

Foodboost

February 21, 2023

```
[1]: # import necessary libraries - (CELL 1)
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt

# available dataframes
recipes = pd.read_csv("/data/foodboost/recipes.csv")
ingredients = pd.read_csv("/data/foodboost/ingredients.csv")
nutritions = pd.read_csv("/data/foodboost/nutritions.csv")
tags = pd.read_csv("/data/foodboost/tags.csv")
```

```
[2]: # EXPLORE: RECIPES DATAFRAME - (CELL 2)
display(recipes.head())
print(recipes.info())
display(recipes.describe())
print(recipes.shape)
```

	Unnamed: 0		title	persons	time	calories	\
0	0		Kruidnoten met choco-discodip	4	25	260	
1	0		Kruidnoten in marsepein	4	25	265	
2	0		Kruidnoten met chocodips	4	25	335	
3	0		Pepernotentaart met marsepeinstrik	10	30	560	
4	0		Perencake	12	10	265	

	stars		url	\
0	0		https://www.ah.nl/allerhande/recept/R-R1195893...	
1	0		https://www.ah.nl/allerhande/recept/R-R1195892...	
2	0		https://www.ah.nl/allerhande/recept/R-R1195891...	
3	0		https://www.ah.nl/allerhande/recept/R-R1195887...	
4	0		https://www.ah.nl/allerhande/recept/R-R1195790...	

		image
0		https://static.ah.nl/static/recepten/img_RAM_P...
1		https://static.ah.nl/static/recepten/img_RAM_P...
2		https://static.ah.nl/static/recepten/img_RAM_P...
3		https://static.ah.nl/static/recepten/img_RAM_P...
4		https://static.ah.nl/static/recepten/img_RAM_P...

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8706 entries, 0 to 8705
Data columns (total 8 columns):
#   Column      Non-Null Count  Dtype
---  -
0   Unnamed: 0   8706 non-null   int64
1   title        8706 non-null   object
2   persons      8706 non-null   int64
3   time         8706 non-null   int64
4   calories     8706 non-null   int64
5   stars        8706 non-null   int64
6   url          8706 non-null   object
7   image        8706 non-null   object
dtypes: int64(5), object(3)
memory usage: 544.2+ KB
None
```

	Unnamed: 0	persons	time	calories	stars
count	8706.0	8706.000000	8706.000000	8706.000000	8706.0
mean	0.0	5.405697	22.093039	453.029405	0.0
std	0.0	4.791495	13.387928	231.581738	0.0
min	0.0	1.000000	1.000000	0.000000	0.0
25%	0.0	4.000000	15.000000	270.000000	0.0
50%	0.0	4.000000	20.000000	460.000000	0.0
75%	0.0	4.000000	30.000000	615.000000	0.0
max	0.0	100.000000	320.000000	3320.000000	0.0

(8706, 8)

```
[3]: # DATA PREPROCESSING 1: some title errors (& & nbsp;) due to HTML web
      ↪scraping - (CELL 3)

error_replacement = {
    '&': '&',
    '& nbsp;': ' '
}

affected_dfs = [(recipes, 'title'), (ingredients, 'recipe'), (nutritions,
      ↪'recipe'), (tags, 'recipe'), (tags, 'tag')]

# execute for each error in each dataframe column
for df in affected_dfs:
    for error in error_replacement.keys():
        # find error titles
        error_filter = df[0][df[1]].str.contains(error)
        error_titles = df[0].loc[error_filter, df[1]]
        #print(error_titles.head())
```

```

    # quantify the amount of errors
    error_count = len(error_titles)
    error_perc = round((error_count / len(df[0][df[1]])) * 100, 1)
    print(f'Total of {error_count} {error} errors which is {error_perc}%\n
↳of all rows')

    # fix errors
    df[0][df[1]] = df[0][df[1]].str.replace(error, error_replacement.
↳get(error))
    print(f'{error} error has been fixed')

    # check if errors still exist
    corrected_filter = df[0][df[1]].str.contains(error_replacement.
↳get(error))
    corrected_titles = df[0].loc[corrected_filter, df[1]]
    #print(corrected_titles.head())
    error_titles = df[0].loc[error_filter, df[1]]
    error_count = len(error_titles)
    error_perc = round((error_count / len(df[0][df[1]])) * 100, 1)
    print(f'Total of {error_count} {error} errors which is {error_perc}%\n
↳of all rows \n')

