

# Application of Ontology-Driven NLP for the Analysis of Text

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# Motivation



Examination being the lone measure of competence in the current education system of our country, plays a decisive role in building of a student's career.

Hence, utmost care has to be taken in framing the question paper. However, setting up a good question paper for assessment is a challenging task.

Fairness, accuracy, consistency and elimination of bias are very important while selecting questions into the paper.

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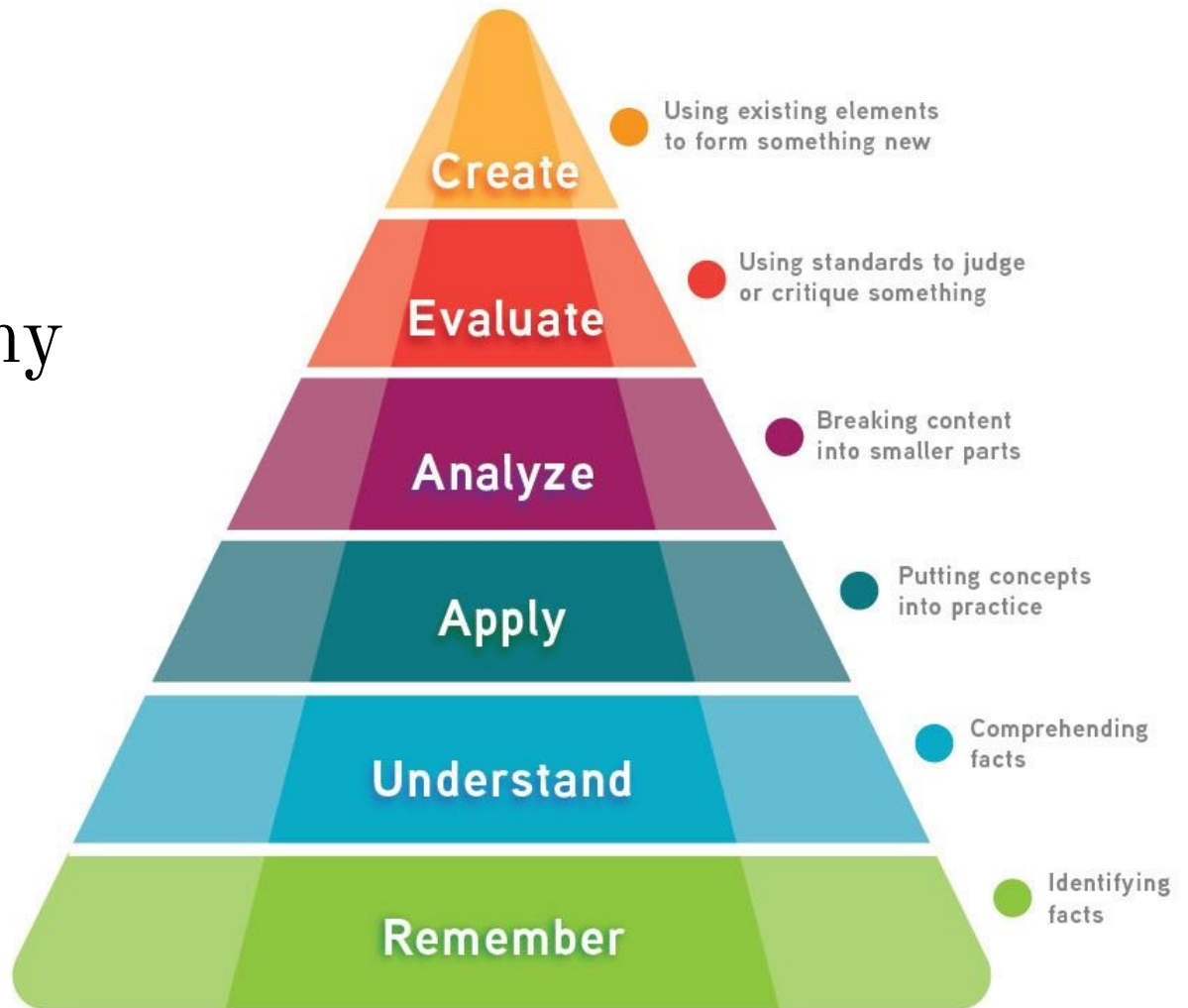
Our primary **objective** is to propose a feasible method, taking into consideration several aspects to **accurately** tackle the problem of judging syllabus **fairness**.

| Module No.   | Topics   | Hrs.      |
|--------------|--|-----------|
| 1.0          | <b>Introduction to Data Warehouse and Dimensional modelling:</b> Introduction to Strategic Information, Need for Strategic Information, Features of Data Warehouse, Data warehouses versus Data Marts, Top-down versus Bottom-up approach. Data warehouse architecture, metadata, E-R modelling versus Dimensional Modelling, Information Package Diagram, STAR schema, STAR schema keys, Snowflake Schema, Fact Constellation Schema, Factless Fact tables, Update to the dimension tables, Aggregate fact tables.  | 8         |
| 2.0          | <b>ETL Process and OLAP:</b> Major steps in ETL process, Data extraction: Techniques, Data transformation: Basic tasks, Major transformation types, Data Loading: Applying Data, OLTP Vs OLAP, OLAP definition, Dimensional Analysis, Hypercubes, OLAP operations: Drill down, Roll up, Slice, Dice and Rotation, OLAP models : MOLAP, ROLAP.  | 8         |
| 3.0          | <b>Introduction to Data Mining, Data Exploration and Preprocessing:</b> Data Mining Task Primitives, Architecture, Techniques, KDD process, Issues in Data Mining, Applications of Data Mining, Data Exploration :Types of Attributes, Statistical Description of Data, Data Visualization, Data Preprocessing: Cleaning, Integration, Reduction: Attribute subset selection, Histograms, Clustering and   | 10        |
| 4.0          | <b>Classification, Prediction and Clustering:</b> Basic Concepts, Decision Tree using Information Gain, Induction: Attribute Selection Measures, Tree pruning, Bayesian Classification: Naive Bayes, Classifier Rule - Based Classification: Using IF-THEN Rules for classification, Prediction: Simple linear regression, Multiple linear regression Model Evaluation & Selection: Accuracy and Error measures, Holdout, Random Sampling, Cross Validation, Bootstrap, Clustering: Distance Measures, Partitioning Methods ( <i>k</i> -Means, <i>k</i> -Medoids), Hierarchical Methods(Agglomerative, Divisive) | 12        |
| 5.0          | <b>Mining Frequent Patterns and Association Rules:</b> Market Basket Analysis, Frequent Item sets, Closed Item sets, and Association Rule, Frequent Pattern Mining, Efficient and Scalable Frequent Item set Mining Methods: Apriori Algorithm, Association Rule Generation, Improving the Efficiency of Apriori, FP growth, Mining frequent Itemsets using Vertical Data Format, Introduction to Mining Multilevel Association Rules and Multidimensional Association Rules   | 8         |
| 6.0          | <b>Spatial and Web Mining:</b> Spatial Data, Spatial Vs. Classical Data Mining, Spatial Data Structures, Mining Spatial Association and Co-location Patterns, Spatial Clustering Techniques: CLARANS Extension, Web Mining: Web Content Mining, Web Structure Mining, Web Usage mining, Applications of Web Mining   | 6         |
| <b>Total</b> |  | <b>52</b> |

