Notes by Izam

Common Steps

- > Data Collection
 - Collect data from various sources
 - Scrap data if needed

> Data Cleaning

- Handle Missing
 - Imputation (mean, median, mode, regression)
 - Remove records with missing
- o Handle Duplicate
 - Identify and delete duplicate records
- o Data transformation
 - Change data types
 - Standardization (z-score scaling)
 - Normalization (min-max scaling)
 - Logarithmic transformation

> Data Exploration

- o Summary Statistics
 - Mean, median, mode
 - Variance, standard deviation
 - quartiles
- o Data Distribution
 - Histograms
 - Density plots
 - Kernel Density Estimation
- Relations
 - Scatter plots
 - Correlation matrices
- o Grouping and aggregation
 - Pivot tables

> Data Visualisation

- Use visualization techniques
 - Scatter plot
 - Histogram
 - Box plot
 - Bar chart
 - Heatmaps
 - Line plot
 - Violine Plot
- Use Matplotlib, seaborn, and Plotly

> Outlier Detection

- o Identify outliers with Univariate, bivariate, and multivariate
 - Box plot and whisker plots
 - Z-score and IQR
 - Visualise like a violin plot or scatter
- Decide whether to treat, remove, or retain outliers

> Feature Engineering

- o Create new features based on existing features
- Standardize and normalize data if necessary
- Encode categorical variables
 - One hot or label encoding
- o Binning or discretization of continuous values

> Hypothesis Testing

- o Conduct statistical tests to confirm or reject a hypothesis
- T-test, ANOVA, chi-square
- o Correlation
 - Pearson
 - Spearman

> Dimensionally Reduction

- Use various other techniques
 - PCA
 - LDA
 - t-SNE

> Document Findings

Tell the insights in the data as a story and make it interesting

Type of Data

- > Numerical data
- > Categorical data
- > Nominal data
- > Ordinal data
- > Interval data
- > Ratio data
- > Binary data
- > Sales data
- > Geographical data
- > DICOM data
- > Time series
- > Text data
- > Image data
- > Audio data

EDA of Text Data

> Data collection and Preprocessing

- Scrap the data
- o Remove special characters, HTML tags, and other noise.
- o Tokenize the data
- o Handle issues such as missing and duplicate

> Basic Text Statistics

- o Word count, character count, sentence count
- o Average word length and sentence length
- o Examine the distribution of text length

> Word Frequency Analysis

- Create word cloud or frequency histograms
- o Identify the stop words

> Text Visualisation

- Word clouds
- o Barcharts and histogram

> N-gram Analysis

- Utilise NLP libraries such as NLTK or Spacy and extract n-grams (bigram, ...)
- Plot n-gram frequency distribution

> NER (Name Entity Recognition)

Use spacy NER models

> Topic modeling

 Apply topic modeling techniques such as Latent Dirichlet Allocation (LDA) or Non-Negative Matrix Factorization (NMF)

> Word Embeddings

- Train or use pre-trained word embedding models like Word2Vec, GloVe, or FastText.
- Visualize word embeddings using techniques like t-SNE

> Language Modeling

 Train and evaluate language models using libraries like TensorFlow, PyTorch, or Hugging Face Transformers