    # TO DO: assert statements

```

Total of 646 & errors which is 7.4% of all rows
& error has been fixed
Total of 646 & errors which is 7.4% of all rows

Total of 2 & errors which is 0.0% of all rows
& error has been fixed
Total of 2 & errors which is 0.0% of all rows

Total of 5646 & errors which is 7.9% of all rows
& error has been fixed
Total of 5646 & errors which is 7.9% of all rows

Total of 16 & errors which is 0.0% of all rows
& error has been fixed
Total of 16 & errors which is 0.0% of all rows

Total of 4634 & errors which is 7.9% of all rows
& error has been fixed
Total of 4634 & errors which is 7.9% of all rows

Total of 16 & errors which is 0.0% of all rows
& error has been fixed
Total of 16 & errors which is 0.0% of all rows

Total of 3266 & errors which is 7.1% of all rows
& error has been fixed

Total of 3266 & errors which is 7.1% of all rows

Total of 9 & errors which is 0.0% of all rows
& error has been fixed

Total of 9 & errors which is 0.0% of all rows

Total of 283 & errors which is 0.6% of all rows
& error has been fixed

Total of 283 & errors which is 0.6% of all rows

Total of 0 & errors which is 0.0% of all rows
& error has been fixed

Total of 0 & errors which is 0.0% of all rows

```
[4]: # DATA PREPROCESSING 2: some useless columns (Unnamed: 0) - (CELL 4)
```

```
# delete unnecessary columns
recipes.drop(columns='Unnamed: 0', inplace=True)
ingredients.drop(columns='Unnamed: 0', inplace=True)
nutritions.drop(columns='Unnamed: 0', inplace=True)
tags.drop(columns='Unnamed: 0', inplace=True)
```

```
[5]: # EXPLORE: NUTRITIONS DATAFRAME - (CELL 5)
```

```
display(nutritions.head(10), "\n")
print(nutritions.info(), "\n")
display(nutritions.describe(), "\n")
print(nutritions.shape, "\n")
```

	recipe	nutrition	value
0	Kruidnoten met choco-discodip	energie	260 kcal
1	Kruidnoten met choco-discodip	koolhydraten	34 g
2	Kruidnoten met choco-discodip	waarvan suikers	22 g
3	Kruidnoten met choco-discodip	natrium	200 mg
4	Kruidnoten met choco-discodip	eiwit	3 g
5	Kruidnoten met choco-discodip	vet	12 g
6	Kruidnoten met choco-discodip	waarvan verzadigd	7 g
7	Kruidnoten met choco-discodip	vezels	1 g
8	Kruidnoten in marsepein	energie	265 kcal
9	Kruidnoten in marsepein	koolhydraten	43 g

'\n'

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 58765 entries, 0 to 58764
Data columns (total 3 columns):
```

#	Column	Non-Null Count	Dtype
0	recipe	58765 non-null	object
1	nutrition	58765 non-null	object
2	value	58765 non-null	object

dtypes: object(3)
memory usage: 1.3+ MB
None

	recipe	nutrition	value
count	58765	58765	58765
unique	8706	8	1192
top	Kruidnoten met choco-discodip	energie	1 g
freq	8	8706	2079

'\n'

(58765, 3)

```
[6]: # get unique nutrition categories and quantify (1 recipe has a maximum of 8
      ↪ nutrition categories) - (CELL 6)
      nutritions_categories = nutritions['nutrition'].unique()
      print(nutritions_categories, '\n')

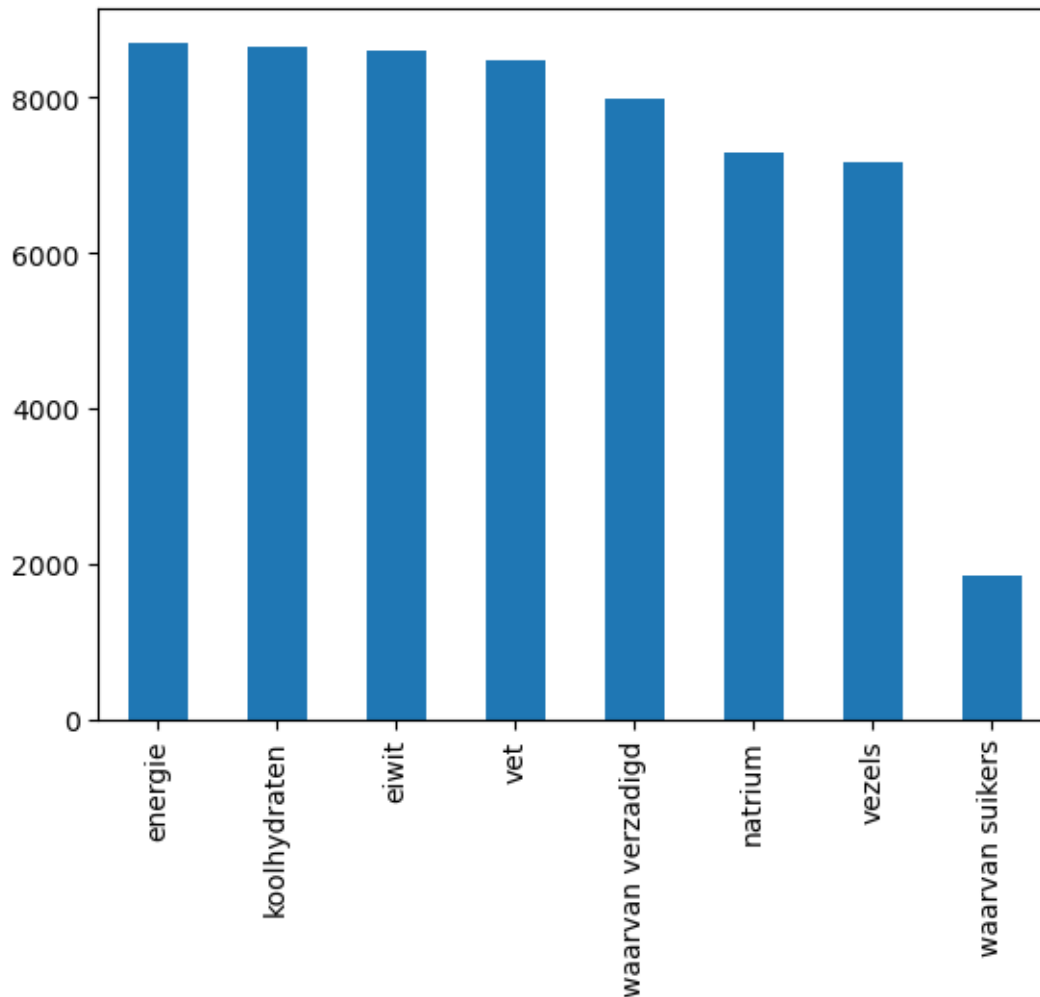
      nutritions_counts = nutritions['nutrition'].value_counts()
      print(nutritions_counts)
      nutritions_counts.plot.bar()

      # create filter for each category
      nutritions_filters = {}
      for category in nutritions_categories:
          nutritions_filters.update({category: nutritions['nutrition'] == category})
```

```
['energie' 'koolhydraten' 'waarvan suikers' 'natrium' 'eiwit' 'vet'
 'waarvan verzadigd' 'vezels']
```

