I have the following sections of the code that α aims to caracterise the body language of a person:

1- First we start with the code that detects the cordinates of the body parts using a holistic model from the library mediapipe (it captures each frame given by the webcam and extract the coordinates):

```
import mediapipe as mp
import numpy as np
mp_drawing = mp.solutions.drawing_utils # Drawing helpers
mp_holistic = mp.solutions.holistic # Mediapipe Solutions
cap = cv2.VideoCapture(0)
with mp_holistic.Holistic(min_detection_confidence=0.5, min_tracking_confidence=0.5) as holistic:
    while cap.isOpened():
       ret, frame = cap.read()
       image = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
       image.flags.writeable = False
       # Make Detections
       results = holistic.process(image)
       # face_landmarks, pose_landmarks, left_hand_landmarks, right_hand_landmarks
       image.flags.writeable = True
       image = cv2.cvtColor(image, cv2.COLOR_RGB2BGR)
       mp_drawing.draw_landmarks(image, results.face_landmarks, mp_holistic.FACEMESH_TESSELATION,
                               mp_drawing.DrawingSpec(color=(80,110,10), thickness=1, circle_radius=1),
                               mp_drawing.DrawingSpec(color=(80,256,121), thickness=1, circle_radius=1)
       mp_drawing.draw_landmarks(image, results.right_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                               mp_drawing.DrawingSpec(color=(80,22,10), thickness=2, circle_radius=4),
                               mp_drawing.DrawingSpec(color=(80,44,121), thickness=2, circle_radius=2)
       mp_drawing.DrawingSpec(color=(121,22,76), thickness=2, circle_radius=4),
                               mp_drawing.DrawingSpec(color=(121,44,250), thickness=2, circle_radius=2)
       mp_drawing.draw_landmarks(image, results.pose_landmarks, mp_holistic.POSE_CONNECTIONS,
                               mp_drawing.DrawingSpec(color=(245,117,66), thickness=2, circle_radius=4),
                               mp_drawing.DrawingSpec(color=(245,66,230), thickness=2, circle_radius=2)
       cv2.imshow('Raw Webcam Feed', image)
       if cv2.waitKey(10) & 0xFF == ord('q'):
           break
cap.release()
cv2.destroyAllWindows()
```

2- Next I have a code that captures and stores the data of a class of body language in a csv file (it stores the coordinates of different body pose with the class of the body language). The data set will serve as labeled dataset that will be used later to train machine learning models.

```
import csv
import os
import numpy as np
import mediapipe as mp
import numpy as np
mp_drawing = mp.solutions.drawing_utils # Drawing helpers
mp_holistic = mp.solutions.holistic # Mediapipe Solutions
num_coords = 501
landmarks = ['class']
for val in range(1, num_coords+1):
    landmarks += ['x{}'.format(val), 'y{}'.format(val), 'z{}'.format(val), 'v{}'.format(val)]
with open('coords.csv', mode='w', newline='') as f:
    csv_writer = csv.writer(f, delimiter=',', quotechar='"', quoting=csv.QUOTE_MINIMAL)
    csv_writer.writerow(landmarks)
class_name = "Wakanda Forever"
cap = cv2.VideoCapture(0)
with mp_holistic.Holistic(min_detection_confidence=0.5, min_tracking_confidence=0.5) as holistic:
    while cap.isOpened():
        ret, frame = cap.read()
        # Recolor Feed
        image = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
        image.flags.writeable = False
        # Make Detections
        results = holistic.process(image)
        # face_landmarks, pose_landmarks, left_hand_landmarks, right_hand_landmarks
        image.flags.writeable = True
        image = cv2.cvtColor(image, cv2.COLOR_RGB2BGR)
        # 1. Draw face landmarks
        mp_drawing.draw_landmarks(image, results.face_landmarks, mp_holistic.FACEMESH_TESSELATION,
                                mp_drawing.DrawingSpec(color=(80,110,10), thickness=1, circle_radius=1),
                                mp_drawing.DrawingSpec(color=(80,256,121), thickness=1, circle_radius=1)
        mp_drawing.draw_landmarks(image, results.right_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                mp_drawing.DrawingSpec(color=(80,22,10), thickness=2, circle_radius=4),
                                mp_drawing.DrawingSpec(color=(80,44,121), thickness=2, circle_radius=2)
        # 3. Left Hand
        mp_drawing.draw_landmarks(image, results.left_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                mp_drawing.DrawingSpec(color=(121,22,76), thickness=2, circle_radius=4),
                                mp_drawing.DrawingSpec(color=(121,44,250), thickness=2, circle_radius=2)
        # 4. Pose Detections
        mp_drawing.DrawingSpec(color=(245,117,66), thickness=2, circle_radius=4),
                                mp_drawing.DrawingSpec(color=(245,66,230), thickness=2, circle_radius=2)
```

```
# Export coordinates
           # Extract Pose landmarks
            pose = results.pose_landmarks.landmark
           pose_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in pose]).flatten())
            face = results.face_landmarks.landmark
            face_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in face]).flatten())
           row = pose_row+face_row
           row.insert(0, class_name)
           with open('coords.csv', mode='a', newline='') as f:
               csv_writer = csv.writer(f, delimiter=',', quotechar='"', quoting=csv.QUOTE_MINIMAL)
               csv_writer.writerow(row)
       except:
        cv2.imshow('Raw Webcam Feed', image)
        if cv2.waitKey(10) & 0xFF == ord('q'):
cap.release()
cv2.destroyAllWindows()
```

