

**A Case Study Report on**  
***Tabular Text Data Extraction Using EasyOCR***

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## Case Study Overview

This case study travels through the critical process of extracting text data from images and converting it into a structured tabular format, such as Excel or CSV. Beyond just data retrieval, this conversion enables seamless analysis, manipulation, and integration into existing workflows, unlocking the full potential of the data for tasks like analysis and decision-making. The study focuses on evaluating EasyOCR, a versatile Python module designed for text extraction from images, to address these challenges. Despite EasyOCR lacking native table recognition support, its adaptability for reading both natural scene text and dense document text makes it a promising solution.

The objectives of the study include detecting tabular regions within input images, extracting text data accurately, converting it back into a tabular format, and identifying areas for performance enhancement. To do this, I used various techniques from OpenCV to prepare the image and identify text regions. Then, I used EasyOCR to recognize the text within these regions. Methodologically, the process involves preprocessing images, detecting text regions, passing the region of interest to EasyOCR for text detection, and converting the result back into a tabular form using Python scripts.

Challenges such as handling captions, resizing images, and watermarks are encountered, yet EasyOCR proves efficient, particularly for tables with empty columns. By combining EasyOCR for text extraction and a custom approach for table recognition, effective data extraction from image-based tables is achieved, addressing diverse needs effectively.

This project focuses on turning text found in images into organized tables, like those in Excel or CSV files. Extracting text from images is important because it allows us to analyze and use the information more easily. However, traditional methods struggle with converting image text into structured tables. EasyOCR, a Python tool, helps with this task, even though it doesn't directly recognize tables.

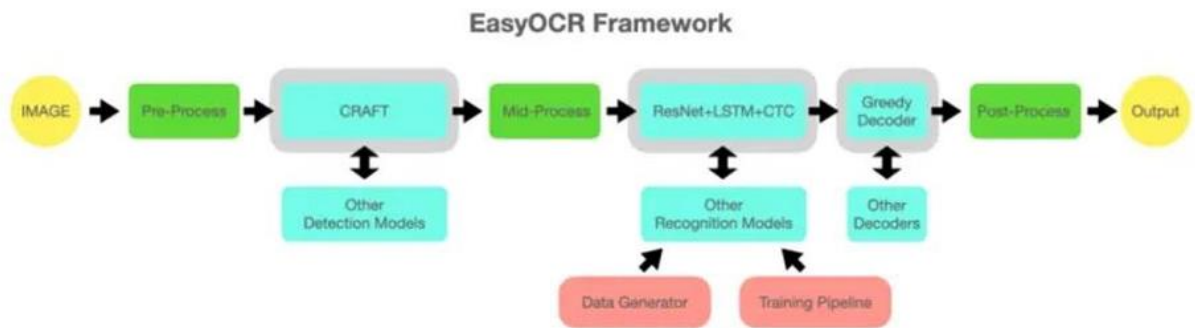
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## I. Introduction:

The importance of extracting text data from images extends beyond just data retrieval; it lies in the subsequent conversion of this extracted text into a structured and easily manipulable format. Converting the extracted text into a tabular format, such as Excel or CSV, holds immense significance for enabling seamless analysis, manipulation, and integration into existing workflows. By structuring the extracted text into rows and columns, organizations can unlock the full potential of the data, facilitating tasks such as data analysis, reporting, and decision-making.



**Figure 1.1: EasyOCR Framework**

The purpose of this case study is to explore the efficacy of EasyOCR, a Python module specifically designed for extracting text from images, in addressing the aforementioned challenges. EasyOCR distinguishes itself by its versatility in reading both natural scene text and dense text in documents, offering a comprehensive solution for a wide range of applications. With support for over 80 languages, EasyOCR presents a promising tool for organizations seeking to streamline their text extraction processes across diverse linguistic contexts.

### **Objectives of the Case Study:**

- 1. Tabular Region Detection:** The primary objective of this case study is to detect tabular regions within given input images by performing a sequence of OpenCV operations.
- 2. Text Extraction:** Building upon the detection of tabular regions, this case study aims to evaluate EasyOCR's efficacy in accurately extracting text data located within these identified tabular regions.

**3. Tabular Conversion:** In addition to text extraction, this case study seeks to convert the extracted text data back into a tabular format accurately.

**4. Identification of Performance Enhancements:** Beyond assessing EasyOCR's current capabilities, this case study endeavors to identify potential areas for performance enhancement. By pinpointing any shortcomings or challenges encountered during the tabular region detection, text extraction, or conversion processes, the study aims to propose recommendations for refining EasyOCR's functionality and optimizing its utility in real-world applications.

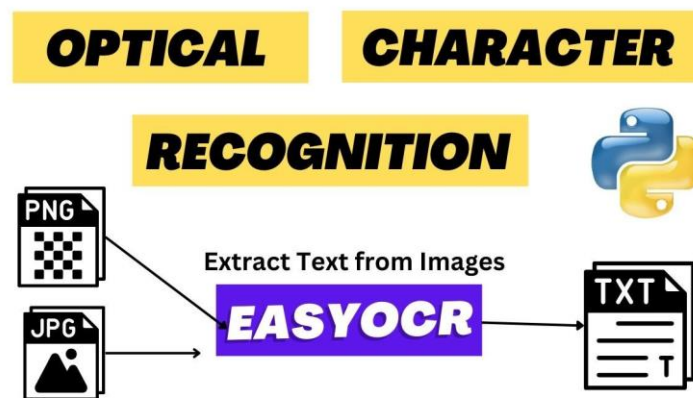


Figure 1.2: Text Detection using EasyOCR

## II. Methodology:

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### 1. Text Extraction Process from Images:

- The text extraction process from images involves several steps to accurately identify and capture textual content embedded within the visual data. This process begins with reading the input image and proceeds through various image processing techniques to enhance the visibility and clarity of the text regions. Once the text regions are identified, optical character recognition (OCR) technology is applied to extract the textual content from the image.