energie	8706
koolhydraten	8663
eiwit	8596
vet	8480
waarvan verzadigd	7992
natrium	7302
vezels	7173
waarvan suikers	1853

Name: nutrition, dtype: int64



```
[7]: # ANALYSE 1: ENERGY CATEGORY - (CELL 7)

# make dataframe copy for energy
nutritions_energy = nutritions[nutritions_filters.get('energie')].copy()
nutritions_energy = nutritions_energy.set_index('recipe')

# convert 'value' column type to int64
nutritions_energy['value'] = nutritions_energy['value'].str.replace(' kcal', ' ')
nutritions_energy['value'] = nutritions_energy['value'].astype(int)

# retain unit of measurement
nutritions_energy['unit'] = 'kcal'
display(nutritions_energy.head())

# histogram and boxplot of energy
fig, (energy_ax1, energy_ax2) = plt.subplots(1, 2)
```

```

fig.tight_layout(pad=2.0)

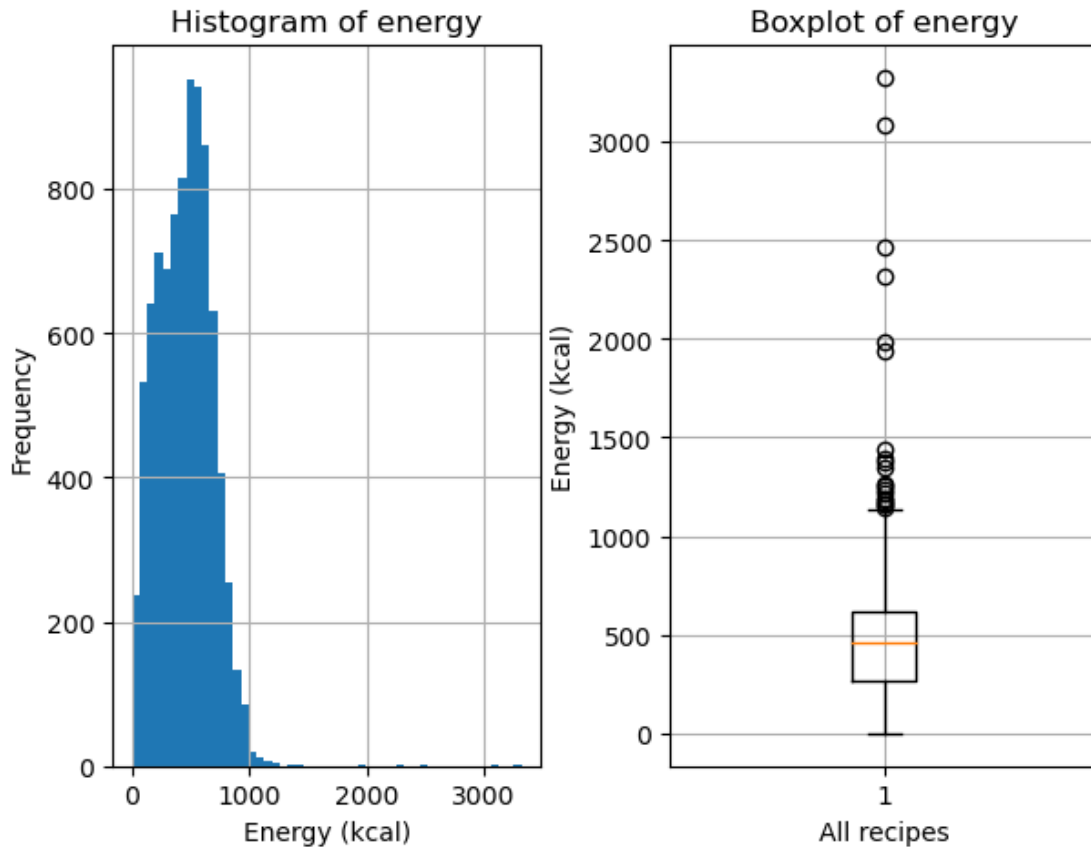
# histogram
energy_ax1.hist(nutritions_energy['value'], bins=50)
energy_ax1.set_xlabel('Energy (kcal)')
energy_ax1.set_ylabel('Frequency')
energy_ax1.set_title('Histogram of energy')
energy_ax1.grid()

# boxplot
energy_ax2.boxplot(nutritions_energy['value'])
energy_ax2.set_xlabel('All recipes')
energy_ax2.set_ylabel('Energy (kcal)')
energy_ax2.set_title('Boxplot of energy')
energy_ax2.grid()

plt.show()

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	energie	260	kcal
Kruidnoten in marsepein	energie	265	kcal
Kruidnoten met chocodips	energie	335	kcal
Pepernotentaart met marsepeinstrik	energie	560	kcal
Perencake	energie	265	kcal



