

# MSE491: Application of Machine Learning in Mechatronic Systems

## Skewed Classes & Debugging A ML Algorithm

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# What is an accurate model in Machine Learning?

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- The most challenging question in developing a machine learning model is that “how to get the most accurate model?”

Taken from [www.analyticsvidhya.com](http://www.analyticsvidhya.com)

# What is Skewed Classes?

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- **Skewed classes** or **Skewed dataset** is referring to a dataset when difference between the numbers of examples belonging to each class is large. This leads to some difficulties for a learning system to learn the concept related to the minority class.
- Let's learn Skewed classes with a simple Example:
  - Statistical information have shown that less than 0.5% of the population get a specific cancer. That means if we close our eyes and say nobody got that type of cancer, it has 99.5% accuracy.
  - Now, consider that a classification algorithm has been developed for cancer detection. The obtained results have shown that the trained model accuracy is 99.1%!!

$$accuracy = \frac{TP+TN}{TP+FN+TN+FP}$$

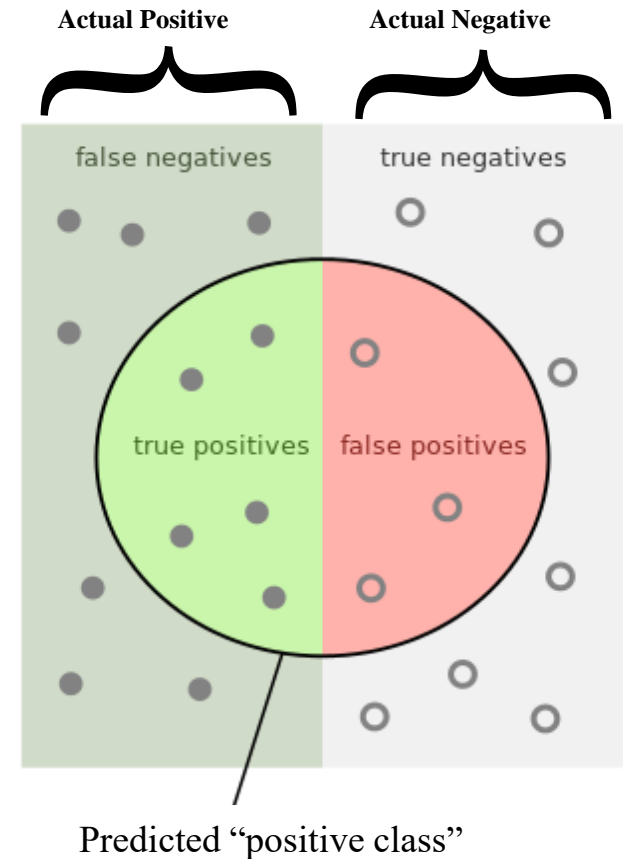
**Conclusion:** Without a diagnostic tool (just closing our eyes) the prediction accuracy is higher!!!

Taken from [www.analyticsvidhya.com](http://www.analyticsvidhya.com)

# Confusion Matrix

- Consider a binary dataset with “positive” and “negative” classes.
- Assume that using a classifier (a ML algorithm) a class is predicted, say “positive class”.

Predicted	Actual	



Taken from [www.wikipedia.org](http://www.wikipedia.org)

# Confusion Matrix

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- $accuracy = \frac{TP+TN}{TP+FN+TN+FP}$

- $Precision = \frac{TP}{TP+FP} = \frac{\text{green semi-circle}}{\text{green and red semi-circle}}$  *TP + FP is all predicted positive*

- $Recall(sensitivity) = \frac{TP}{TP+FN} = \frac{\text{green semi-circle}}{\text{green semi-circle and green square}}$  *TP + FN is all actual positive*

- $Specificity = \frac{TN}{TP+FP}$

Taken from [www.analyticsvidhya.com](http://www.analyticsvidhya.com)

# F1 score

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- F1 score is a function of *Precision* and *Recall*
- The F1 score tries to give more weight to false negatives and false positives when there is an uneven class distribution (large number of actual negative)
- It makes a balance between Precision and Recall

$$F_1 = 2 * \frac{Precision * Recall}{Precision + Recall}$$

# Debugging A ML Algorithm

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- Suppose that a regularized algorithm is trained, and the resulting model has remarkable error in detection (prediction). We need to modify the model by following steps:

# Debugging A ML Algorithm

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- Choosing the degree of polynomial in a model:

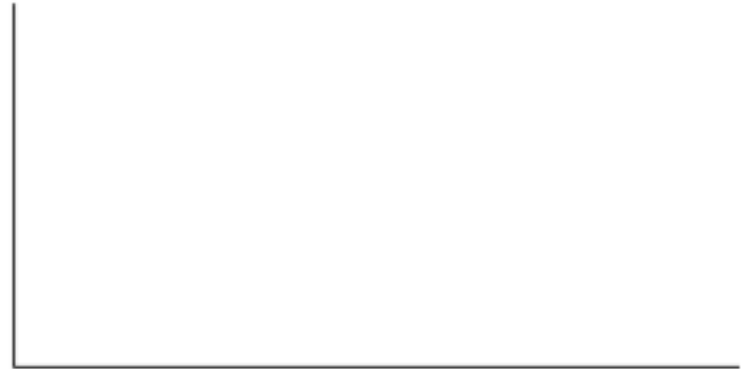




# Debugging A ML Algorithm

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- Choosing the regularization parameter in the cost function:



# Learning Curves

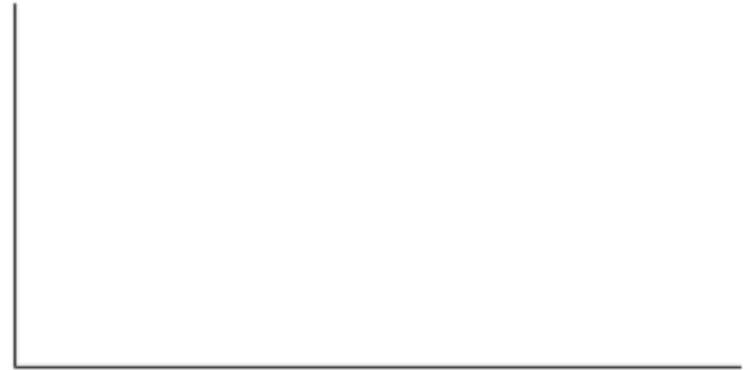
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- Learning curves are plots of a cost function changes (error changes) as the training set size increases.
- It is diagnostic tool in machine learning for the evaluation of a trained model.

# Learning Curves

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- Learning curves show how error for training dataset and validation dataset change as the training set size increases.



# Learning Curves

- It is diagnostic tool in machine learning for algorithms that learn from a training dataset.
- A model is evaluated by calculating the error on the training dataset and a validation dataset after each update (increase the number of training samples) during training.