### 2. Modules or Packages Used for Text Extraction and Tabular Conversion:

- In this case study, the primary tool utilized for text extraction from images are OpenCV for extracting tabular regions and EasyOCR, a Python module specifically designed for extracting text from images. EasyOCR leverages deep learning-based models to recognize

and extract text from images with high accuracy and efficiency. Additionally, for the conversion of the extracted text data into a tabular format, standard Python libraries such as Numpy, Pandas may be employed to structure the data into rows and columns resembling a spreadsheet.

## Trigonometry

Name: \_\_\_\_\_

Period: \_\_\_\_\_

**Unit 5: Trigonometric and Periodic Functions**  
**Real World Applications Project**

**Part 1:** You will create a collage of pictures illustrating all six trigonometric functions (sine, cosine, tangent, cosecant, secant, cotangent) found in **nature** (leaves, flowers, body parts, etc.), **architecture** (bridges, doorways, etc.), and **everyday items** (appliances, logos, furniture, etc.).

**Requirements:** Your project must contain:

1. Pictures of the entire objects where the trigonometric function is found
2. Different examples for each of the trigonometric functions - sine, cosine, tangent, cosecant, secant, cotangent (no repeat pictures are allowed)
3. Trace, in marker, the trigonometric function (with axis) in each picture
4. Title for the poster
5. CREATIVITY!!!

**Illustration:** Your collage should be created using the following restrictions:

- \* white or colored poster board
- \* use scissors to cut out pictures (no tearing)
- \* use glue to paste pictures (no taping)

**Grading:** You will be graded according to the following rubric:

Category	Points Possible	Points
Example of Sine	1 point	
Example of Cosine	1 point	
Example of Tangent	1 point	
Example of Cosecant	1 point	
Example of Secant	1 point	
Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	

Total Points: \_\_\_\_ / 25

**Figure 2.1: Input Image**

### 3. Overview of Preprocessing Steps Applied to the Images:

Prior to text extraction, preprocessing steps are applied to the input images to enhance the quality and clarity of the textual content. These preprocessing steps include:

- ***Reading the image:*** The input image is read into the environment for further processing.
- ***Converting it to grayscale:*** The image is converted from color to grayscale to simplify the subsequent image processing operations.
- ***Sharpening edges:*** Edge enhancement techniques are applied to sharpen the edges of text regions, making them more distinguishable from the background.
- ***Thresholding:*** A thresholding operation is performed to segment the image into foreground (text) and background regions based on pixel intensity values.
- ***Canny edge detection:*** The Canny edge detection algorithm is applied to identify prominent edges in the image, further enhancing the visibility of text regions.
- ***Closing operation on Canny:*** Morphological closing operations are performed on the Canny edges to bridge small gaps and smooth the contours of text regions.
- ***Contour detection:*** Contours of text regions are detected using contour detection algorithms, allowing for the identification of tabular regions.
- ***Identifying the largest contour as the tabular region of interest (RoI):*** Among the detected contours, the largest contour is identified as the tabular region containing the text data.
- ***Cropping the input image to the RoI:*** The input image is cropped to isolate the tabular region of interest, facilitating focused text extraction and analysis.

```
image = cv2.imread('WhatsApp Image 2024-05-03 at 15.57.16_82fdd2a1.jpg')
gray_image = cv2.cvtColor(image_file, cv2.COLOR_BGR2GRAY)
kernel = np.array([
    [-1,-1,-1],
    [-1,10,-1],
    [-1,-1,-1]
])
```

```

sharpened_image = cv2.filter2D(gray_image, -1, kernel)

threshold = cv2.threshold(sharpened_image, 180, 255, cv2.THRESH_BINARY)[1]

canny = cv2.Canny(threshold, 180, 200, apertureSize = 7)

closing = cv2.morphologyEx(canny, cv2.MORPH_CLOSE, kernel)

contour = cv2.findContours(closing, cv2.RETR_EXTERNAL, cv2.CHAIN_APPROX_SIMPLE)[0]

cv2.drawContours(image_file.copy(), contour, -1, (0, 0, 255), 1)

largest_contour = None
largest_bbox = None
largest_area = 0

for cnt in contour:
    area = cv2.contourArea(cnt)

    if area > largest_area:
        largest_contour = cnt
        largest_bbox = cv2.boundingRect(cnt)
        largest_area = area
    imgcontour = cv2.drawContours(image_file.copy(), [largest_contour], -1, (0, 0, 255), 1)

x, y, w, h = largest_bbox

img_with_bbox = cv2.rectangle(imgcontour, (x, y), (x+w, y+h), (0, 255, 0), 2)

roi = image_file[y : y + h, x : x + w]

```

**Table 2.1: Table Detection Python Script**

- ✚ The code begins by reading an input image file named 'input\_image.jpg' using the OpenCV library's **imread()** function as numpy array, storing it in the variable 'image'. Subsequently, the image is converted to grayscale using the **cvtColor()** function with **COLOR\_BGR2GRAY**, resulting in a grayscale representation stored in the variable 'gray\_image'.
- ✚ Next, a 3x3 kernel is defined for sharpening the edges of the image. This kernel is then applied to the grayscale image using the **filter2D()** function, resulting in a sharpened image stored in the variable 'sharpened\_image'.



Trigonometry	Name: _____	Period: _____
Unit 5: Trigonometric and Periodic Functions Real World Applications Project		
<b>Part 1:</b> You will create a collage of pictures illustrating all six trigonometric functions (sine, cosine, tangent, cosecant, secant, cotangent) found in <b>nature</b> (leaves, flowers, body parts, etc.), <b>architecture</b> (bridges, doorways, etc.), and <b>everyday items</b> (appliances, logos, furniture, etc.).		
<b>Requirements:</b> Your project must contain:		
1. Pictures of the entire objects where the trigonometric function is found		
2. Different examples for each of the trigonometric functions - sine, cosine, tangent, cosecant, secant, cotangent (no repeat pictures are allowed)		
3. Trace, in marker, the trigonometric function (with axis) in each picture		
4. Title for the poster		
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Category	Points Possible	Points
Example of Sine	1 point	
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Example of Secant	1 point	
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Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	

(a) Gray Scale Image

Trigonometry	Name: _____	Period: _____
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Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	

(b) Sharpened Edges

Trigonometry	Name: _____	Period: _____
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Neat/Unique/Appropriate	Up to 5 extra points	

(c) Thresholding

Trigonometry	Name: _____	Period: _____
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Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	

(d) Canny Edge Detection

**Table 2.2: Preprocessing Techniques on Input Image**

The sharpened image undergoes a thresholding operation using the **threshold()** function, where pixels with intensity values greater than 180 are set to 255 (white), while others are set to 0 (black). This binary thresholded image is stored in the variable 'threshold'.



