

Python for Data Analysis

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Summary :

- - Dataset presentation and problematic
- - Treatment of data
- - Machine learning
- - Django API
- - Conclusion

Dataset presentation

- The dataset contains 17 attributes and 2111 records, the records are labeled with the class variable Obesity_lvl, which can have the following values :
 - - Insufficient Weight
 - - Normal Weight
 - - Overweight Level I
 - - Overweight Level II
 - - Obesity Type I
 - - Obesity Type II
 - -Obesity Type III.
- **Problematic** : Can we predict someone's obesity level using the dataset ?

Treatment of data

Rename columns

- Firstly, let's rename columns with clearer names.

```
obesity_df.rename(columns = {'FAVC': 'Caloric_food',  
                             'FCVC': 'Veggies',  
                             'NCP': 'Nb_meals',  
                             'CAEC': 'Eat_between_meals',  
                             'SMOKE': 'Smoke',  
                             'CH2O': 'Water',  
                             'SCC': 'Monitor_calories',  
                             'FAF': 'Physical_activity',  
                             'TUE': 'Time_spent_on_tech',  
                             'CALC': 'Alcohol',  
                             'MTRANS': 'Transport_means',  
                             'NObeyesdad': 'Obesity_lvl'}, inplace = True)
```

Changing data type

- Now, let's set all numerical columns as int type columns and all object columns as category type columns.

```
# We set all numerical columns as int8 columns
for col in ["Age", "Veggies", "Nb_meals", "Water", "Physical_activity", "Time_spent_on_tech"]:
    obesity_df[col] = obesity_df[col].astype('int8')

# We also set object columns as categorical columns
for col in ['Gender', 'family_history_with_overweight', 'Caloric_food', 'Eat_between_meals', 'Smoke', 'Monitor_calories', 'Alcohol',
            'Transport_means', 'Obesity_lvl']:
    obesity_df[col] = obesity_df[col].astype('category')
```

#	Column	Non-Null Count	Dtype
0	Gender	2111 non-null	category
1	Age	2111 non-null	int8
2	Height	2111 non-null	float64
3	Weight	2111 non-null	float64
4	family_history_with_overweight	2111 non-null	category
5	Caloric_food	2111 non-null	category
6	Veggies	2111 non-null	int8
7	Nb_meals	2111 non-null	int8
8	Eat_between_meals	2111 non-null	category
9	Smoke	2111 non-null	category
10	Water	2111 non-null	int8
11	Monitor_calories	2111 non-null	category
12	Physical_activity	2111 non-null	int8
13	Time_spent_on_tech	2111 non-null	int8
14	Alcohol	2111 non-null	category
15	Transport_means	2111 non-null	object
16	Obesity_lvl	2111 non-null	category

For now, we keep some columns with category type because we first want to make some visualizations in the notebook.

Changing categorical data into numerical data

- Once we are done with visualizations, we can change categorical data into numerical data.
- Firstly, we set an order for categorical columns using '.cat.reorder_categories'.

```
obesity_df['Gender'].cat.reorder_categories(['Female', 'Male'], inplace=True)
obesity_df['family_history_with_overweight'].cat.reorder_categories(['no', 'yes'], inplace=True)
obesity_df['Caloric_food'].cat.reorder_categories(['no', 'yes'], inplace=True)
obesity_df['Eat_between_meals'].cat.reorder_categories(['no', 'Sometimes', 'Frequently', 'Always'], inplace=True)
obesity_df['Smoke'].cat.reorder_categories(['no', 'yes'], inplace=True)
obesity_df['Monitor_calories'].cat.reorder_categories(['no', 'yes'], inplace=True)
obesity_df['Alcohol'].cat.reorder_categories(['no', 'Sometimes', 'Frequently', 'Always'], inplace=True)
order= ['Insufficient_Weight', 'Normal_Weight', 'Overweight_Level_I', 'Overweight_Level_II', 'Obesity_Type_I', 'Obesity_Type_II', 'Obesity_Type_III']
obesity_df['Obesity_lvl'].cat.reorder_categories(order, inplace=True)
```

- Once values of each categorical column are ordered, we can change it into numeric data.

```
cat_columns = obesity_df.select_dtypes(['category']).columns
obesity_df[cat_columns] = obesity_df[cat_columns].apply(lambda x: x.cat.codes)
```