As I said earlier, the previous code is a generic one. For the code that I will be using in my work, I'm going to use three classes with the class_name(Open body language, Neutral body language, Closed body language, Smile, Eye contact, Space occupation) with the data being stored respectfully on the following csv files(Open_body_language.csv, Neutral_body_language.csv, Closed_body_language.csv, Smile.csv, Eye_contact.csv, Space_occupation.csv)

- Open body language:

```
import csv
import os
import numpy as np
import cv2
import mediapipe as mp
import numpy as np
mp_drawing = mp.solutions.drawing_utils # Drawing helpers
mp_holistic = mp.solutions.holistic # Mediapipe Solutions
num_coords = 501
landmarks = ['class']
for val in range(1, num_coords+1):
     landmarks += ['x{}'.format(val), 'y{}'.format(val), 'z{}'.format(val), 'v{}'.format(val)] 
with open('Open_body_language.csv', mode='w', newline='') as f:
    csv_writer = csv.writer(f, delimiter=',', quotechar='"', quoting=csv.QUOTE_MINIMAL)
    csv writer.writerow(landmarks)
class_name = "Open body language"
cap = cv2.VideoCapture(0)
# Initiate holistic model
with mp_holistic.Holistic(min_detection_confidence=0.5, min_tracking_confidence=0.5) as holistic:
    while cap.isOpened():
        ret, frame = cap.read()
        image = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
        image.flags.writeable = False
        # Make Detections
        results = holistic.process(image)
        image.flags.writeable = True
        image = cv2.cvtColor(image, cv2.COLOR_RGB2BGR)
        mp_drawing.draw_landmarks(image, results.face_landmarks, mp_holistic.FACEMESH_TESSELATION,
                                 mp_drawing.DrawingSpec(color=(80,110,10), thickness=1, circle_radius=1),
                                 mp_drawing.DrawingSpec(color=(80,256,121), thickness=1, circle_radius=1)
        mp_drawing.draw_landmarks(image, results.right_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                 mp_drawing.DrawingSpec(color=(80,22,10), thickness=2, circle_radius=4),
                                 mp_drawing.DrawingSpec(color=(80,44,121), thickness=2, circle_radius=2)
        mp_drawing.draw_landmarks(image, results.left_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                 mp_drawing.DrawingSpec(color=(121,22,76), thickness=2, circle_radius=4),
                                 mp_drawing.DrawingSpec(color=(121,44,250), thickness=2, circle_radius=2)
        mp_drawing.draw_landmarks(image, results.pose_landmarks, mp_holistic.POSE_CONNECTIONS,
                                 mp_drawing.DrawingSpec(color=(245,117,66), thickness=2, circle_radius=4),
                                 mp_drawing.DrawingSpec(color=(245,66,230), thickness=2, circle_radius=2)
```

```
# Export coordinates
try:
    # Extract Pose landmarks
pose = results.pose_landmarks.landmark
pose_row = list(np.array([[landmark.x, landmark.y, landmark.visibility] for landmark in pose]).flatten())

# Extract Face landmarks
face = results.face_landmarks.landmark
face_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in face]).flatten())

# Concate rows
row = pose_row+face_row

# Append class name
row.insert(0, class_name)

# Export to CSV
with open('Open_body_language.csv', mode='a', newline='') as f:
    csv_writer = csv.writer(f, delimiter=',', quotechar=''', quoting=csv.QUOTE_MINIMAL)
    csv_writer.writerow(row)

except:
    pass

cv2.imshow('Raw Webcam Feed', image)

if cv2.waitKey(10) & 0xFF == ord('q'):
    break

cap.release()
cv2.destroyAllWindows()
```