## Trigonometry

Name: \_\_\_\_\_

Period: \_\_\_\_\_

### Unit 5: Trigonometric and Periodic Functions Real World Applications Project

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Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	
Total Points: _____ / 25		

Figure 2.4: Largest Contour Detected

Finally, a rectangle is drawn around the region of interest (ROI) defined by the bounding box coordinates on a copy of the original image, highlighting the detected tabular region. The region of interest is then extracted from the original image using the bounding box coordinates and stored in the variable 'roi' for further processing.

Category	Points Possible	Points
Example of Sine	1 point	
Example of Cosine	1 point	
Example of Tangent	1 point	
Example of Cosecant	1 point	
Example of Secant	1 point	
Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
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Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	

Total Points: \_\_\_\_\_ / 25

Figure 2.5: Input Image Cropped to Region of Interest

#### 4. Passing RoI to EasyOCR for Text Detection:

After extracting RoI by preprocessing the given input image, we can simply pass the RoI to EasyOCR module for detecting only text present in the tabular region.

```
import easyocr as oc
reader = oc.Reader(['en'])
result = reader.readtext(roi)
```

**Table 2.3: Passing RoI to EasyOCR Module**

This code snippet imports the EasyOCR library for text recognition on a designated region of interest (ROI) extracted from an image. An OCR reader object is instantiated using the `Reader()` function from the EasyOCR library, configured to recognize text in the English language ('en'). This object, named 'reader', is then utilized to invoke the `readtext()` method, passing the ROI extracted from the image as its parameter. The `readtext()` method processes the text within the specified ROI using optical character recognition techniques and returns the result, which typically comprises the detected text and its corresponding bounding box coordinates. This result is captured in the variable 'result' for subsequent analysis or further processing.

```
Detected Test Results: ([([145, 8], [228, 8], [228, 35], [145, 35]), 'Category', 0.9775009221672206), ([433, 11], [555, 11], [555, 31], [433, 31]), 'Points Possible', 0.9985647332397556), ([625, 11], [677, 11], [677, 31], [625, 31]), 'Points', 0.9948524298369781), ([129, 51], [247, 51], [247, 69], [129, 69]), 'Example of Sine', 0.8702974277998347), ([476, 46], [523, 46], [523, 70], [476, 70]), 'point', 0.9665031258880472), ([115, 81], [258, 81], [258, 106], [115, 106]), 'Example of Cosine', 0.9817100291745914), ([481, 87], [521, 87], [521, 105], [481, 105]), 'point', 0.9293741400607151), ([114, 117], [262, 117], [262, 141], [114, 141]), 'Example of Tangent', 0.7430791363523259), ([476, 116], [523, 116], [523, 140], [476, 140]), 'point', 0.9696398408886909), ([109, 155], [269, 155], [269, 175], [109, 175]), 'Example of Cosecant', 0.962936743247506), ([481, 157], [521, 157], [521, 173], [481, 173]), 'point', 0.9638947131924763), ([117, 191], [259, 191], [259, 211], [117, 211]), 'Example of Secant', 0.8150827687667433), ([479, 191], [521, 191], [521, 211], [479, 211]), 'point', 0.9634583272227314), ([105, 227], [273, 227], [273, 247], [105, 247]), 'Example of Cotangent', 0.8167816188413394), ([480, 226], [522, 226], [522, 246], [480, 246]), 'point', 0.8965821886855843), ([77, 261], [299, 261], [299, 281], [77, 281]), 'Examples of nature (at least 1)', 0.7540243659569185), ([479, 261], [521, 261], [521, 281], [479, 281]), 'point', 0.953802130288594), ([55, 299], [321, 299], [321, 319], [55, 319]), 'Examples of architecture (at least 1)', 0.8848066390058598), ([476, 296], [523, 296], [523, 320], [476, 320]), 'point', 0.6853968662412122), ([84, 334], [293, 334], [293, 355], [84, 355]), 'Examples of everyday items', 0.831003563001235), ([422, 332], [576, 332], [576, 356], [422, 356]), 'points (Ipt for each)', 0.5366906584483264), ([11, 367], [360, 367], [360, 392], [11, 392]), 'Tracing of the trigonometric function (with axis)', 0.849662599043716), ([422, 368], [576, 368], [576, 392], [422, 392]), 'points (Ipt for each)', 0.7108143711468203), ([171, 407], [203, 407], [203, 423], [171, 423]), 'Title', 0.9990850638569154), ([465, 406], [523, 406], [523, 426], [465, 426]), '2 points', 0.731434124724312), ([89, 437], [284, 437], [284, 463], [89, 463]), 'Neat / Unique / Appropriate', 0.7508336074564068), ([420, 438], [568, 438], [568, 462], [420, 462]), 'Up to 5 extra points', 0.8689709825623763), ([8, 470], [134, 470], [134, 493], [8, 493]), 'Total Points:', 0.883665811232402), ([220, 470], [252, 470], [252, 493], [220, 493]), '25', 0.9999665355662857)])
```

**Figure 2.6: List of Tuples held by **result** variable**

The list contains collection of tuples which encompass three values in it. They are as follows,

([145, 8], [228, 8], [228, 35], [145, 35]), 'Category', 0.9775009221672206) – 0<sup>th</sup> Index of List

**1<sup>st</sup> Index of Tuple:** [145, 8], [228, 8], [228, 35], [145, 35] – It specifies the bounding box information around the text.