```
[8]: # ANALYSE 2: NATRIUM CATEGORY - (CELL 8)

# make dataframe copy for natrium
nutritions_natrium = nutritions[nutritions_filters.get('natrium')].copy()
nutritions_natrium = nutritions_natrium.set_index('recipe')

# convert 'value' column type to int64
nutritions_natrium['value'] = nutritions_natrium['value'].str.replace(' mg', ' ')
nutritions_natrium['value'] = nutritions_natrium['value'].astype(float).astype(int)

# retain unit of measurement
nutritions_natrium['unit'] = 'mg'
display(nutritions_natrium.head())

# histogram and boxplot of natrium
fig, (natrium_ax1, natrium_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

# histogram
natrium_ax1.hist(nutritions_natrium['value'], bins=50)
```



```

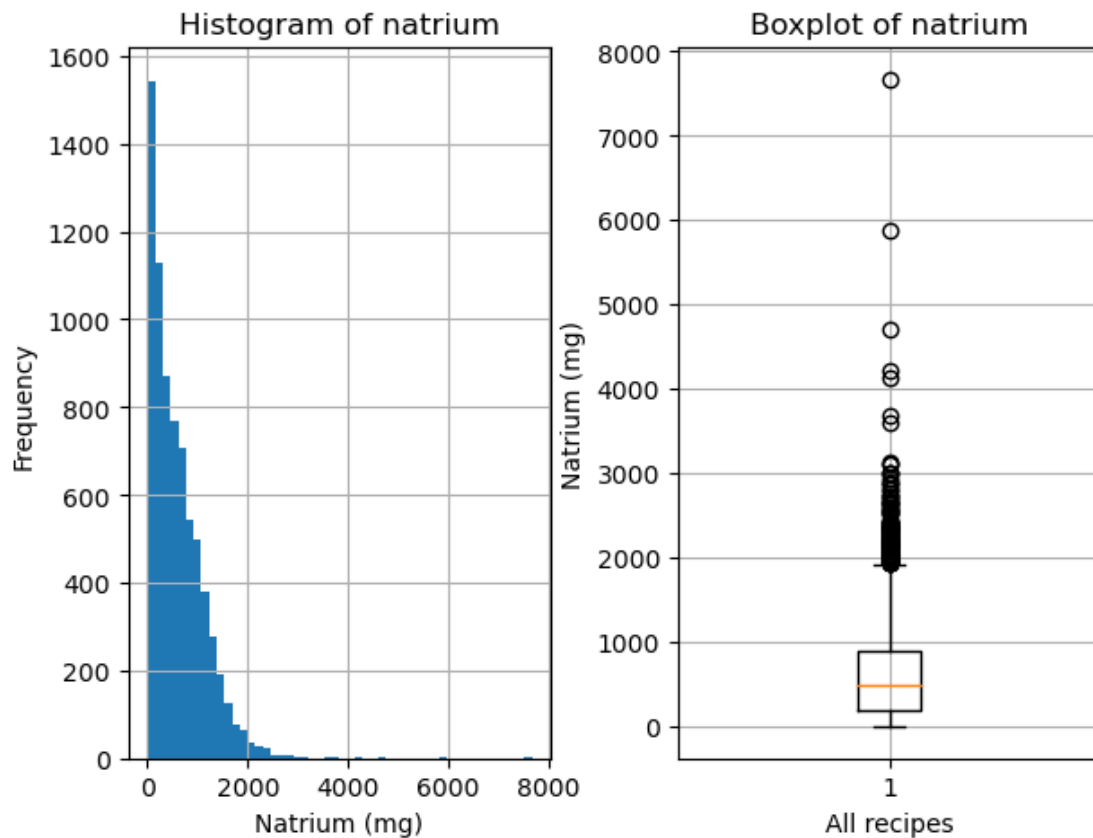
natrium_ax1.set_xlabel('Natrium (mg)')
natrium_ax1.set_ylabel('Frequency')
natrium_ax1.set_title('Histogram of natrium')
natrium_ax1.grid()