Neutral body language :

```
import csv
import numpy as np
import mediapipe as mp
import numpy as np
mp_drawing = mp.solutions.drawing_utils # Drawing helpers
mp_holistic = mp.solutions.holistic # Mediapipe Solutions
num_coords = 501
landmarks = ['class']
for val in range(1, num_coords+1):
    landmarks += ['x{}'.format(val), 'y{}'.format(val), 'z{}'.format(val), 'v{}'.format(val)]
with open('Neutral_body_language.csv', mode='w', newline='') as f:
    csv_writer = csv.writer(f, delimiter=',', quotechar='"', quoting=csv.QUOTE_MINIMAL)
    csv_writer.writerow(landmarks)
class_name = "Neutral body language"
cap = cv2.VideoCapture(0)
# Initiate holistic model
with mp_holistic.Holistic(min_detection_confidence=0.5, min_tracking_confidence=0.5) as holistic:
    while cap.isOpened():
        ret, frame = cap.read()
        # Recolor Feed
        image = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
        image.flags.writeable = False
        results = holistic.process(image)
        # face_landmarks, pose_landmarks, left_hand_landmarks, right_hand_landmarks
        # Recolor image back to BGR for rendering
        image.flags.writeable = True
        image = cv2.cvtColor(image, cv2.COLOR_RGB2BGR)
        # 1. Draw face landmarks
        mp_drawing.draw_landmarks(image, results.face_landmarks, mp_holistic.FACEMESH_TESSELATION,
                                  mp_drawing.DrawingSpec(color=(80,110,10), thickness=1, circle_radius=1),
                                  mp_drawing.DrawingSpec(color=(80,256,121), thickness=1, circle_radius=1)
        # 2. Right hand
        mp_drawing.draw_landmarks(image, results.right_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                  mp_drawing.DrawingSpec(color=(80,22,10), thickness=2, circle_radius=4),
                                  mp_drawing.DrawingSpec(color=(80,44,121), thickness=2, circle_radius=2)
        # 3. Left Hand
        mp_drawing.draw_landmarks(image, results.left_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                  mp_drawing.DrawingSpec(color=(121,22,76), thickness=2, circle_radius=4),
                                  mp_drawing.DrawingSpec(color=(121,44,250), thickness=2, circle_radius=2)
        # 4. Pose Detections
        mp_drawing.draw_landmarks(image, results.pose_landmarks, mp_holistic.POSE_CONNECTIONS,
                                  mp_drawing.DrawingSpec(color=(245,117,66), thickness=2, circle_radius=4),
mp_drawing.DrawingSpec(color=(245,66,230), thickness=2, circle_radius=2)
```