**2<sup>nd</sup> Index of Tuple:** 'Category' – It specifies the actual detected text content from RoI Image

**3<sup>rd</sup> Index of Tuple:** 0.9775009221672206 – This is the confidence value of the detected text information.

Category	Points Possible	Points
Example of Sine	1 point	
Example of Cosine	1 point	
Example of Tangent	1 point	
Example of Cosecant	1 point	
Example of Secant	1 point	
Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1 pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1 pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	
Total Points: ____ / 25		

Figure 2.7: Detected Text in RoI After Passing it to EasyOCR Module

## 5. Converting Back to Tabular Form:

The process of converting back to tabular representation involves several steps aimed at structuring data into a format called a table. It begins with

- ✚ Detecting the number of columns from the resultant list of tuples. This step is crucial as it determines how the data will be organized horizontally.

```
def detect_columns(result, start = 0):  
    cols = []  
    col_ref = []  
    x1 = []  
    y1 = []  
    for tup in range(len(result)):  
        x, y = result[tup][0][0]  
        x1.append(x)  
        y1.append(y)
```

```

    beg = y1[start] - 10
    end = y1[start] + 10
    for i in range(start, len(result)):
        # st.write(i, y1[i])
        if (y1[i] >= beg) and (y1[i] <= end):
            cols.append(result[i][1])
            col_ref.append(x1[i])
    return (x1, cols, col_ref)

x1, cols, col_ref = detect_columns(result)

```

**Table 2.4: Detecting Number of Columns from **result** variable**

Once the number of columns is determined, the next step involves appending the detected row information to the corresponding columns. Each row of data is assigned to its respective column based on the arrangement determined earlier. This ensures that the data is properly aligned within the table structure.

```

for i in range(len(cols)):
    table.append([])

for tup in range(len(cols)+counter, len(result)):
    x_val = int(x1[tup])
    beg = x_val - 30
    end = x_val + 30
    if (x_val >= beg) and (x_val <= end):
        for i in range(len(cols)):
            if (x_val > (col_ref[i] - 100)) and (x_val < (col_ref[i] + 100)):
                table[i].append(result[tup][1])

```

**Table 2.5: Appending Remaining Detected Text Information to Respective Columns**

```

(a) Initial Empty Table:
[
  0 : []
  1 : []
  2 : []
]

(b) List of Columns:
[
  0 : "Category"
  1 : "Points Possible"
  2 : "Points"
]

(c) Column References for Appending Rows:
[
  0 : "145"
  1 : "433"
  2 : "625"
]

```

**Figure 2.8: (a) Initial Empty **Table**      (b) List of **Columns**      (c) **Column References** for Appending Rows**

✚ Finally, after all the row information has been appended to the columns, the resultant list is converted into a Pandas DataFrame. Pandas is a powerful Python library commonly used for data manipulation and analysis, and converting the list to a DataFrame allows for further processing, analysis, and visualization of the tabular data. By structuring the data into a tabular representation, it becomes easier to interpret, analyze, and derive insights from the dataset.

```
df = pd.DataFrame(table).transpose()
df = df.rename(columns = {i:cols[i] for i in range(len(cols))})
df.to_excel("results.xlsx")
print(df)
```

**Table 2.6: Converting List to DataFrame and Loding them to Excel/ CSV Files**

	Category	Points Possible	Points
0	Example of Sine	point	None
1	Example of Cosine	point	None
2	Example of Tangent	point	None
3	Example of Cosecant	point	None
4	Example of Secant	point	None
5	Example of Cotangent	point	None
6	Examples of nature (at least 1)	point	None
7	Examples of architecture (at least 1)	point	None
8	Examples of everyday items	points (Ipt for each)	None
9	Title	points (Ipt for each)	None
10	Neat/Unique / Appropriate	2 points	None
11	25	Up to 5 extra points	None

**Figure 2.9: DataFrame Outcome**



	A	B	C	D	
1		<b>Category</b>	<b>Points Possible</b>	<b>Points</b>	
2	0	Example of Sine	point		
3	1	Example of Cosine	point		
4	2	Example of Tangent	point		
5	3	Example of Cosecant	point		
6	4	Example of Secant	point		
7	5	Example of Cotangent	point		
8	6	Examples of nature (at least 1)	point		
9	7	Examples of architecture (at least 1)	point		
10	8	Examples of everyday items	points (1pt for each)		
11	9	Title	points (1pt for each)		
12	10	Neat/Unique / Appropriate	2 points		
13	11	25	Up to 5 extra points		
14					

Figure 2.10: DataFrame Loaded in Excel File

### III. Challenges:

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Here are some of the challenges that I faced while doing this study,

- I came to know that EasyOCR does not offer native support for table recognition. For tasks specifically involving the recognition of tables within images, a more suitable solution would be *PaddleOCR's PP-Structure* model. This model is specifically designed to recognize and extract structured information from tables present in images. So, I found it difficult to translate detected texts information into tabular formats like Excel, CSV, TSV files. I just overcame this challenge by analyzing the outcome returned by **result** variable

After analyzing the output of **result** variable, I just highlighted tuples with different colors based on the pattern that I identified. The tuples highlighted with different color in the below image implies different meaning.

- Green Color Indicates – Number of columns of Input Image
- Yellow Color Indicates – Individual row information of Column 1
- Unhighlighted Text – Indicates row information of Column 2



```

([[143, 7], [230, 7], [230, 35], [143, 35]], 'Category', 0.7159639437158294),
([[432, 8], [556, 8], [556, 32], [432, 32]], 'Points Possible', 0.8149897168967521),
([[625, 11], [677, 11], [677, 31], [625, 31]], 'Points', 0.9109005020581996),
([[129, 51], [247, 51], [247, 69], [129, 69]], 'Example of Sine', 0.8702974277998347),
([480, 50], [521, 50], [521, 69], [480, 69]], 'point', 0.793118081793997),
([[115, 81], [258, 81], [258, 106], [115, 106]], 'Example of Cosine', 0.9817100291745914),
([481, 87], [521, 87], [521, 105], [481, 105]], 'point', 0.9293741400607151),
([[114, 117], [262, 117], [262, 141], [114, 141]], 'Example of Tangent', 0.7430791363523259),
([476, 116], [523, 116], [523, 140], [476, 140]], 'point', 0.9696398408886909),
([[108, 154], [269, 154], [269, 175], [108, 175]], 'Example of Cosecant', 0.8046274847951407),

```

**Figure 3.1: A Snapshot of output returned by `result` variable**

I found out the columns just by taking into account only (x1, y1) coordinates which bounds the detected text region. That is, `result[i][0][0] => 143, 7` here the value of `i` ranges from 0 to `n`, where `n` is the number of texts detected and stored as tuple information.

