Data Science and Big Data Curriculum

Introduction (1.5hrs):

- What is Data Science?
- What is Big Data?
- What is Machine Learning?
- What is Analytics?
- What is Data analysis and Data Mining?
- Analytics project life cycle
- Real life applications, projects and career paths of Data Science and Big Data

• Statistics:

- > Definition and computation of probability
- ➤ Measurement of central tendencies and it's applications
- > Spreads, Distributions(Normal, Z-distribution, Binomial, Poisson) and various types of probability distributions(Continuous and discrete)
- Sampling and Sampling distributions
- ➤ Measures of shape(Skewness and Kurtosis)
- ➤ Measures of relationship between variables(Correlation, causation)
- Hypothesis Testing(t-test, Chi-square, Anova)
- ➤ Measures of Dispersion(Variance, Std. deviation, Range)
- Prediction and Confidence interval-Computation and Analysis
- Missing Value theorem

• Exploratory Data Analysis(EDA) and Data Visualization

- ➤ What is EDA and why is it required?
- ➤ Outlier treatment
- > Data distributions and transformations
- ➤ Graphs
- ➤ Bar charts
- ➤ Histogram
- ➤ Box-Whisker plot
- ➤ Scatter plot
- ➤ Variable selection
- ➤ Bubble charts
- > Exam

Introduction to R:

- ➤ Why R and importance of R in Analytics?
- ➤ Installation of R and R-studio
- ➤ Data types
- ➤ Variables
- ➤ Operators
- Decision making
- ➤ Loops
- ➤ Lists
- > Vectors
- ➤ Strings
- ➤ Matrices
- ➤ Arrays
- > Factors
- Functions (Built in and User defined functions)(aggregate,subset,merge,lapply, sapply, as.xxxx, which,sort,ordermandatory)
- > Importing Data from texts , spreadsheets and webdata
- > Extracting Tweets from Twitter using API
- ➤ Data frames
- Packages , libraries and their installation
- Data manipulation and re-shaping
- Data Visualization using R
- > Exam

Introduction to Python programming:

- ➤ What is Python?
- ➤ History
- ➤ Why is Python preferred for Data Science?
- ➤ Installation of I python/Jupyter Notebook/ SPYDER

• Basics of Python:

- > Keywords
- > Built-in functions
- > String Formatting
- ➤ Lists
- ➤ Loops
- ➤ Tuples
- ➤ Indexing
- > Slicing
- > Sequences
- > Dictionaries
- > Sets
- ➤ Importing and exporting data from python into various formats

Functions

- ➤ User defined functions
- ➤ Parameters
- > Nested functions
- > Local and Global variables
- ➤ Alternate Keys
- > Lambda functions
- Sorting Lists and Dictionaries
- ➤ Sorting Collections

Error and Exception handling

- ➤ Errors in Python
- > Abnormal termination
- Exception handling methods
- > Ignoring Errors
- Assertions and effective usage of assertions

OOPS, Packages and Libraries in Python

- Methods and Inheritance
- Abstraction and Encapsulation
- ➤ Classes
- ➤ Walking Directory Trees
- ➤ Initializes
- ➤ Instance methods
- ➤ Class methods
- ➤ Data Static Methods
- Expressions
- ➤ Module Aliases
- ➤ Math functions
- ➤ Random Numbers
- Package Installation Methods
- ➤ Introduction to Numpy, Pandas and other libraries
- ➤ Plotting in Python
- Creating Data Frames
- ➤ Data Manipulation
- > Slicing and Dicing

Machine Learning

• Supervised Learning:

- ➤ What is supervised learning
- ➤ Algorithms in Supervised learning
- Steps in Supervised learning

√ Regression & Classification :

- ➤ Regression vs classification
- ➤ Computation of co-relation coefficient and Analysis
- > Performance and accuracy measurement of a Model
- Naive Baye's classifier
- Model Training, Validation and Testing
- ➤ Ordinary Least squares