# Fairness

What makes a question paper fair?

# Bloom's Taxonomy

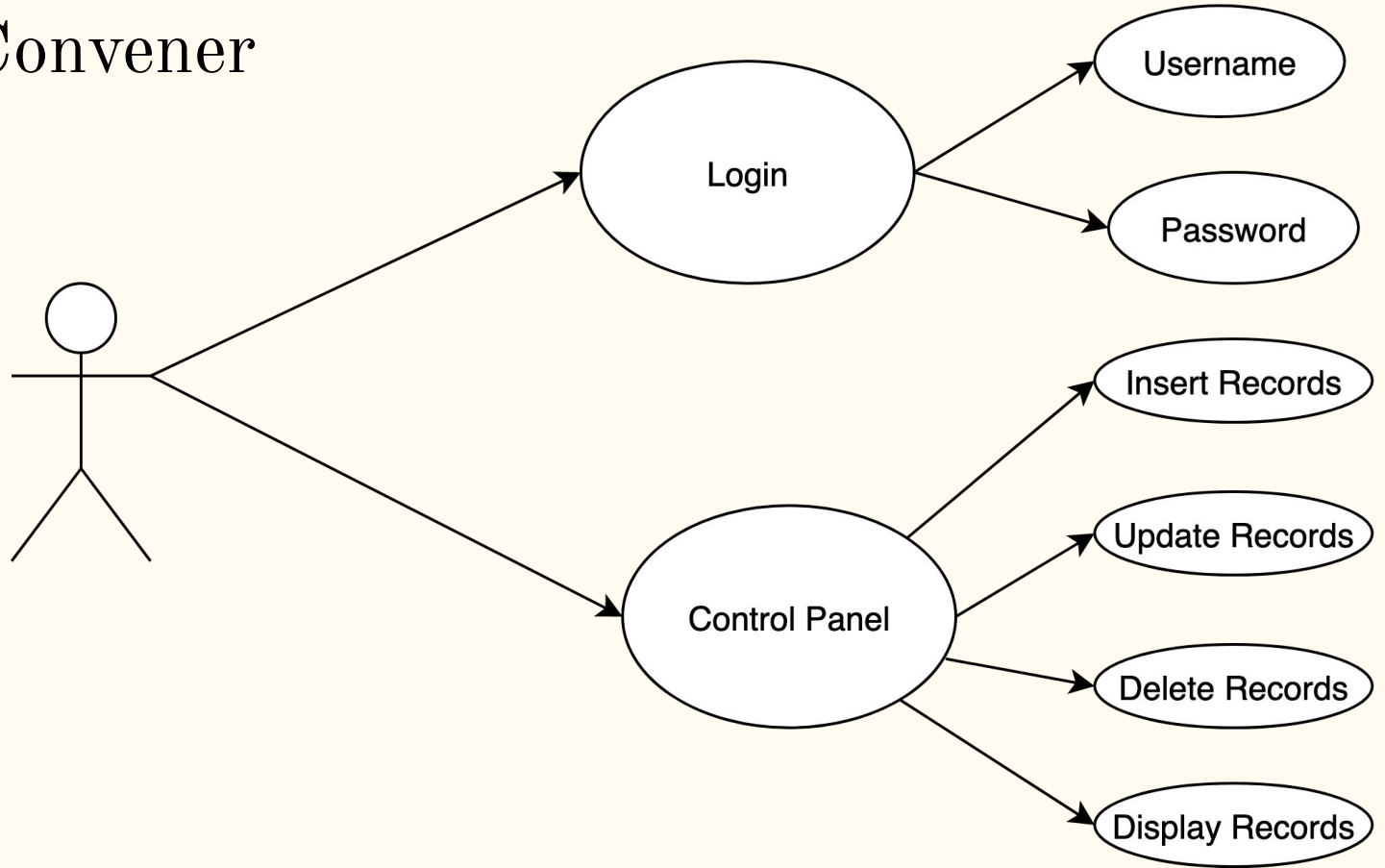


# Solution

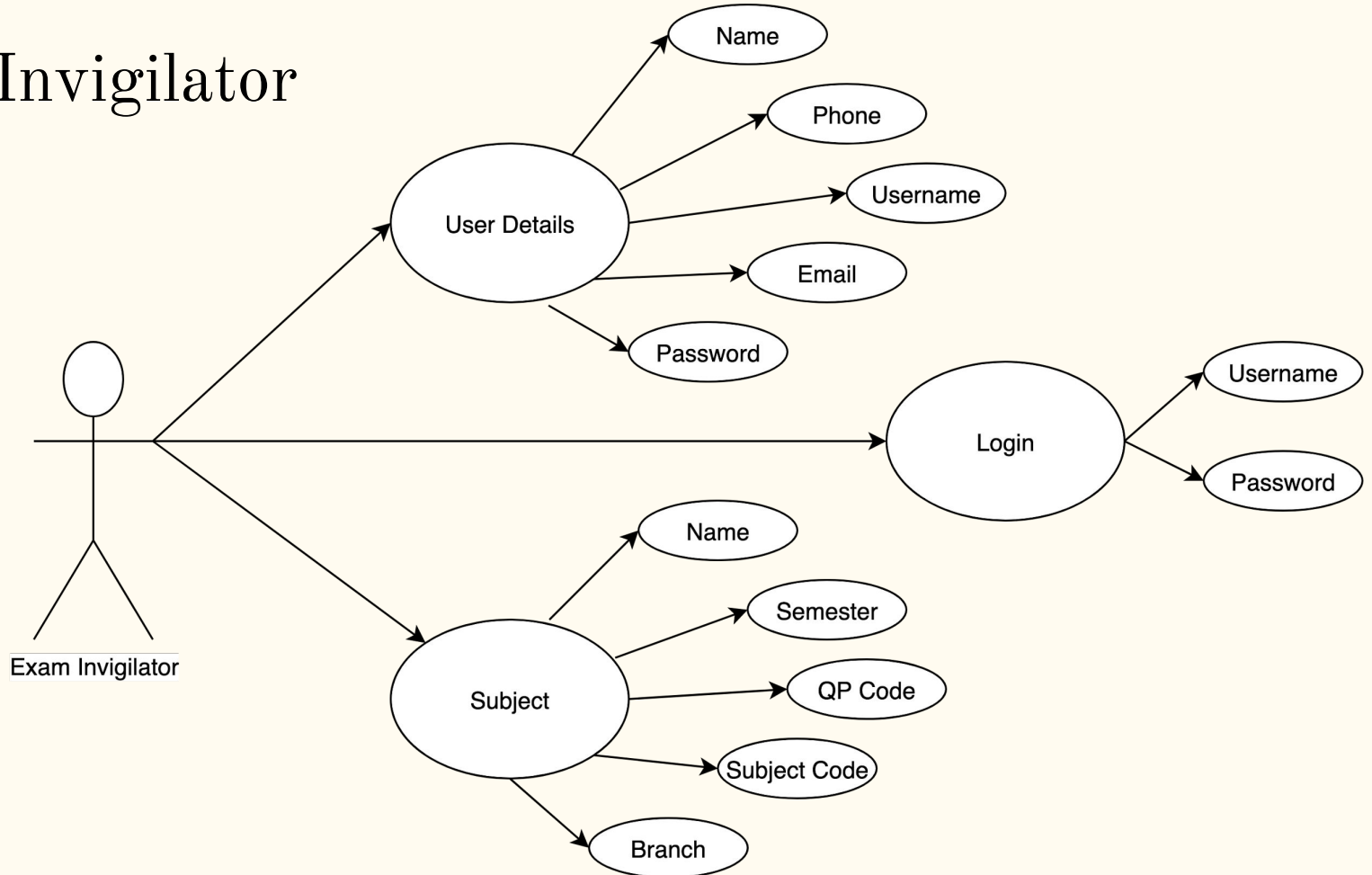
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Our approach to tackle the **problem**.