# boxplot
natrium_ax2.boxplot(nutritions_natrium['value'])
natrium_ax2.set_xlabel('All recipes')
natrium_ax2.set_ylabel('Natrium (mg)')
natrium_ax2.set_title('Boxplot of natrium')
natrium_ax2.grid()

plt.show()

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	natrium	200	mg
Kruidnoten in marsepein	natrium	120	mg
Kruidnoten met chocodips	natrium	160	mg
Pepernotentaart met marsepeinstrik	natrium	240	mg
Perencake	natrium	120	mg



```
[9]: # ANALYSE 3: EIWIT CATEGORY - (CELL 9)

# make dataframe copy for protein
nutritions_protein = nutritions[nutritions_filters.get('eiwit')].copy()
nutritions_protein = nutritions_protein.set_index('recipe')

# convert 'value' column type to int64
nutritions_protein['value'] = nutritions_protein['value'].str.replace(' g', '').
    ↪ astype(float).astype(int)

# retain unit of measurement
nutritions_protein['unit'] = 'g'
display(nutritions_protein.head())

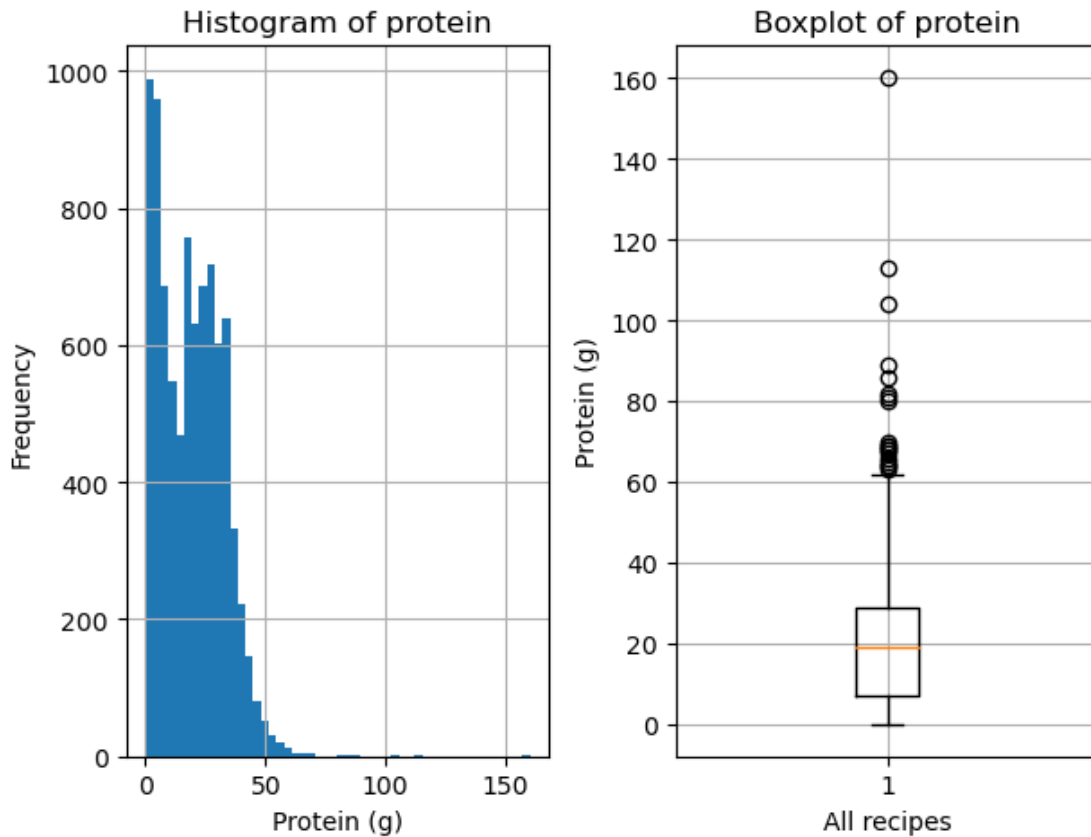
# histogram and boxplot of protein
fig, (protein_ax1, protein_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

# histogram
protein_ax1.hist(nutritions_protein['value'], bins=50)
protein_ax1.set_xlabel('Protein (g)')
protein_ax1.set_ylabel('Frequency')
protein_ax1.set_title('Histogram of protein')
protein_ax1.grid()

# boxplot
protein_ax2.boxplot(nutritions_protein['value'])
protein_ax2.set_xlabel('All recipes')
protein_ax2.set_ylabel('Protein (g)')
protein_ax2.set_title('Boxplot of protein')
protein_ax2.grid()

plt.show()
```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	eiwit	3	g
Kruidnoten in marsepein	eiwit	3	g
Kruidnoten met chocodips	eiwit	5	g
Pepernotentaart met marsepeinstrik	eiwit	5	g
Perencake	eiwit	5	g



```
[10]: # ANALYSE 4: VEZELS CATEGORY - (CELL 10)