I figured out, for columns, the value of `y1` seems to be varying slightly whereas `x1` varies greatly. The value of `y1` which changes slightly can be adjusted by maintaining some threshold value. So, whatever the values that are ranging between this threshold can be appended to the `columns` list. Once the actual columns of the table are appended to `columns` list, I just appended the corresponding value of `x1` (whose value changes greatly) to `column_ref` list. This is just to place the remaining data items to respective columns.

Now we have Columns and Column References for appending data items that corresponds to respective column. By measuring the length of `columns`, I just appended that many empty lists to the `table` list. Similar to the above case, for rows, the value of `x1` seems to be varying slightly whereas `y1` varies greatly. The value of `x1` which changes slightly can be adjusted by maintaining some threshold value. So, whatever the values that are ranging between this threshold can be

appended to the corresponding empty lists which we created earlier within **table** list with reference to **column\_ref** list.

- The next challenge that I faced is, whenever I resize an image or preprocess it before passing it to the EasyOCR model, the model lacks its ability to detect the correct text which resides in the given input image. The wrongly detected texts are highlighted in the Figure 3.4

Category	Points Possible	Points
Example of Sine	1 point	
Example of Cosine	1 point	
Example of Tangent	1 point	
Example of Cosecant	1 point	
Example of Secant	1 point	
Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the Trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	
Total Points: _____ / 25		

Figure 3.2: Before Preprocessing

Category	Points Possible	Points
Example of Sine	1 point	
Example of Cosine	1 point	
Example of Tangent	1 point	
Example of Cosecant	1 point	
Example of Secant	1 point	
Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the Trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	
Total Points: _____ / 25		

Figure 3.3: After Preprocessing

```

Detected Test Results: [[[[[141, 3], [232, 3], [232, 40], [141, 40]], 'Category ', 0.9228015098251716], ([[430, 4], [556, 4], [556, 36], [430, 36]], 'Points Possible ', 0.5910789239018812), ([[125, 42], [248, 42], [248, 71], [125, 71]], 'Example of Sine', 0.5827103059987683), ([[465, 42], [523, 42], [523, 71], [465, 71]], '1 point', 0.5132014665955953), ([[113, 75], [261, 75], [261, 112], [113, 112]], 'Example of Cosine', 0.7083658303662448), ([[464, 78], [522, 78], [522, 108], [464, 108]], 'ipoli', 0.41084367936867405), ([[112, 116], [262, 116], [262, 140], [112, 140]], 'Example of Tangent', 0.644011376378862), ([[466, 116], [522, 116], [522, 140], [466, 140]], 'Ipoint', 0.29725171867162), ([[106, 150], [270, 150], [270, 178], [106, 178]], 'Example of Cosecant', 0.8935830221264257), ([[114, 188], [260, 188], [260, 212], [114, 212]], 'Example of Secant', 0.581145718038942), ([[466, 188], [522, 188], [522, 214], [466, 214]], '1 point', 0.9299289758012137), ([[103, 218], [274, 218], [274, 248], [103, 248]], 'Example of Cotangent', 0.7973716506747129), ([[466, 220], [522, 220], [522, 248], [466, 248]], 'Ipoint', 0.40269861700833043), ([[74, 254], [306, 254], [306, 286], [74, 286]], 'Examples of nature (at least 1)', 0.10818344332200303), ([[478, 254], [524, 254], [524, 286], [478, 286]], 'pains -', 0.3686596907134466), ([[52, 292], [322, 292], [322, 324], [52, 324]], 'Examples of architecture (at least 1)', 0.19552054484353737), ([[466, 294], [524, 294], [524, 326], [466, 326]], 'Ipoint', 0.440099256753988), ([[82, 332], [294, 332], [294, 356], [82, 356]], 'Examples of everyday items', 0.5135205667166407), ([[402, 332], [576, 332], [576, 358], [402, 358]], '#4 points (1pt for each)', 0.42892416517349746), ([[13, 363], [360, 363], [360, 393], [13, 393]], 'Tracing of the trigonometric function (with axis)', 0.2598808575501405), ([[410, 364], [576, 364], [576, 394], [410, 394]], '0 points (1pt for each)', 0.2721005127198858), ([[171, 405], [207, 405], [207, 425], [171, 425]], 'Title', 0.39498669619739274), ([[456, 404], [530, 404], [530, 428], [456, 428]], '12 points', 0.64431310363352), ([[90, 436], [286, 436], [286, 462], [90, 462]], 'Neat/Unique/Appropriate', 0.4951969285837001), ([[418, 436], [568, 436], [568, 462], [418, 462]], 'Up to 5 extra points', 0.22992901222990567), ([[10, 470], [134, 470], [134, 493], [10, 493]], 'Total Points:', 0.9263859212815321), ([[202, 470], [256, 470], [256, 493], [202, 493]], '1051', 0.03198374489602229), ([[622, 5430712064641, 9.377528171635387], [677.581730048472, 4.472037318251267], [678.4569287935359, 32.62247182836461], [623.418269951528, 36.52796268174873]], 'Points', 0.9180304640198443), ([[463.6027607015021, 151.34524533285406], [520.4883107813158, 145.32419886156282], [523.3972392984979, 175.65475466714594], [466.5116892186842, 181.67580113843718]], 'Ipoint', 0.2905128447667485)]]