# Exam Convener



# Exam Invigilator



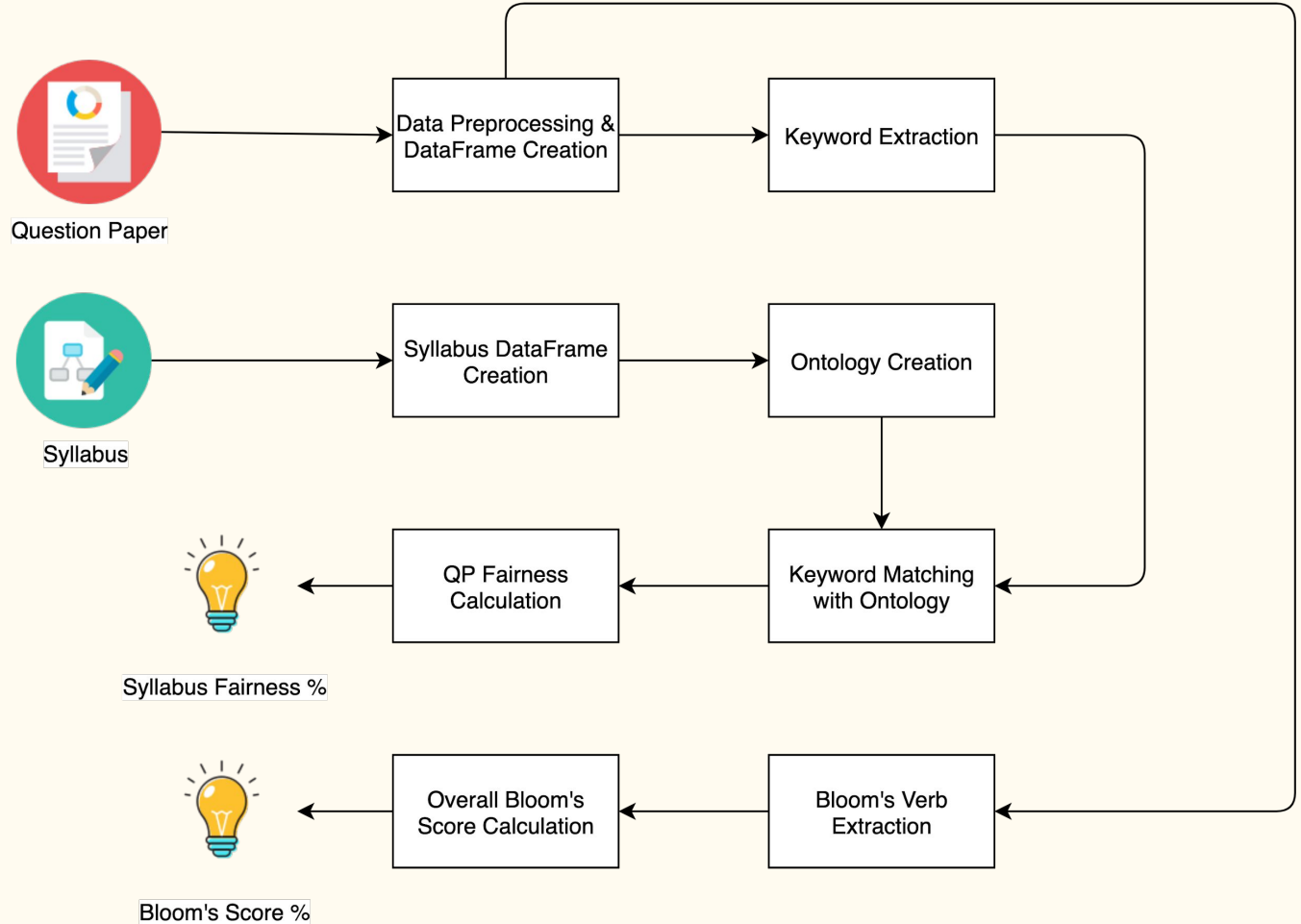


# Project Demo

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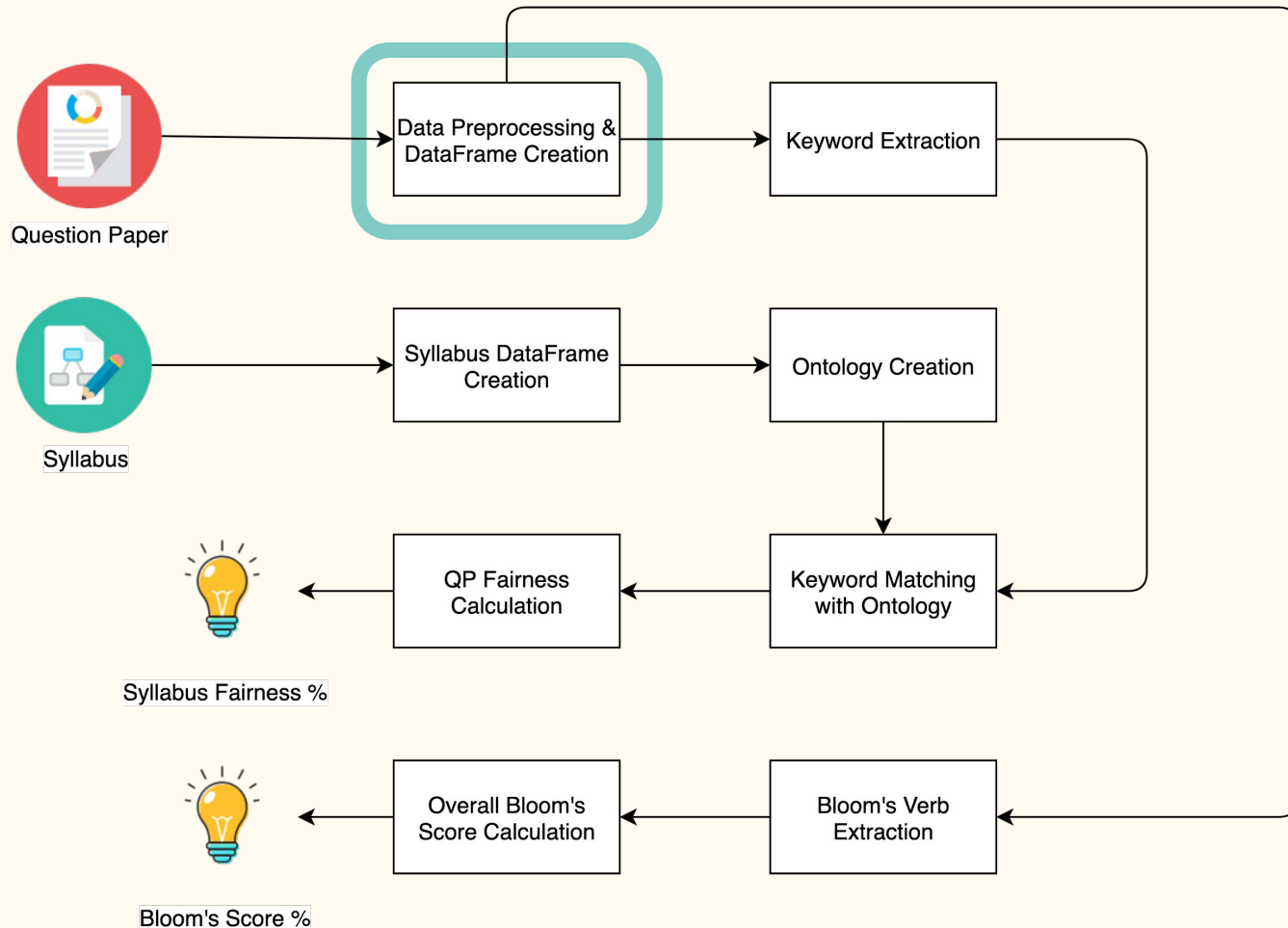
Watch a live **demonstration** of our project.

# System Architecture



# Question Paper DF

pandas



## Output:

| Num |    | Question  | Marks |
|-----|----|---|-------|
| 0   | 2a | Write a program to implement Circular Linked L... | 10    |
| 1   | 4b | Explain different cases for deletion of a node... | 10    |
| 2   | 5a | Write a program in 'C' to implement Stack usin... | 10    |
| 3   | 5b | Explain Depth First search (DFS) Traversal wit... | 10    |
| 4   | 6a | Application of Linked-List –Polynomial addition   | 10    |
| 5   | 6d | Topological Sorting                               | 10    |