# make dataframe copy for fiber
nutritions_fiber = nutritions[nutritions_filters.get('vezels')].copy()
nutritions_fiber = nutritions_fiber.set_index('recipe')

# convert 'value' column type to int64
nutritions_fiber['value'] = nutritions_fiber['value'].str.replace(' g', '').
    ↪ astype(float).astype(int)

# retain unit of measurement
nutritions_fiber['unit'] = 'g'
display(nutritions_fiber.head())

# very large outlier filtering
fiber_outlier_filter = nutritions_fiber['value'] < 85
# fiber_values = nutritions_fiber['value'].value_counts()
# print(fiber_values)

# histogram and boxplot of fiber
```

```

fig, (fiber_ax1, fiber_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

# histogram
fiber_ax1.hist(nutritions_fiber.loc[fiber_outlier_filter, 'value'], bins=50)
fiber_ax1.set_xlabel('Fiber (g)')
fiber_ax1.set_ylabel('Frequency')
fiber_ax1.set_title('Histogram of fiber')
fiber_ax1.grid()

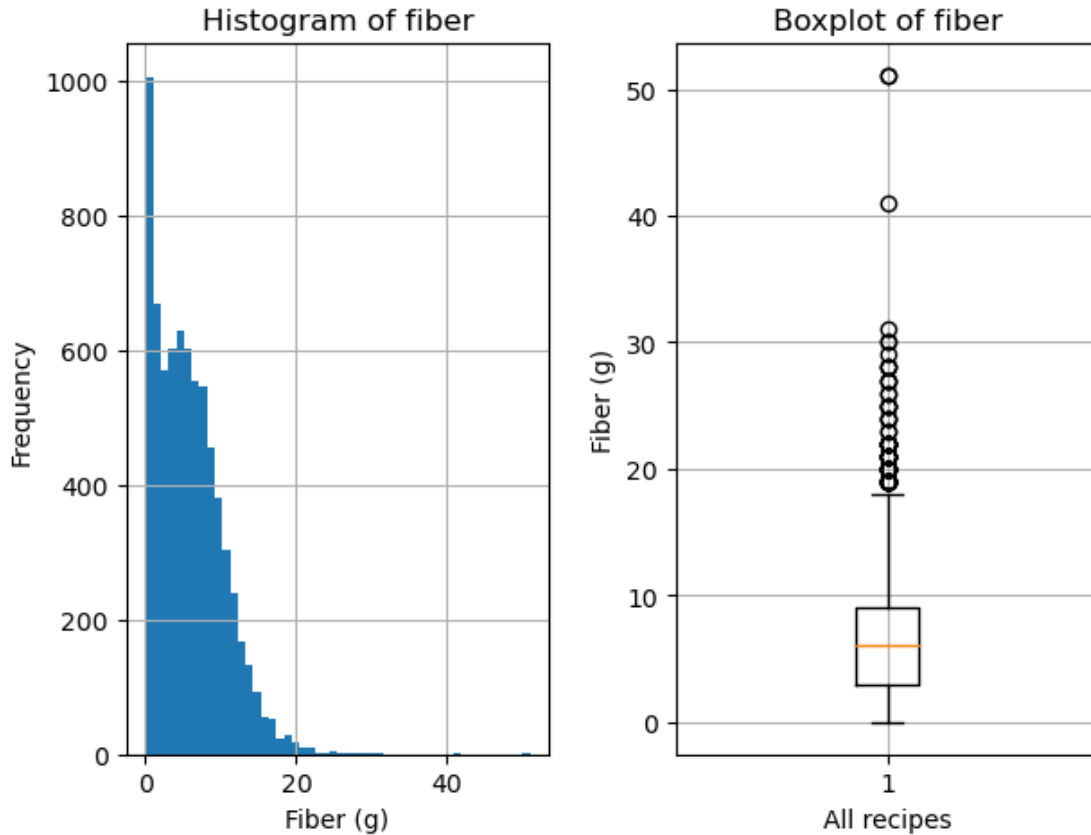
# boxplot
fiber_ax2.boxplot(nutritions_fiber.loc[fiber_outlier_filter, 'value'])
fiber_ax2.set_xlabel('All recipes')
fiber_ax2.set_ylabel('Fiber (g)')
fiber_ax2.set_title('Boxplot of fiber')
fiber_ax2.grid()

plt.show()

# show excluded outliers
fiber_excluded = nutritions_fiber[~fiber_outlier_filter]
display(fiber_excluded)

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	vezels	1	g
Kruidnoten in marsepein	vezels	1	g
Kruidnoten met chocodips	vezels	6	g
Pepernotentaart met marsepeinstrik	vezels	1	g
Perencake	vezels	1	g



	nutrition	value	unit
recipe			
Gevulde flatbreads met vegaballetjes en zelfgem...	vezels	1640	g
Bart van Olphens zalmcarpaccio	vezels	190	g
Roggebrood met noten en bessen	vezels	85	g
Pompoen-kaasschotel	vezels	400	g