- Now, all the variables are numerical, except the Transport_means column but we will deal later with it.

```
obesity_df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2111 entries, 0 to 2110
Data columns (total 17 columns):
 #   Column                                Non-Null Count  Dtype
---  -
 0   Gender                                2111 non-null   int8
 1   Age                                    2111 non-null   int64
 2   Height                                2111 non-null   float64
 3   Weight                                2111 non-null   float64
 4   family_history_with_overweight        2111 non-null   int8
 5   Caloric_food                          2111 non-null   int8
 6   Veggies                               2111 non-null   int64
 7   Nb_meals                              2111 non-null   int64
 8   Eat_between_meals                     2111 non-null   int8
 9   Smoke                                 2111 non-null   int8
10  Water                                 2111 non-null   int64
11  Monitor_calories                      2111 non-null   int8
12  Physical_activity                     2111 non-null   int64
13  Time_spent_on_tech                    2111 non-null   int64
14  Alcohol                               2111 non-null   int8
15  Transport_means                       2111 non-null   object
16  Obesity_lvl                           2111 non-null   int8
dtypes: float64(2), int64(6), int8(8), object(1)
memory usage: 165.0+ KB
```


Transport_means column & Creation of new variables

- Values of Transport_means columns were not orderable. So, I modified the structure of data and create new columns using 'pd.get_dummies'.
- Then, we can drop Transport_means column without losing any information.

```
if set(['Transport_means']).issubset(obesity_df):  
    transport_dummies_obesity = pd.get_dummies(obesity_df['Transport_means'],drop_first=True)  
    obesity_df = obesity_df.join(transport_dummies_obesity)  
  
obesity_df = obesity_df.drop("Transport_means", axis=1)
```

- We have now 4 new columns : Bike, Motorbike, Public_Transportation, Walking.

obesity_df												
Eat_between_meals	Smoke	Water	Monitor_calories	Physical_activity	Time_spent_on_tech	Alcohol	Obesity_lvl	Bike	Motorbike	Public_Transportation	Walking	
1	0	2	0	0	1	0	1	0	0	1	0	
1	1	3	1	3	0	1	1	0	0	1	0	
1	0	2	0	2	1	2	1	0	0	1	0	

Machine learning

Split of the dataset

- Firstly, let's split data into training set and test set. 66% of data will be used to train the model and 33% to test the model.

```
X = obesity_df.drop("Obesity_lvl",axis=1)
Y = obesity_df["Obesity_lvl"]

X_train, X_test , Y_train , Y_test = train_test_split(X, Y, test_size=0.33, random_state=7)
```

Fitting data

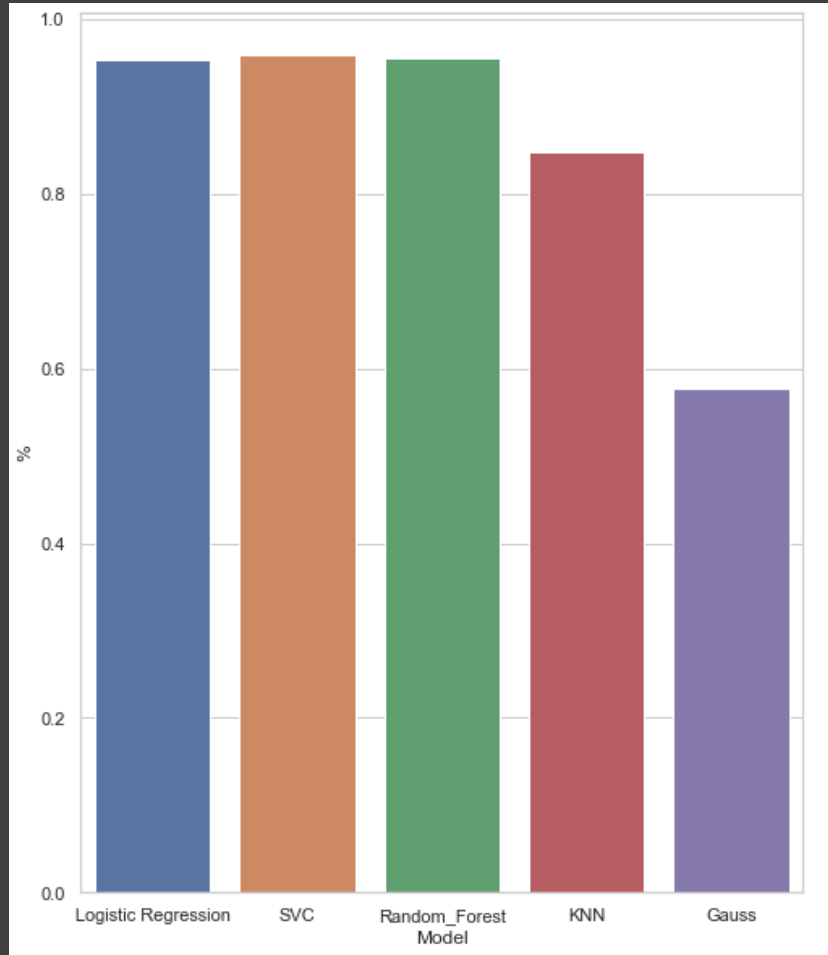
Let's fit training set to improve the accuracy of our machine learning algorithms.

```
scaler=StandardScaler()  
scaler.fit(X_train) #only fitting training set  
  
X_train=scaler.transform(X_train)  
X_test=scaler.transform(X_test)
```