- Closed body language:

```
import csv
import os
import numpy as np
import cv2
import mediapipe as mp
import numpy as np
mp_drawing = mp.solutions.drawing_utils # Drawing helpers
mp_holistic = mp.solutions.holistic # Mediapipe Solutions
num\_coords = 501
landmarks = ['class']
for val in range(1, num_coords+1):
    landmarks += ['x{}'.format(val), 'y{}'.format(val), 'z{}'.format(val), 'v{}'.format(val)]
with open('Closed_body_language.csv', mode='w', newline='') as f:
    csv_writer = csv.writer(f, delimiter=',', quotechar='"', quoting=csv.QUOTE_MINIMAL)
    csv_writer.writerow(landmarks)
class_name = "Closed body language"
cap = cv2.VideoCapture(0)
with mp_holistic.Holistic(min_detection_confidence=0.5, min_tracking_confidence=0.5) as holistic:
    while cap.isOpened():
        ret, frame = cap.read()
        # Recolor Feed
        image = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
        image.flags.writeable = False
        # Make Detections
        results = holistic.process(image)
        # print(results.face_landmarks)
        # Recolor image back to BGR for rendering
        image.flags.writeable = True
        image = cv2.cvtColor(image, cv2.COLOR_RGB2BGR)
        mp_drawing.draw_landmarks(image, results.face_landmarks, mp_holistic.FACEMESH_TESSELATION,
                                 mp_drawing.DrawingSpec(color=(80,110,10), thickness=1, circle_radius=1),
                                 mp_drawing.DrawingSpec(color=(80,256,121), thickness=1, circle_radius=1)
        mp_drawing.draw_landmarks(image, results.right_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                 mp_drawing.DrawingSpec(color=(80,22,10), thickness=2, circle_radius=4),
                                 mp_drawing.DrawingSpec(color=(80,44,121), thickness=2, circle_radius=2)
        mp_drawing.draw_landmarks(image, results.left_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                                 mp_drawing.DrawingSpec(color=(121,22,76), thickness=2, circle_radius=4),
                                 mp_drawing.DrawingSpec(color=(121,44,250), thickness=2, circle_radius=2)
        # 4. Pose Detections
        mp_drawing.draw_landmarks(image, results.pose_landmarks, mp_holistic.POSE_CONNECTIONS,
                                 mp_drawing.DrawingSpec(color=(245,117,66), thickness=2, circle_radius=4),
                                 mp_drawing.DrawingSpec(color=(245,66,230), thickness=2, circle_radius=2)
```

```
# Export coordinates
           # Extract Pose landmarks
           pose = results.pose_landmarks.landmark
           pose_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in pose]).flatten())
            face = results.face_landmarks.landmark
           face_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in face]).flatten())
           # Concate rows
           row = pose_row+face_row
           row.insert(0, class_name)
           with open('Closed_body_language.csv', mode='a', newline='') as f:
              csv_writer = csv.writer(f, delimiter=',', quotechar='"', quoting=csv.QUOTE_MINIMAL)
               csv_writer.writerow(row)
       cv2.imshow('Raw Webcam Feed', image)
       if cv2.waitKey(10) & 0xFF == ord('q'):
cap, release()
cv2.destroyAllWindows()
```

The codes for Smile, Eye contact and Space occupation follow the same principles of the previous codes.

3- Next I have a code that merges the three datasets that are stored in csv files (Open_body_language.csv, Neutral_body_language.csv, Closed_body_language.csv)) into a single one dataset(Merged_body_language.csv), meaning a single csv file:

```
import pandas as pd

# List of CSV files to merge
csv_files = ['Open_body_language.csv', 'Closed_body_language.csv', 'Neutral_body_language.csv']

# Read and concatenate all CSV files

df_list = [pd.read_csv(file) for file in csv_files]
merged_df = pd.concat(df_list, ignore_index=True)

# Save the merged DataFrame to a new CSV file
merged_df.to_csv('Merged_body_language.csv', index=False)
```

4- Now that the full dataset is ready, it's time to use a machine learning model (RandomForestClassifier) and train it on the ready dataset and finally store the trained

model in a pickle file (RandomForestClassifie.pkl):

```
import pandas as pd
from sklearn.model_selection import train_test_split
from sklearn.pipeline import make_pipeline
from sklearn.preprocessing import StandardScaler
from sklearn.ensemble import RandomForestClassifier
from sklearn.metrics import accuracy_score
import pickle
df = pd.read_csv('Merged_body_language.csv')
X = df.drop('class', axis=1) # features
y = df['class'] # target value
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3, random_state=1234)
pipelines = {
    'rf':make_pipeline(StandardScaler(), RandomForestClassifier()),
fit_models = {}
for algo, pipeline in pipelines.items():
    model = pipeline.fit(X_train, y_train)
    fit_models[algo] = model
for algo, model in fit_models.items():
    yhat = model.predict(X_test)
    print(algo, accuracy_score(y_test, yhat))
with open('RandomForestClassifie.pkl', 'wb') as f:
    pickle.dump(fit_models['rf'], f)
```