```
[11]: # ANALYSE 5: KOOLHYDRATEN CATEGORY - (CELL 11)

# make dataframe copy for carbohydrates
nutritions_carbs = nutritions[nutritions_filters.get('koolhydraten')].copy()
nutritions_carbs = nutritions_carbs.set_index('recipe')

# convert 'value' column type to int64
nutritions_carbs['value'] = nutritions_carbs['value'].str.replace(' g', '').
    .astype(float).astype(int)

# retain unit of measurement
nutritions_carbs['unit'] = 'g'
display(nutritions_carbs.head())
```

```

# histogram and boxplot of carbohydrates
fig, (carbs_ax1, carbs_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

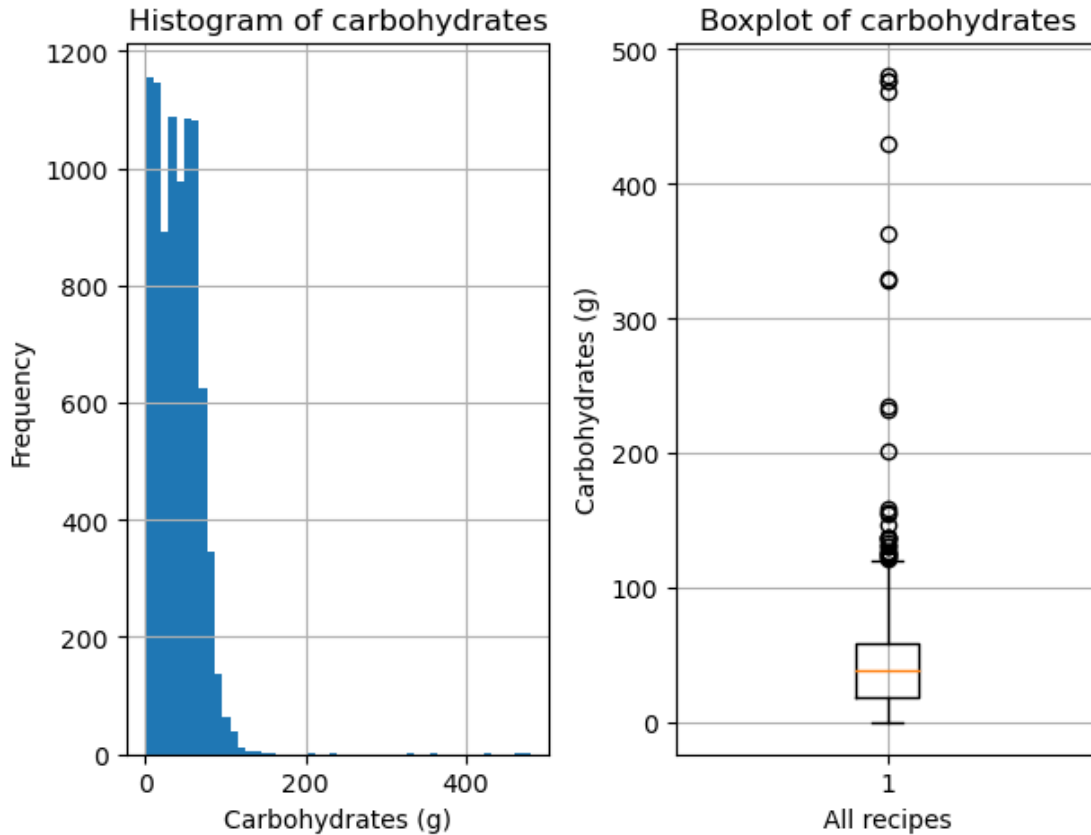
# histogram
carbs_ax1.hist(nutritions_carbs['value'], bins=50)
carbs_ax1.set_xlabel('Carbohydrates (g)')
carbs_ax1.set_ylabel('Frequency')
carbs_ax1.set_title('Histogram of carbohydrates')
carbs_ax1.grid()

# boxplot
carbs_ax2.boxplot(nutritions_carbs['value'])
carbs_ax2.set_xlabel('All recipes')
carbs_ax2.set_ylabel('Carbohydrates (g)')
carbs_ax2.set_title('Boxplot of carbohydrates')
carbs_ax2.grid()

plt.show()