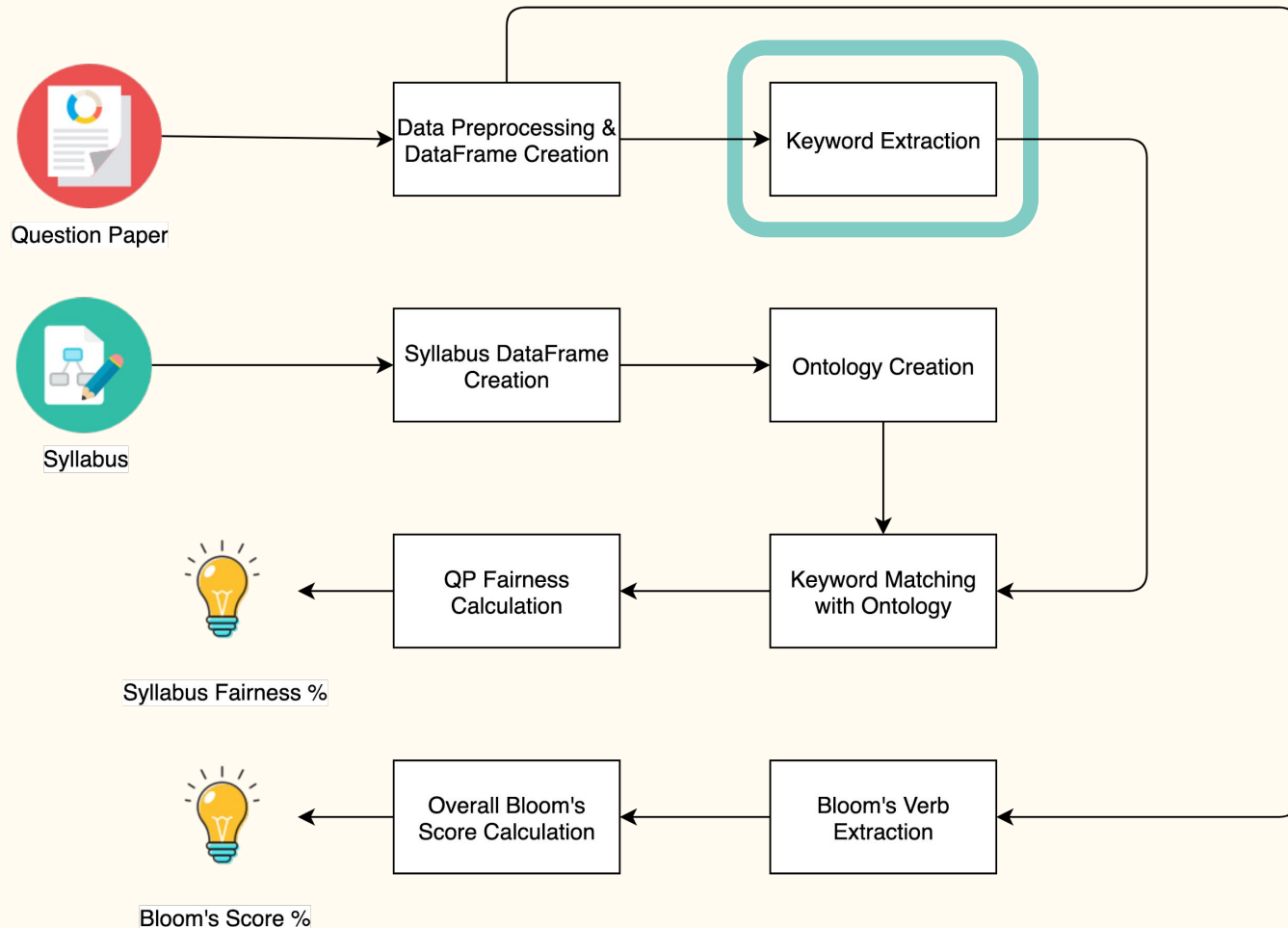
# Keyword Extraction

pandas

Python RegEx

nltk wordnet

nltk stopwords



## Output:

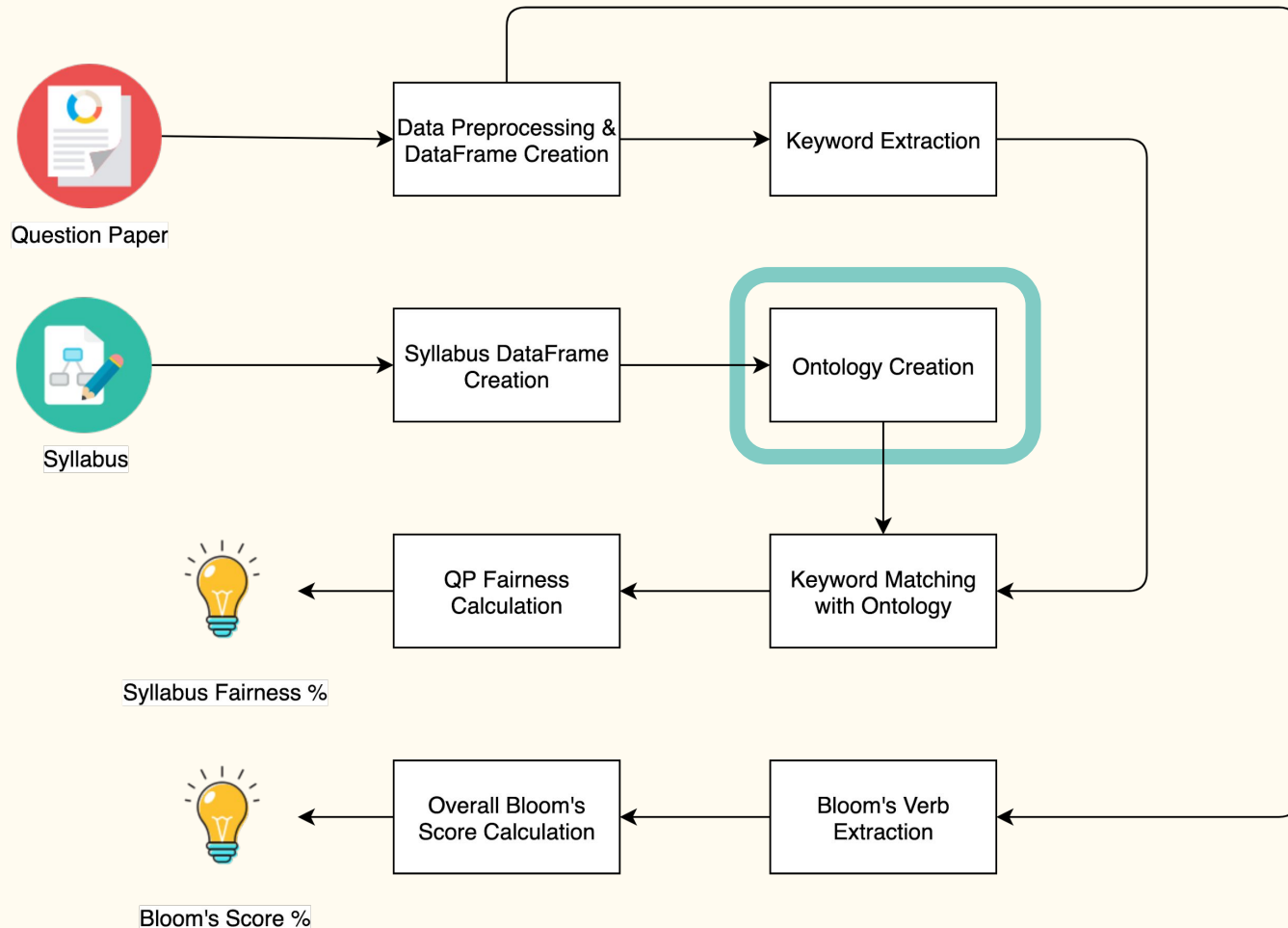
| Num | Question   | Marks | Extracted Keywords                                |
|-----|--|-------|---|
| 0   | 2a Write a program to implement Circular Linked L... | 10    | circular linked                                   |
| 1   | 4b Explain different cases for deletion of a node... | 10    | case deletion node binary search tree function    |
| 2   | 5a Write a program in 'C' to implement Stack usin... | 10    | c stack linked                                    |
| 3   | 5b Explain Depth First search (DFS) Traversal wit... | 10    | depth first search dfs traversal recursive fun... |
| 4   | 6a Application of Linked-List –Polynomial addition   | 10    | application linked polynomial addition            |
| 5   | 6d Topological Sorting                               | 10    | topological sorting                               |