- > Variable selection
- ➤ R-Square coefficient and RMSE as a strength of model
- Prediction and confidence interval determination and application
- ➤ Proviso of Regression
- Dummy variables
- > Types of Regression: Linear and Logistic(Simple and multiple)
- > Sum of least squares
- > ROC and AUC curves
- Homoscedasticity and Heteroscedasticity
- ➤ Multicollinearity and vif
- > Confusion matrix
- ➤ Techniques to improve accuracy and performance of regression models
- ➤ Assignment

> Decision Trees and Random Forest Test

- ➤ Introduction to Decision tree Algorithms and it's applications
- Classification and regression trees-CART models,ID3,C4.5
- CHAID analysis
- ➤ Building Decision Trees using R
- Decision nodes and leaf nodes
- Variable Selection, Parent and child nodes branching
- Stopping Criterion
- ➤ Tree pruning
- Depth of a tree
- ➤ Overfitting
- ➤ Metrics for decision trees-Gini impurity, Information Gain, Variance Reduction
- ➤ Regression using decision tree
- ➤ Interpretation of a decision tree using If-else
- > Pros and cons of a decision tree
- ➤ Introduction to Random forest test and it's applications

- ➤ Why Random forest test?
- ➤ Tree bagging
- ➤ Models and algorithms in Random Forest test
- ➤ Training Data set, Tree grouping and decision making on majority voting
- ➤ Boosting algorithms-Gradient Boosting, Adaptive boosting-Adaboost, Xgboost (Advanced)
- ➤ Accuracy estimation using cross validation

> KNN-algorithm:

- > What is KNN and why do we use it?
- > KNN-algorithm and regression
- ➤ Curse of dimensionality and brief introduction to dimension reduction
- KNN-outlier treatment and anomaly detection
- ➤ Cross Validation
- > Pros and cons of KNN

➤ Support Vector Machines

- ➤ Linear and Non-Linear SVM's
- > SVM regression
- ➤ Train time and Run time complexities
- > Kernel Methods

Unsupervised Learning:

- ➤ What is unsupervised learning?
- > Algorithms in unsupervised learning
- Steps in unsupervised learning

• Dimensionality Reduction:

- > Introduction to dimensionality reduction and it's necessity
- Principal Component Analysis(PCA)
- Singular Value Decomposition(SVD)
- > Kernel-PCA
- ➤ Linear Discriminant Analysis
- > Feature extraction
- ➤ Advantages and applications of Dimensionality reduction

Clustering

- > Introduction to clustering
- > Real-life applications of clustering
- > Distance measurement methods
- > Hierarchical clustering
- ➤ K-Means clustering and skew plot
- > Assignment

Text Mining

- ➤ Introduction to Text Mining
- > Applications
- > Structured and unstructured data
- > Extracting unstructured text from files and websites
- Data cleaning and reshaping
- > Terminologies in Text Mining
- > Text clustering and categorization
- > Word cloud
- N-gram charts
- ➤ Sentiment Analysis
- > Twitter Analytics
- ➤ Natural Language processing
- ➤ Assignment

Forecasting

- ➤ Introduction to forecasting
- > Applications
- > Data Manipulation and Cleaning
- ➤ Time Series
- > Time Series forecasting
- ➤ Components of Time Series-Trend, Seasonality, Randomness
- > Trend Analysis
- > Forecasting methods
- > Smoothing Methods
- ➤ Modeling Random Components
- ➤ Modeling for stationary time series
- > ETS Model
- ➤ Auto regressive Model
- ➤ Moving Average Model
- > ARIMA Model
- > ETS Model
- ➤ Anomaly Detection
- > Transformations
- ➤ Growth curve
- ➤ ARCH & GARCH Models

Association rules:

- > Introduction
- ➤ Importance of Association rules
- ➤ Metrics of rules-Lift, Support, Confidence, Conviction
- ➤ Apriority Model
- ➤ Market Basket Analysis
- ➤ Algorithm implementation and tuning
- > Applications
- ➤ Assignment