```

Figure 3.4: EasyOCR fails to detect text accurately after preprocessing

## IV. Limitations:

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- This is not applicable for table with too many empty cells and for blurred images, but it outperforms in case an entire column is empty as shown in the figure below. It is **prone to None value**

Category	Points Possible	Points
Example of Sine	1 point	
Example of Cosine	1 point	
Example of Tangent	1 point	
Example of Cosecant	1 point	
Example of Secant	1 point	
Example of Cotangent	1 point	
Examples of nature (at least 1)	1 point	
Examples of architecture (at least 1)	1 point	
Examples of everyday items	4 points (1pt for each)	
Tracing of the trigonometric function (with axis)	6 points (1pt for each)	
Title	2 points	
Neat/Unique/Appropriate	Up to 5 extra points	
Total Points: _____ / 25		

Category	Points Possible	Points
0 Example of Sine	point	None
1 Example of Cosine	point	None
2 Example of Tangent	point	None
3 Example of Cosecant	point	None
4 Example of Secant	point	None
5 Example of Cotangent	point	None
6 Examples of nature (at least 1)	point	None
7 Examples of architecture (at least 1)	point	None
8 Examples of everyday items	points (1pt for ea	None
9 Title	points (1pt for ea	None
10 Neat/Unique / Appropriate	2 points	None
11 25	Up to 5 extra poi	None

Figure 4.1: Input and Outcome

- If a null value is present in between any cells in a particular column then the data that has to be placed below the null value will be **shifted up to Null value's position** and the place for null value will be preserved at the end of the table.

	Procedure	Trial 1	Trial 2
a	mass of dish, and watch glass	74.14 g	
b	mass of dish, glass and tin	76.20 g	
c	mass of tin =b-a	2.06 g	
d	moles of tin	0.173 mol	
e	mass of dish, glass, and product	76.76 g	
f	mass of oxygen =e-b	.56 g	
g	moles of oxygen	0.0350 mol	
h	mole ratio	2.02 : 1	
i	accepted ratio	2 : 1	
j	% error	1.00 %	

	Procedure	Trial	Trial 2
0	mass of dish; and watch glass	74.14 9	74.14 9
1	Mila5s	76,20	76,20
2	of dish; glass and tin	2.06 9	2.06 9
3	mass of tin =b-a	0.173 mol	0.173 mol
4	moles of tin	76.76	76.76
5	mass of dish,glass;	0.350 mo	0.350 mo
6	and product	2.02	2.02
7	mass of oxygen =e-b	L0o	L0o
8	moles of oxygen	None	None
9	mole ratio	None	None
10	accepted ratio	None	None

Figure 4.2: Left Image: RoI, Right Image: Tabular Representation with None values at end of Table

- Preprocessing/ Resizing** original image comparably affects the EasyOCR's model ability to produce a correct outcome.
- As mentioned in the EasyOCR documentation, the detected text will not follow **natural human reading** so depending on the context the columns may interchange in the output by preserving its data items in the corresponding columns.



- **Watermarks/ background** information present in an image may affect the positioning of data items in the table slightly.

TEST RESULT				
S.No	Parameter	Specifications	Result	Test Method
1.	Mashed Potato	Negative	Negative	FSSAI Manual
2.	Sweet Potato	Negative	Negative	FSSAI Manual
3.	Other Starch	Negative	Negative	FSSAI Manual
4.	Rancid Stuff (Old Ghee)	Negative	Negative	FSSAI Manual
5.	Synthetic Colouring Matter	Negative	Negative	FSSAI Manual
6.	Vegetable Oil & Fat	Negative	Negative	FSSAI Manual
7.	Test For Vanaspati	Negative	Negative	FSSAI Manual
8.	Curcumin	Negative	Negative	FSSAI Manual
9.	Dalda	Negative	Negative	FSSAI Manual
10.	Lead, mg/kg	Max. 2.5	Not Detected	FSSAI Manual
11.	Arsenic, mg/kg	Max. 1.1	Not Detected	FSSAI Manual
12.	Mercury, mg/kg	Max. 1.0	Not Detected	FSSAI Manual
13.	Cadmium, mg/kg	Max. 1.5	Not Detected	FSSAI Manual

**Figure 4.3: RoI with Watermark/ Background Information**

SNo	Parameter	Specifications	Result	Test Method
0	Mashed Potato	Mashed Potato	Negative	FSSAI Manual
1	Sweet Potato	Sweet Potato	Negative	FSSAI Manual
2	Other Starch	Other Starch	Negative	FSSAI Manual
3	Rancid Stuff (Old Ghee)	Rancid Stuff (Old Ghee)	Negative	FSSAI Manual
4	Synthetic Colouring Matter	Synthetic Colouring Matter	Negative	FSSAI Manual
5	Vegetable Oil & Fat	Vegetable Oil & Fat	Negative	FSSAI Manual
6	Test For Vanaspati	Test For Vanaspati	Negative	FSSAI Manual
7	Curcumin	Curcumin	Negative	FSSAI Manual
8	Dalda	Tabb	Negative	FSSAI Manual
9	10.	Dalda	Max 2.5	Not Detected

**Figure 4.4: Labs in the previous image detected as Tabb and placed in between actual data items**

## V. Problem Identified:

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- ✚ In some cases, the region of interest was detected along with the caption information of the table as shown in the Figure 4.3. Since here I'm considering the text data that is present in first few tuples as the columns for a given input image.