# Syllabus Ontology Creation

pandas

NetworkX

gpickle



## Output:

|   | Module                          | Topic   | Weightage |
|---|---------------------------------|---|-----------|
| 0 | Introduction to Data Structures | [[types data structures], [linear and nonlinea... | 7.5       |
| 1 | Stack and Queues                | [[adt of stack], [operations on stack], [array... | 25.0      |
| 2 | Linked List                     | [[representation of linked list], [linked list... | 25.0      |
| 3 | Trees                           | [[tree terminologies], [tree traversal], [bina... | 30.0      |
| 4 | Graphs                          | [[graph terminologies], [represent graph], [gr... | 15.0      |
| 5 | Sorting and Searching           | [[bubble sort], [insertion sort], [merge sort]... | 17.5      |

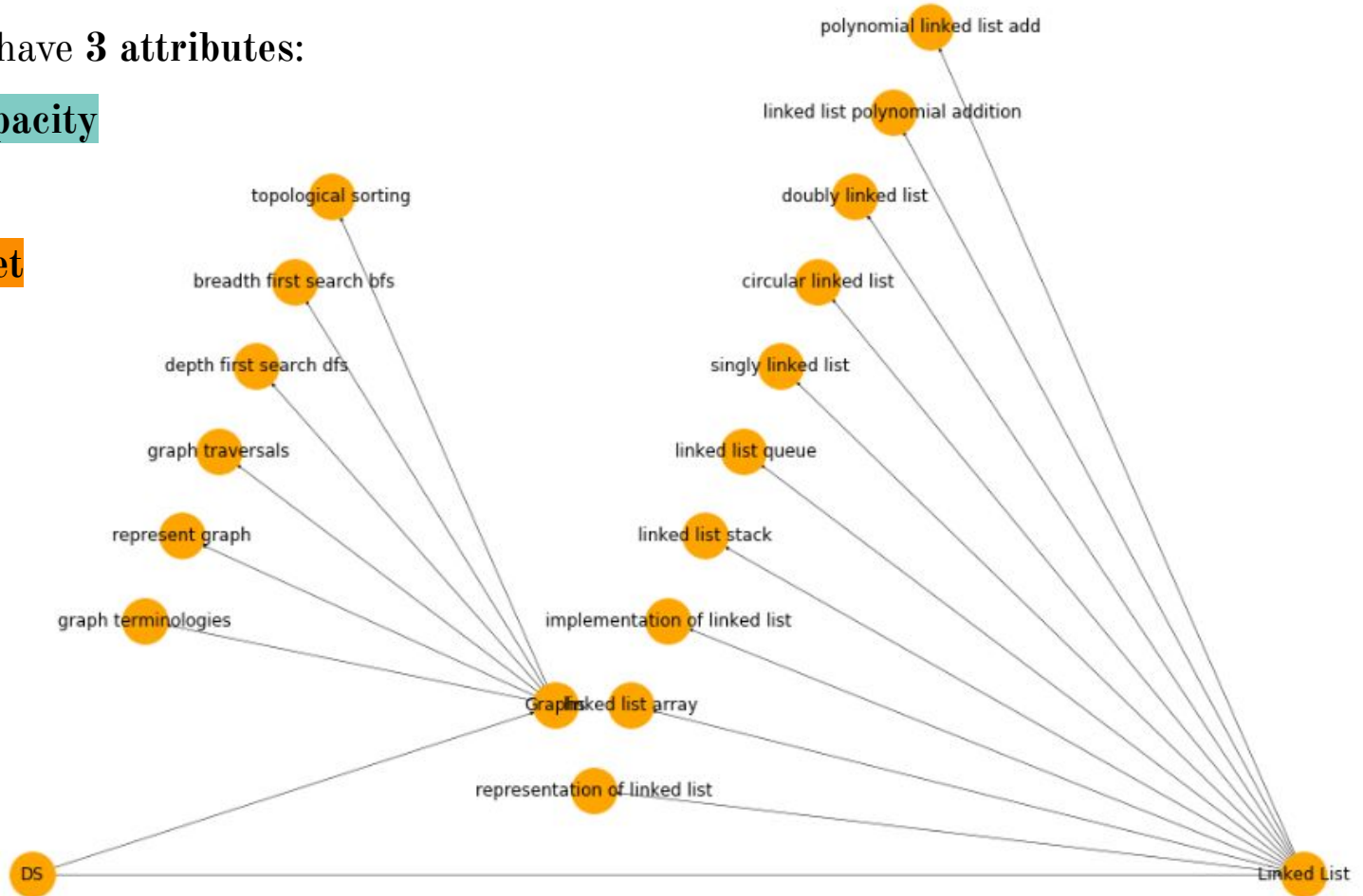


Each node will have **3** attributes:

**Max Marks Capacity**

**Legal Bucket**

**Overflow Bucket**

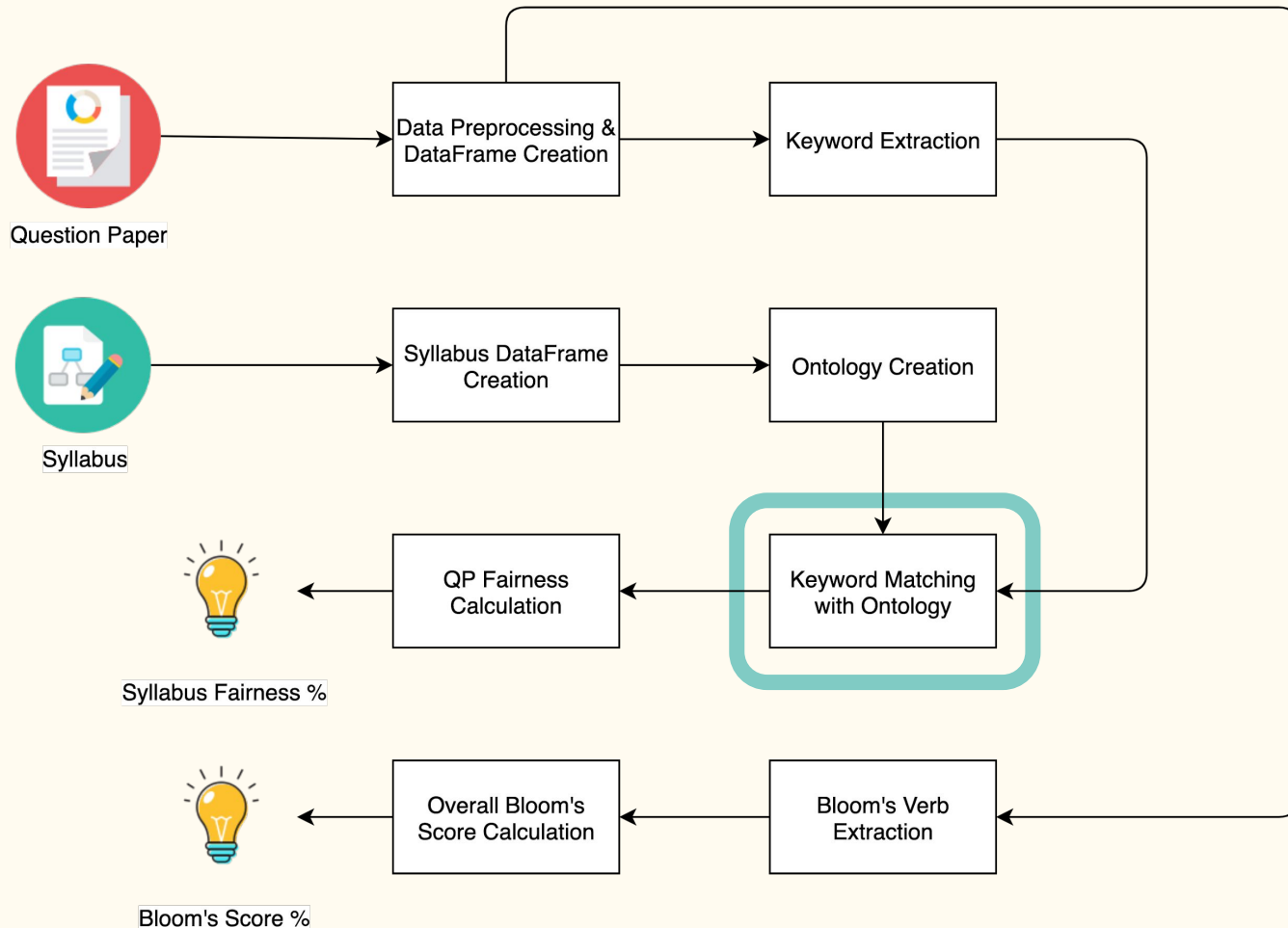


# Keyword Matching

NetworkX

SequenceMatcher

Fuzzy Wuzzy



(circular linked list, 10)

| Num | Question   | Marks | Extracted Keywords                                | Identified Node                 |
|-----|--|-------|---|---------------------------------|
| 0   | 2a Write a program to implement Circular Linked L... | 10    | circular linked                                   | circular linked list            |
| 1   | 4b Explain different cases for deletion of a node... | 10    | case deletion node binary search tree function    | None                            |
| 2   | 5a Write a program in 'C' to implement Stack usin... | 10    | c stack linked                                    | linked list stack               |
| 3   | 5b Explain Depth First search (DFS) Traversal wit... | 10    | depth first search dfs traversal recursive fun... | depth first search dfs          |
| 4   | 6a Application of Linked-List –Polynomial addition   | 10    | application linked polynomial addition            | linked list polynomial addition |
| 5   | 6d Topological Sorting                               | 10    | topological sorting                               | topological sorting             |

From Question:

**(circular linked list, 10)**

Node Attributes:

**Max Marks Capacity = 5**

**Legal Bucket = 5**

**Overflow Bucket =  $10 - 5 = 5$**



$$\frac{TotalLegalMarks}{TotalMarks} * 100$$

$$= \frac{TotalMarksInNodeBucketofSubjectNode}{TotalMarksOfQuestionPaper} * 100$$