Algorithms & GridSearch

- We will use the following algorithms from scikit-learn library :
- Logistic Regression
- Support Vector Machines
- Random Forest
- KNeighborsClassifier
- Gaussian Naive Bayes
- For each model, we firstly use a grid search to find the best hyperparameters. Then, we run each model with the best hyperparameters found. Finally, we add to `score_models` the score of each model.

Results of



	model_name	score
0	Logistic Regression	0.952654
1	SVC	0.959828
2	Random_Forest	0.955524
3	KNN	0.847920
4	Gauss	0.576758

We notice that 3 models hit a really good score (SVC, Random Forest and Logistic Regression). The best model seems to be SVC with 0.959828 of accuracy.

API Django

- I decided to use Django to make an API. How does it work ?
- Basically, we firstly we take data the user will post on the api.

```
def predict(request):  
    if request.method == 'POST':  
  
        Gender = int(request.POST['Gender'])  
        Age = int(request.POST['Age'])  
        Height = float(request.POST['Height'])  
        Weight = float(request.POST['Weight'])  
        family_history_with_overweight = int(request.POST['family_history_with_overweight'])  
        Caloric_food = int(request.POST['Caloric_food'])  
        Veggies = int(request.POST['Veggies'])  
        Nb_meals = int(request.POST['Nb_meals'])  
        Eat_between_meals = int(request.POST['Eat_between_meals'])  
        Smoke = int(request.POST['Smoke'])  
        Water = int(request.POST['Water'])  
        Monitor_calories = int(request.POST['Monitor_calories'])  
        Physical_activity = int(request.POST['Physical_activity'])  
        Time_spent_on_tech = int(request.POST['Time_spent_on_tech'])  
        Alcohol = int(request.POST['Alcohol'])  
  
        Transport_means = int(request.POST['Transport_means'])  
        temp_trans = [0 for i in range(0,4)]  
        temp_trans[Transport_means]=1
```


- Then, we call the best model we found previously from the notebook. (SCV)
- And we make the predictions on the test set.

```
d = os.getcwd() #adress of the project
filename = d+'Visu/static/model/model.sav'

loaded_model = pickle.load(open(filename, 'rb'))

predicts=[Gender,Age,Height,Weight,family_history_with_overweight,
          Caloric_food,Veggies,Nb_meals,Eat_between_meals,Smoke,Water,
          Monitor_calories,Physical_activity,Time_spent_on_tech,Alcohol]
predicts=predicts+temp_trans
# Prediction on Test set
y_pred = loaded_model.predict([predicts])
if (y_pred==0):
    y_pred="You have an Insufficient Weight. "
elif(y_pred==1):
    y_pred="You have a Normal Weight."
elif(y_pred==2):
    y_pred="You have a Level 1 OverWeight."
elif(y_pred==3):
    y_pred="You have a Level 2 OverWeight."
elif(y_pred==4):
    y_pred="You have an Obesity type 1."
elif(y_pred==5):
    y_pred="You have an Obesity type 2."
elif(y_pred==6):
    y_pred="You have an Obesity type 3."

context = {"y_pred": y_pred}
return render(request, "Visu/prediction.html", context)
```

