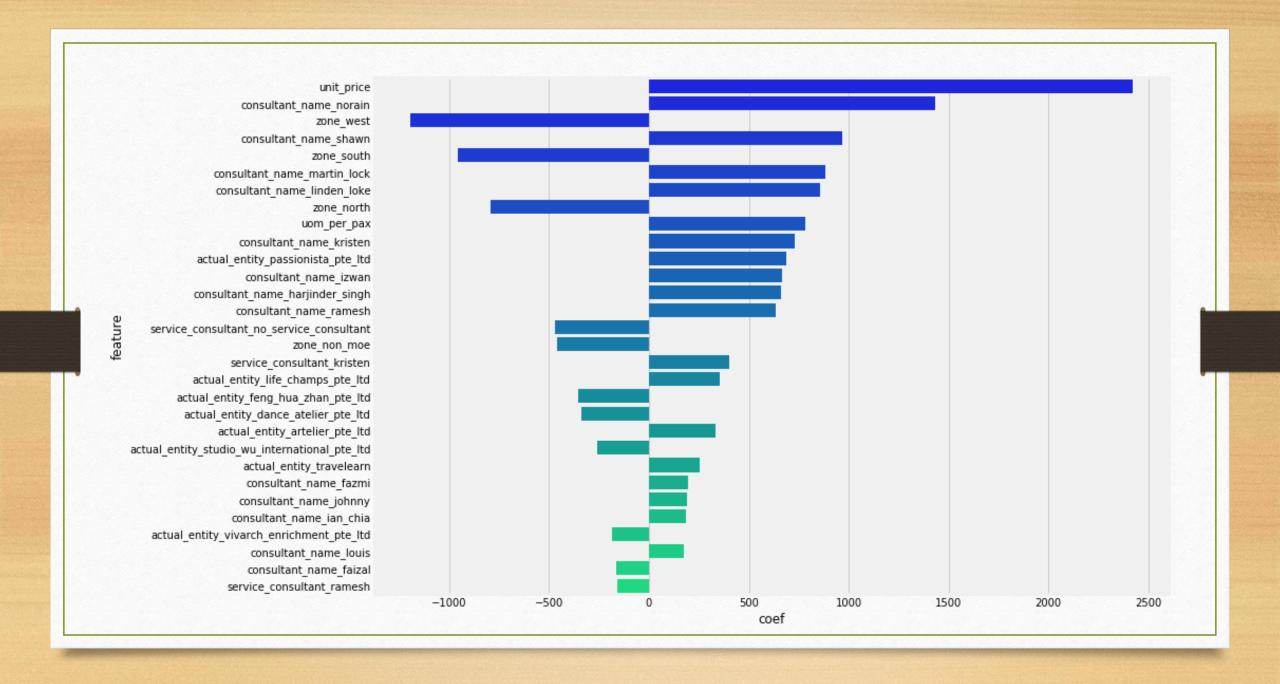
|                                     | R <sup>2</sup> Score (Train) | R <sup>2</sup> Score (Validation) | RMSE (Train) | RMSE (Validation) |
|-------------------------------------|------------------------------|-----------------------------------|--------------|-------------------|
| Optimised Ridge                     | 0.480780                     | 0.563607                          | 3415.504590  | 3353.866434       |
| Decision Tree Regressor             | 0.701613                     | 0.579496                          | 2589.221795  | 3292.243260       |
| Random Forest Regressor             | 0.798746                     | 0.666979                          | 2126.431973  | 2929.834953       |
| Support Vector Regressor            | 0.411421                     | 0.486549                          | 3636.485453  | 3637.947090       |
| AdaBoost (Decision Tree Regressors) | 0.925296                     | 0.647073                          | 1295.537461  | 3016.125130       |
| AdaBoost (Random Forest Regressors) | 0.920516                     | 0.654208                          | 1336.347576  | 2985.482482       |
| Gradient Boosting Regressor         | 0.857589                     | 0.666774                          | 1788.755612  | 2930.733040       |
| Extreme Gradient Boosting Regressor | 0.840017                     | 0.670740                          | 1895.904214  | 2913.242730       |

## Discussion

### Business Implications

#### Objective 1

- Per Pax
- Lagging Entities
- Align Pricing Strategies



### Business Implications

#### Objective 1

- Per Pax
- Lagging Entities
- Align Pricing Strategies

#### Objective 2

 Modest guide for <u>high-value</u> programmes only

## Future Directions

Yup, limitations here too.

#### Future Directions

- Small Dataset: Get more data
- Limited Tuning: AWS
- Differentiating UOM

# Questions