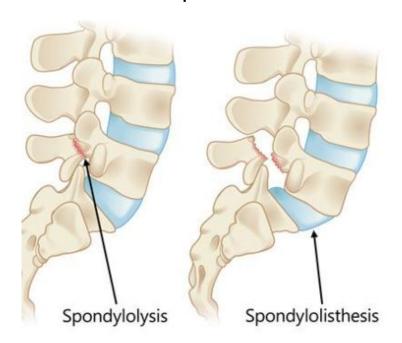
Springboard Capstone 1

~~~Data Science Career Track~~~ Biomechanical Features of Orthopedic Patients

CLASSIFICATION of Spondylolisthesis

## Painful lumbar (back) issues are primarily diagnosed on x-ray results

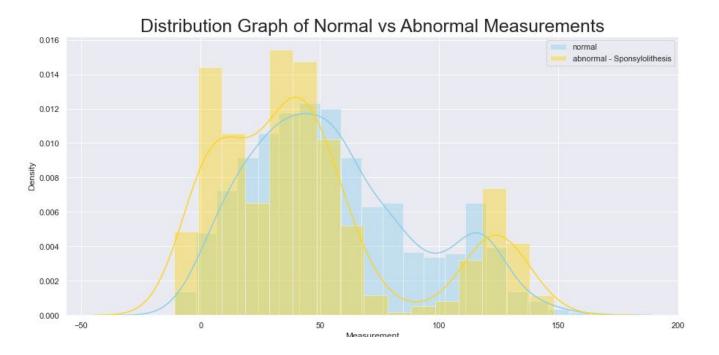
#### The problem is - Not all issues are as obvious as seen below





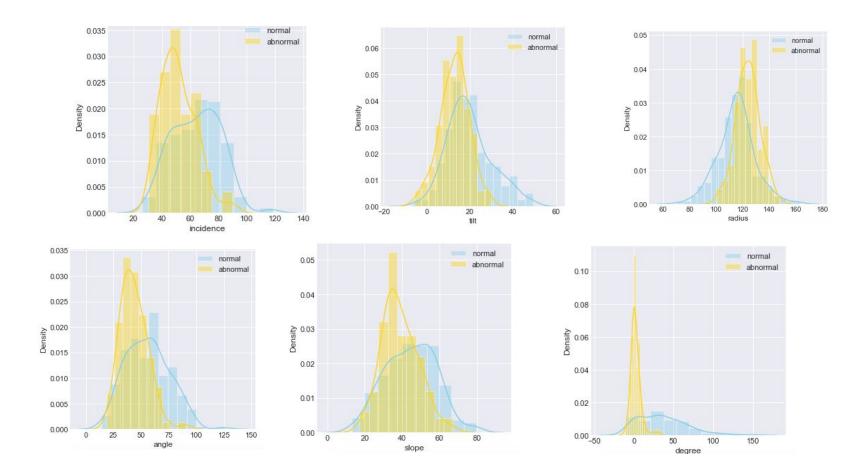
Reproduced from Cavalier R, Herman MJ, Cheung EV, Pizzutillo, PD: Spondylolysis and spondylolisthesis in children and adolescents: I. diagnosis, natural history, and nonsurgical management J Am Acad Orthop Surg 2006; 14: 417-424

#### Abnormal measurements overlap Normal measurements.



It appears the high-bills you've paid for radiology results may have been well earned.

#### Proper diagnosis requires comparison of several features - simultaneously



The physician bears the stress to simultaneously compare multiple measurements.

| class    | degree_spondylolisthesis | pelvic_radius | sacral_slope | lumbar_lordosis_angle | pelvic_tilt numeric | pelvic_incidence |
|----------|--------------------------|---------------|--------------|-----------------------|---------------------|------------------|
| Abnormal | -0.254400                | 98.672917     | 40.475232    | 39.609117             | 22.552586           | 63.027818        |
| Abnormal | 4.564259                 | 114.405425    | 28.995960    | 25.015378             | 10.060991           | 39.056951        |
| Abnormal | -3.530317                | 105.985135    | 46.613539    | 50.092194             | 22.218482           | 68.832021        |
| Abnormal | 11.211523                | 101.868495    | 44.644130    | 44.311238             | 24.652878           | 69.297008        |
| Abnormal | 7.918501                 | 108.168725    | 40.060784    | 28.317406             | 9.652075            | 49.712859        |

Machines are perfectly suited to assist.

# Project: Classification of Spondylolisthesis

#### Problem:

Diagnosis requires simultaneous comparison of multiple features.