- After that we must do 2 html pages. One that allows the user to enter data(index.html and one to show the results (prediction.html).

```
</div>
  <div>
    <label for="Transport_means">Transport_means :</label>
    <select name="Transport_means" id="Transport_means">
      <option value="0">Bike</option>
      <option value="1">Motorbike</option>
      <option value="2">Public Transportation</option>
      <option value="3">Walking</option>
    </select>
  </div>
  <br>
  <button type="submit" class="btn btn-danger">Predict obesity level</button>
</form>
</div>
```

Piece of index.html

```
<link rel="stylesheet" href="{% static 'css/style.css' %}">
<h2>{{y_pred}}</h2>
```

Prediction.html

- Finally, we add a style.css file to make the web page look nicer.

```
body {
  background-color: lightblue;
  width: 100%;
  height:100%;
  font-family: 'Open Sans', sans-serif;
  font-size: 18px;
  text-align:center;
}
```

Webpage 1

← → ↻ ⓘ 127.0.0.1:8000

This model predicts someone's obesity level

Gender : Female ▾

Age : 20 ▾

Height : 1.70 ▾

Weight : 120 ▾

family_history_with_overweight : No ▾

Caloric_food : No ▾

Veggies : Never ▾

Nb_meals : Between 1 and 2 ▾

Eat_between_meals : No ▾

Smoke : No ▾

Water : Less than 1L ▾

Monitor_calories : No ▾

Physical_activity : I do not have ▾

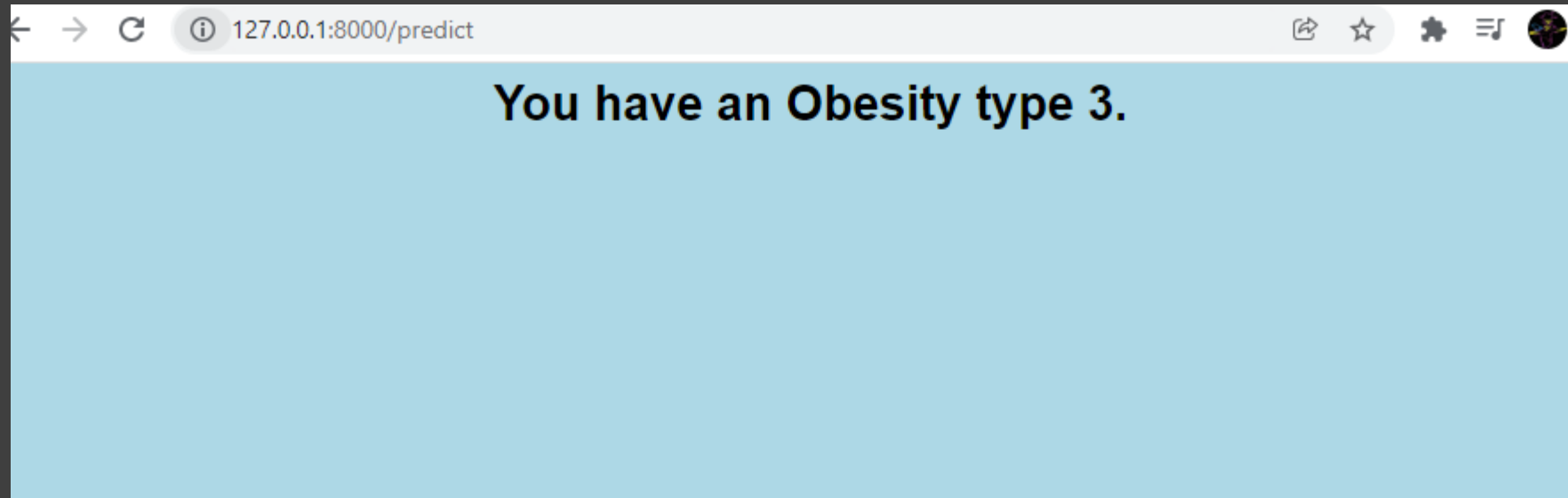
Time_spent_on_tech : 0-2 hours ▾

Alcohol : I do not drink ▾

Transport_means : Bike ▾

Predict obesity level

Webpage 2



Conclusion

- Finally, the best machine learning algorithm to predict someone's obesity level is SVC, with 0.959828 of accuracy.
- Random forest, logistic regression and Knn also had a great score.
- However, Gaussian algorithm was not performant, with 0.576758 of accuracy.