**Syllabus Fairness Calculation**

83.33%

Syllabus Fairness

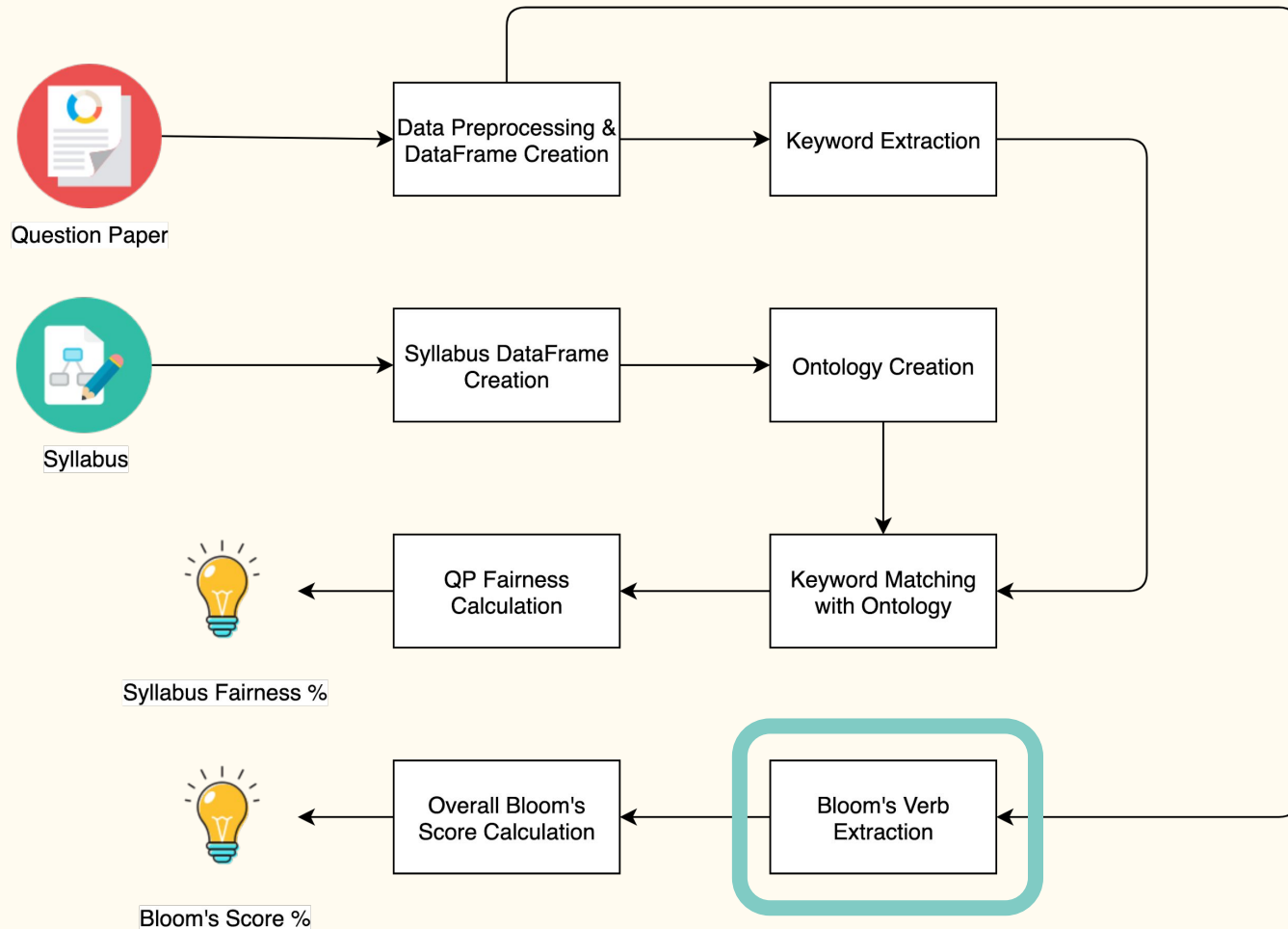
# Bloom's verbs extraction

pandas

Python RegEx

nltk tokenizer

nltk tagger



| Num |    | Question  | Marks | Extracted Keywords                                | Identified Node                 | Bloom's Verbs                                       |
|-----|----|---|-------|---|---------------------------------|---|
| 0   | 2a | Write a program to implement Circular Linked L... | 10    | circular linked                                   | circular linked list            | [(write, remember), (program, create), (list, ...)] |
| 1   | 4b | Explain different cases for deletion of a node... | 10    | case deletion node binary search tree function    | None                            | [(explain, create), (write, remember)]              |
| 2   | 5a | Write a program in 'C' to implement Stack usin... | 10    | c stack linked                                    | linked list stack               | [(write, remember), (program, create), (list, ...)] |
| 3   | 5b | Explain Depth First search (DFS) Traversal wit... | 10    | depth first search dfs traversal recursive fun... | depth first search dfs          | [(explain, create), (example, understand), (wr...)] |
| 4   | 6a | Application of Linked-List –Polynomial addition   | 10    | application linked polynomial addition            | linked list polynomial addition | [(list, remember)]                                  |
| 5   | 6d | Topological Sorting                               | 10    | topological sorting                               | topological sorting             | []  |



```
score = 0
```

```
For each bloom verb in question: (if no  
verb : score += 1/21)
```

```
if level == 'remember':
```

```
    score += 1/21
```

```
if level == 'understand':
```

```
    score += 2/21
```

```
if level == 'apply':
```

```
    score += 3/21
```

```
if level == 'analyze':
```

```
    score += 4/21
```

```
if level == 'evaluate':
```

```
    score += 5/21
```

```
if level == 'create':
```

```
    score += 6/21
```

Each Question  
will get a  
score between  
0 and 1.

**Bloom's Taxonomy Score Calculation for each question**

**AVG(Bloom's Scores of all  
Questions) \*100**

**Final Bloom's Score for the whole Question Paper**

26.98%

**Bloom's Taxonomy Score**

# References

1. Ontology Driven Framework for Assessing the Syllabus Fairness of a Question Paper by Rekha R, A. Angadi, A. Pathak, A. Kapur, H. Gosar, Ramanathan M., V. Thatte and M. Sasikumar
2. Keyword Extraction using NLP: <https://medium.com/analytics-vidhya/automated-keyword-extraction-from-articles-using-nlp-bfd864f41b34>
3. NetworkX: <https://networkx.github.io/documentation/stable/>
4. Python RegEx: <https://docs.python.org/3/howto/regex.html>
5. Wordnet Corpus: <https://www.nltk.org/howto/wordnet.html>
6. NLTK: <https://pythonprogramming.net/stop-words-nltk-tutorial/>
7. DiffLib Sequence Matcher: <https://docs.python.org/3/library/difflib.html>
8. FuzzyWuzzy: <https://pypi.org/project/fuzzywuzzy/>
9. Bloom's Taxonomy: <https://cft.vanderbilt.edu/guides-sub-pages/blooms-taxonomy/>

# Questions