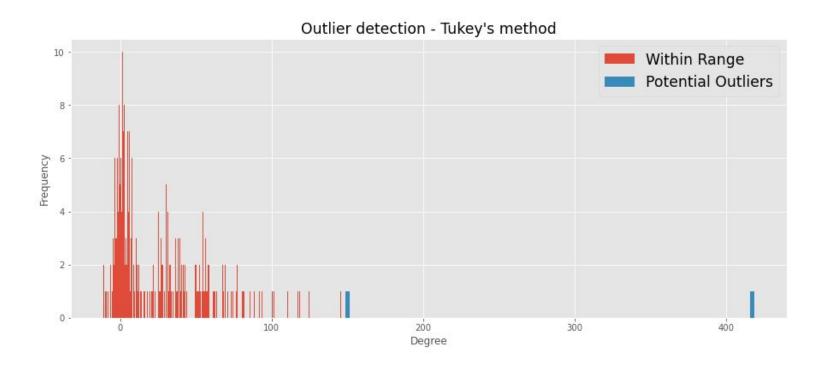
#### Solution:

Machine learning quickly classifies and sorts saving time and improving accuracy.

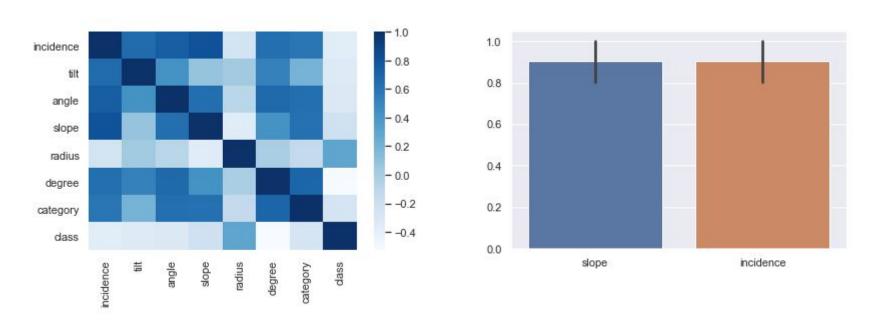
## The Data

'Tukey's' algorithm was used to locate *potential* outliers.

1 outlier (410) was >2 times as large as the next data point (150) - it was removed.

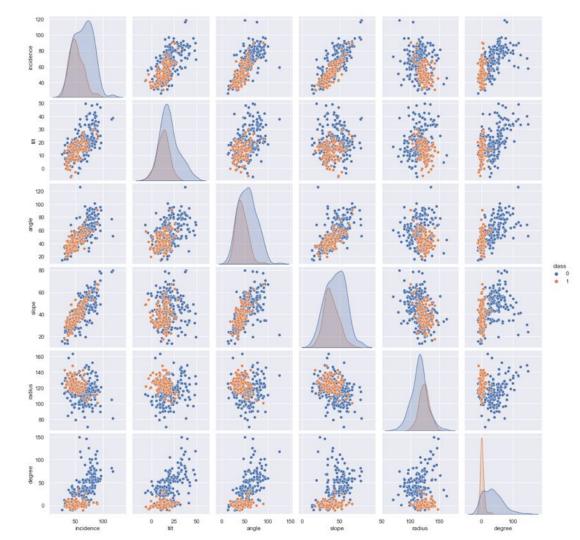


#### Correlations plotted to look for overly-correlated features



'slope' and 'incidence' were highly correlated, close to the 90% cut-off range.

A correlation module ran to remove overly-correlated features (>90%). All passed, none removed.



## Correlations of features

Comparing the separation between "Normal" (orange) and "Abnormal" (blue).....

suggests that added weight might be useful on 'degree' and 'radius' to improve the model.

## The Models

4 Models were used

- Logistic Regression
- Guassian Naive Bayes
- KNearest Neighbors
- Random Forest

# Logistic Regression & The Base

A basic Logistic Regression was used to determine the base accuracy of 0.87

Additional tuning of C parameter using GridSearch did not change the results

# Gaussian Naive Bayes

Due to the bi-model and right-skewed normal shape of some features - a Gaussian NB was tested with results less than the base

# KN Neighbors

KN Neighbors returned the same accuracy after tuning the n\_neighbors to =10

Tuning of parameters: algorithm, leaf\_size, metric, metric\_params did not improve accuracy.

## Random Forest

Random Forest provided improved results of 88% once the n\_estimator and random\_state were tuned in tandom.

A module was created to loop through a range of values, by plotting the results we see the optimal values.