✚ To overcome this, I just measured the length of columns detected. If it is less than 2 then that will be stored in the 'header' variable.

```
if len(cols) < 2:
    header = cols[0]
    counter += 1
    x1, cols, col_ref = detect_columns(result,
    counter)
```

**Table 5.1: Python Script for Checking Caption/Header Information**

```
def detect_columns(result, start = 0):
```

**Figure 5.1: By default, the 'start' is set to zero in function definition**

**Tabular Form**

TEST RESULT

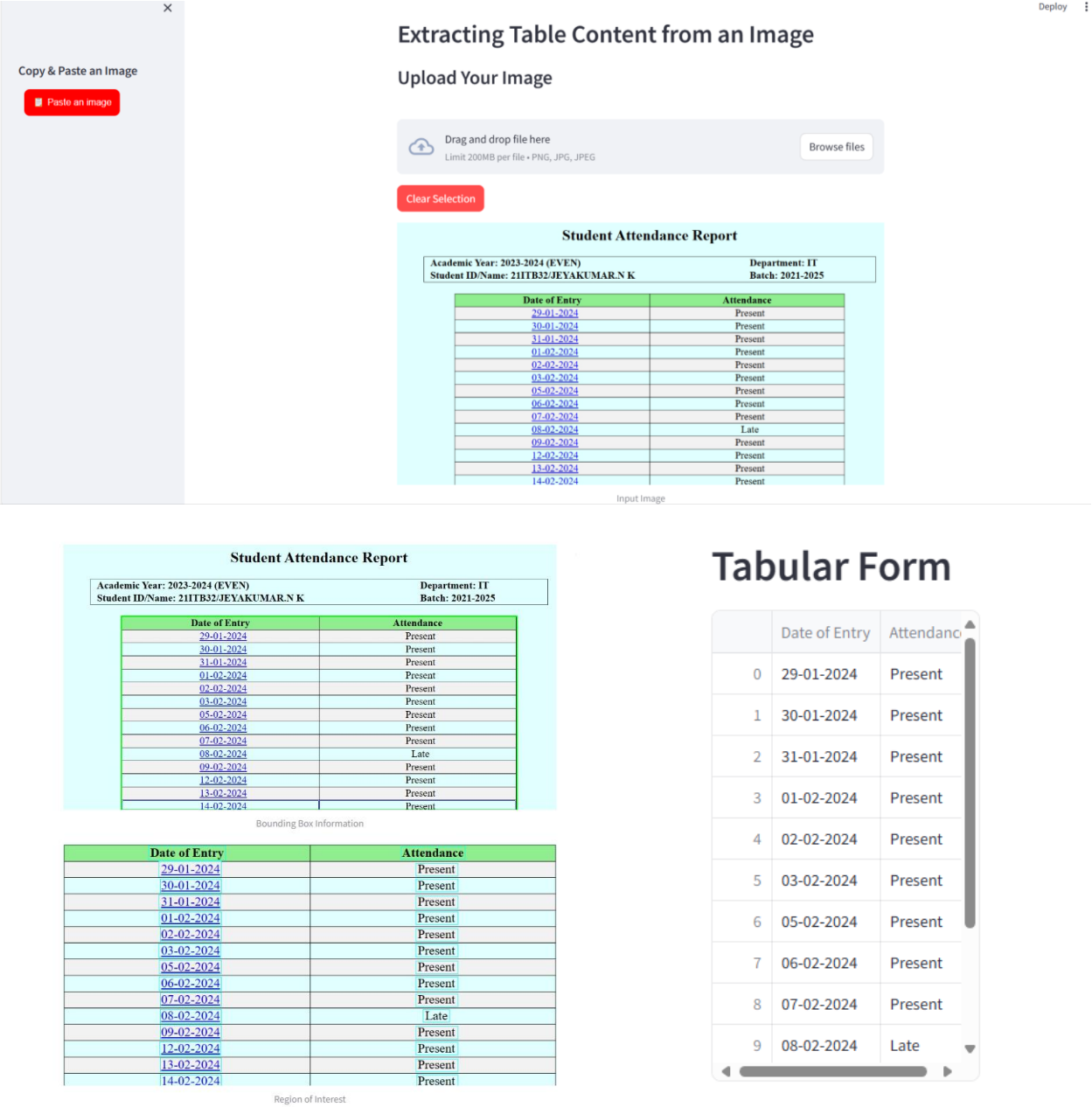
	SNo	Parameter	Specifications	Result	Test Method
0	Mashed Potato	Mashed Potato	Negative	Negative	FSSAI Manual
1	Sweet Potato	Sweet Potato	Negative	Negative	FSSAI Manual

**Figure 5.2: Detected Caption Information Displayed Separately Outside the Table**

## VI. Conclusion:

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In conclusion, while EasyOCR may not be suitable for tables with excessive empty cells, it excels when entire columns are empty. Preprocessing or resizing images may impact its accuracy slightly, but overall, EasyOCR reliably preserves data integrity, even if column order may vary. Despite potential challenges like watermarks, EasyOCR remains a valuable tool for efficient and accurate table data extraction. By combining EasyOCR for general text extraction and the approach that I followed for specialized table recognition, table image-based data extraction can be achieved, serving to diverse needs effectively.



Student Attendance Report

Academic Year: 2023-2024 (EVEN)

Student ID/Name: 21ITB32/JEYAKUMAR.N K

Department: IT

Batch: 2021-2025

Date of Entry	Attendance
29-01-2024	Present
30-01-2024	Present
31-01-2024	Present
01-02-2024	Present
02-02-2024	Present
03-02-2024	Present
05-02-2024	Present
06-02-2024	Present
07-02-2024	Present
08-02-2024	Late
09-02-2024	Present
12-02-2024	Present
13-02-2024	Present
14-02-2024	Present

Bounding Box Information

Date of Entry	Attendance
29-01-2024	Present
30-01-2024	Present
31-01-2024	Present
01-02-2024	Present
02-02-2024	Present
03-02-2024	Present
05-02-2024	Present
06-02-2024	Present
07-02-2024	Present
08-02-2024	Late
09-02-2024	Present
12-02-2024	Present
13-02-2024	Present
14-02-2024	Present

Region of Interest

Tabular Form

	Date of Entry	Attendance
0	29-01-2024	Present
1	30-01-2024	Present
2	31-01-2024	Present
3	01-02-2024	Present
4	02-02-2024	Present
5	03-02-2024	Present
6	05-02-2024	Present
7	06-02-2024	Present
8	07-02-2024	Present
9	08-02-2024	Late