5- Now that everything is ready, we can make real life body language detection using the webcam:

```
import mediapipe as mp
import numpy as np
mp_drawing = mp.solutions.drawing_utils # Drawing helpers
mp_holistic = mp.solutions.holistic # Mediapipe Solutions
with open('RandomForestClassifie.pkl', 'rb') as f:
   model = pickle.load(f)
cap = cv2.VideoCapture(0)
# Initiate holistic mode
with mp_holistic.Holistic(min_detection_confidence=0.5, min_tracking_confidence=0.5) as holistic:
   while cap.isOpened():
       ret, frame = cap.read()
       image = cv2.cvtColor(frame, cv2.COLOR_BGR2RGB)
       image.flags.writeable = False
       results = holistic.process(image)
       # Recolor image back to BGR for rendering
       image.flags.writeable = True
       image = cv2.cvtColor(image, cv2.COLOR_RGB2BGR)
       mp_drawing.DrawingSpec(color=(80,110,10), thickness=1, circle_radius=1),
                               mp_drawing.DrawingSpec(color=(80,256,121), thickness=1, circle_radius=1)
       # 2. Right hand
       mp_drawing.draw_landmarks(image, results.right_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                               mp_drawing.DrawingSpec(color=(80,22,10), thickness=2, circle_radius=4),
                               mp_drawing.DrawingSpec(color=(80,44,121), thickness=2, circle_radius=2)
       mp_drawing.draw_landmarks(image, results.left_hand_landmarks, mp_holistic.HAND_CONNECTIONS,
                               mp_drawing.DrawingSpec(color=(121,22,76), thickness=2, circle_radius=4),
                               mp_drawing.DrawingSpec(color=(121,44,250), thickness=2, circle_radius=2)
       # 4. Pose Detections
       \label{lem:mp_drawing_problem} \verb|mp_drawing_Drawing_Spec(color=(245,117,66), thickness=2, circle_radius=4)|,
                               mp_drawing.DrawingSpec(color=(245,66,230), thickness=2, circle_radius=2)
       # Export coordinates
           pose = results.pose_landmarks.landmark
           pose_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in pose]).flatten())
           face = results.face_landmarks.landmark
           face_row = list(np.array([[landmark.x, landmark.y, landmark.z, landmark.visibility] for landmark in face]).flatten())
```

```
row = pose_row+face_row
             # Append class name
           # Make Detections
           X = pd.DataFrame([row])
           body_language_class = model.predict(X)[0]
            body_language_prob = model.predict_proba(X)[0]
           print(body_language_class, body_language_prob)
           # Grab ear coords
           coords = tuple(np.multiply(
                            np.array(
                                (results.pose\_landmarks.landmark[mp\_holistic.PoseLandmark.LEFT\_EAR].x,
                                 results.pose_landmarks.landmark[mp_holistic.PoseLandmark.LEFT_EAR].y))
                        , [640,480]).astype(int))
            cv2.rectangle(image,
                         (coords[0], coords[1]+5),
                          ({\tt coords[0]+len(body\_language\_class)*20,\ coords[1]-30),}\\
                          (245, 117, 16), -1)
            cv2.putText(image, body_language_class, coords,
                        cv2.FONT_HERSHEY_SIMPLEX, 1, (255, 255, 255), 2, cv2.LINE_AA)
           cv2.rectangle(image, (0,0), (250, 60), (245, 117, 16), -1)
            cv2.putText(image, 'CLASS'
                        , (95,12), cv2.FONT_HERSHEY_SIMPLEX, 0.5, (0, 0, 0), 1, cv2.LINE_AA)
            cv2.putText(image, body_language_class.split(' ')[0]
                       , (90,40), cv2.FONT_HERSHEY_SIMPLEX, 1, (255, 255, 255), 2, cv2.LINE_AA)
           # Display Probability
           cv2.putText(image, 'PROB'
                        , (15,12), cv2.FONT_HERSHEY_SIMPLEX, 0.5, (0, 0, 0), 1, cv2.LINE_AA)
            cv2.putText(image, str(round(body_language_prob[np.argmax(body_language_prob)],2))
                       , (10,40), cv2.FONT_HERSHEY_SIMPLEX, 1, (255, 255, 255), 2, cv2.LINE_AA)
        cv2.imshow('Raw Webcam Feed', image)
        if cv2.waitKey(10) & 0xFF == ord('q'):
cap.release()
cv2.destroyAllWindows()
print(results)
```

6- We will go one step further, and this time instead getting the video directly from the webcam, I will instead choose an already existing video, and link to it using it path. And we will add a function that will give the proportions of each body language type and we will finally print the results.

```
# Replace the path with your video file
video_path = '/Users/MAC/Desktop/titi.mov'
cap = cv2.VideoCapture(video_path)
detected_classes = [] # List to store detected class names
```

```
# Print the list of detected class names and their probabilities
print("Les proportions des langages corporelles:", calculate_probabilities(detected_classes, class_names_set1))
print("Les autres proportions:", calculate_probabilities(detected_classes, class_names_set2))
```

When we execute the code, we get the following things:

- A slowed video detecting the different types of body language.
- The proportions of each body type.