Figure 6.1: Deployed as a Web Application Using Streamlit

No

1

Lab Test

Result

Reference Range

Total bilirubin

20.9 mg/ dL

0.2 - 1.2 mg/ dL

Conjugated bilirubin

12.5 mg/ dL

0.0 - 0.5 mg/ dL

Alkaline phosphatase

327 Units/L

40 - 150 Units/L

Gamma glutamyltransferase

185 Units/L

9 - 64 Units/L

Alanine aminotransferase (ALT)

34 Units/L

0-55 Units/L

Aspartate aminotransferase (AST)

29 Units/L

5-34 Units/L

Prothrombin time

18.7 seconds

12.1 - 14.8 seconds

International normalized ratio (INR)

1.6

0.9-1.1

Albumin

2.5 g/ dL

3.4 - 5.0 g/ dL

White blood cell count with differential

8.9 × 10<sup>3</sup> /uL

3.5-10.5 × 10<sup>3</sup> /uL

Neutrophils

81%

35-70%

Lymphocytes

11.30%

20-50%

Monocytes

18%

3-15%

Lab Test

Result

Reference Range

0 Total bilirubin

20.9 mg/ dL

0.2 -1.2 mg,

1 Conjugated bilirubin

12.5 mg/ dL

0.0 - 0.5 mg

2 Alkaline phosphatase

327 Units / L

40

3 Gamma glutamyltransferase

185 Units / L

150 Units/ L

4 Alanine aminotransferase (ALT)

34 Units/L

64 Units/ L

5 Aspartate aminotransferase (AST)

29 Units/ L

0-55 Units/L

6 Prothrombin time

18.7 seconds

5-34 Units/L

7 International normalized ratio (INR)

1.6

121

8 Albumin

2.5 g/dL

14.8 seconds

9 White blood cell count with

8.9 × 10<sup>3</sup> /uL

0.9-1.1

10 differential

81 %

34 - 5.0 g/dL

11 Neutrophils

11.30%

3.5-10.5 X 103 /uL

12 Lymphocytes

18%

35-70%

13 Monocytes

None

20-50%

2

The University of Melbourne

HEALTH & SAFETY

EXAMPLE OF A LABORATORY CHEMICAL INVENTORY

Cas No	Manufacturer's/Supplier's Chemical Name	Manufacturer's Name	Supplier	Maximum Quantity (L or kg)	DG Class	Sub risk	PG	UN No	Haz Sub Y/N	Poison Schedule	Current SDS (Yes or No)	Room Number/ Location
64-19-7	Acetic acid	Acetic acid	Ajax Merck	2.5L	8	3	II	2789	Yes	6	16/08/11	Lab 301
50-78-2	Acetyl salicylic acid	Aspirin	Bayer	0.3kg	6.1	nil	III	3249	Yes	2	15/06/12	Lab 301
7664-41-7	Armonia Anhydrous Liquefied	Armonia (gas)	Quenos	43L	2.3	8	nil	1005	Yes	6	2/03/13	Cyl cage
nil	Armonia solution 32%	Armonia solution 32%	Ajax Finechem	2.5L	8	nil	III	2672	Yes	6	31/01/12	Lab 301
71-49-2	Benzene	Benzene	Acros	5L	3	nil	II	1114	Yes	7	5/06/12	Lab 301
10049-52-4	Calcium chloride	Caltac	APS Specialty Chemicals	5kg	nil	nil	nil	nil	Yes	nil	23/04/10	Lab 301
630-08-0	Carbon monoxide	Carbon monoxide	Matheson	12L	2.3	2.1	nil	1016	Yes	nil	21/04/10	Cyl cage
67-66-3	Chloroform	Chloroform	Ajax	2.5L	6.1	nil	III	1888	Yes	6	26/04/13	Lab 301
50-99-7	D-(+)-Glucose	D-Glucose	ICN	1 kg	nil	nil	nil	nil	No	nil	21/07/11	Lab 301
3615-56-3	D-(+)-Sorbitose	D-Sorbitose	ICN	3kg	nil	nil	nil	nil	No	nil	12/05/10	Lab 301
7664-39-3	Hydrofluoric acid	Hydrofluoric acid	APS Specialty Chemicals	1L	8	6.1	I	1790	Yes	7	10/03/13	Lab 301
87-79-6	L-Sorbitose	Sorbitin	Sigma	5kg	nil	nil	nil	nil	No	nil	30/03/11	Lab 301
7783-54-2	Nitrogen trifluoride	Nitrogen trifluoride	Air Liquide	0.8L	2.2	5.1	nil	2451	Yes	nil	24/06/10	Lab 301
7647-14-5	Sodium chloride	Common Salt	APS Specialty Chemicals	50kg	nil	nil	nil	nil	No	nil	24/06/10	Lab 301

Cas No	manuracturel	's Supplier '\$	manuracturel \$	Supplier
0 Chemical Name	Chemical Name	Chemical Name	Acetic acid	Acetic acid
1 64-19-7	64-19-7	Acetic acid	Aspirin	Ajax Merck
2 Acetic acid	Acetic acid	Acetic acid	Armonia (gas)	Aspirin
3 50-78-2	50-78-2	Acetyi	Armonia	Bayer
4 Acetyi	Acetyi	salicylic acid	solution 326	Armonia (gas)
5 salicylic acid	salicylic acid	Aspirin	Jenzenes	Quenos
6 7664-41-7	7664-41-7	Armonia Anhydrous	Caltac	Armonia
7 Armonia Anhydrous	Armonia Anhydrous	Armonia (gas)	Carbon	Ajax Finecher
8 Liquefied	Liquefied	Liquefied	monoxidelMatheson	solution 326
9 Ammonia solution 32	Ammonia solution 32	Ammonia solution 32	Chloroform	Jenzenes

Table 6.1 Passing Different Inputs to the application

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## VIII. References:

- <https://www.jaied.ai/easyocr/tutorial/>
- <https://www.analyticsvidhya.com/blog/2021/06/text-detection-from-images-using-easyocr-hands-on-guide/>
- <https://towardsdatascience.com/pre-processing-in-ocr-fc231c6035a7>