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	koolhydraten	34	g
Kruidnoten in marsepein	koolhydraten	43	g
Kruidnoten met chocodips	koolhydraten	35	g
Pepernotentaart met marsepeinstrik	koolhydraten	60	g
Perencake	koolhydraten	36	g



```
[12]: # ANALYSE 6: WAARVAN SUIKERS CATEGORY - (CELL 12)

# make dataframe copy for sugar
nutritions_sugar = nutritions[nutritions_filters.get('waarvan suikers')].copy()
nutritions_sugar = nutritions_sugar.set_index('recipe')

# convert 'value' column type to int64
nutritions_sugar['value'] = nutritions_sugar['value'].str.replace(' g', '').
    ↳ astype(float).astype(int)

# retain unit of measurement
nutritions_sugar['unit'] = 'g'
display(nutritions_sugar.head())

# very large outlier filtering
sugar_outlier_filter = nutritions_sugar['value'] < 100
# sugar_values = nutritions_sugar['value'].value_counts()
# print(fiber_values)

# histogram and boxplot of sugar
```

```

fig, (sugar_ax1, sugar_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

# histogram
sugar_ax1.hist(nutritions_sugar.loc[sugar_outlier_filter, 'value'], bins=50)
sugar_ax1.set_xlabel('Sugar (g)')
sugar_ax1.set_ylabel('Frequency')
sugar_ax1.set_title('Histogram of sugar')
sugar_ax1.grid()

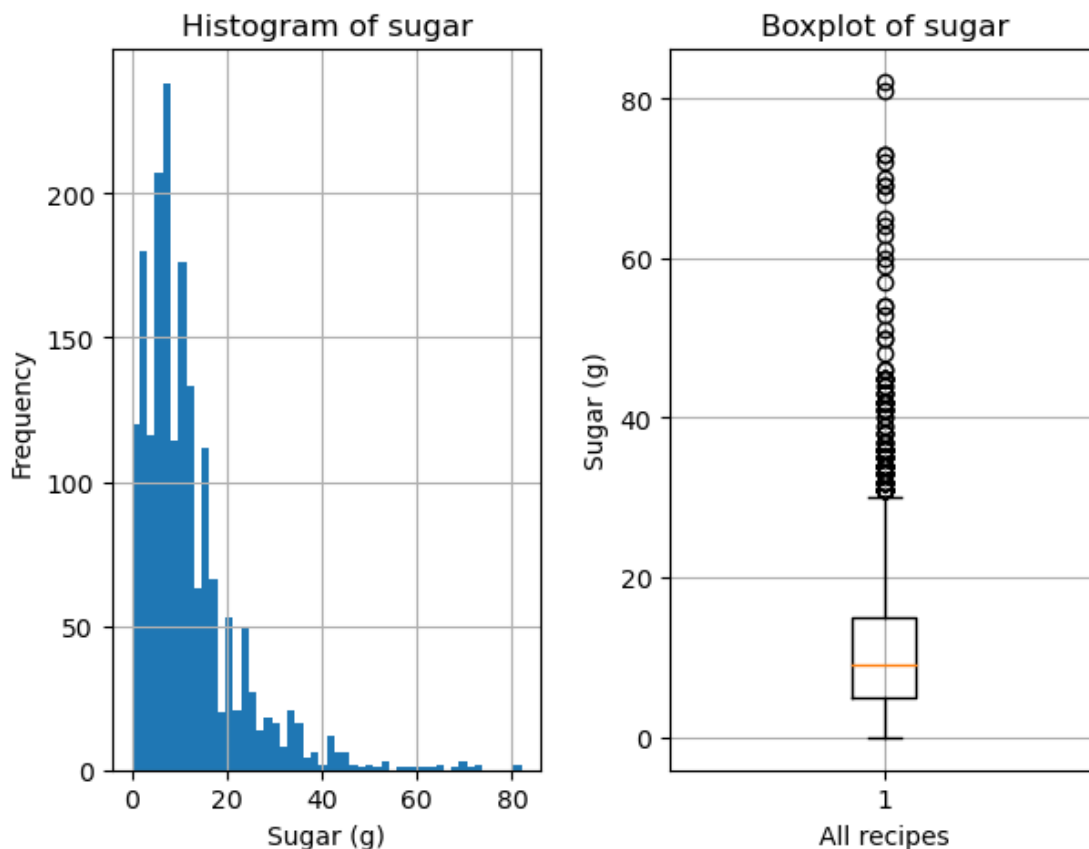
# boxplot
sugar_ax2.boxplot(nutritions_sugar.loc[sugar_outlier_filter, 'value'])
sugar_ax2.set_xlabel('All recipes')
sugar_ax2.set_ylabel('Sugar (g)')
sugar_ax2.set_title('Boxplot of sugar')
sugar_ax2.grid()

plt.show()

# show excluded outliers
sugar_excluded = nutritions_sugar[~sugar_outlier_filter]
display(sugar_excluded)

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	waarvan suikers	22	g
Kruidnoten in marsepein	waarvan suikers	34	g
Kruidnoten met chocodips	waarvan suikers	23	g
Pepernotentaart met marsepeinstrik	waarvan suikers	39	g
Perencake	waarvan suikers	21	g



	nutrition	value	unit
recipe			
Nectarinejam	waarvan suikers	201	g
Druivenjam maken	waarvan suikers	233	g
Appelschillenboter	waarvan suikers	125	g

[13]: *# ANALYSE 7: VET CATEGORY - (CELL 13)*

```
# make dataframe copy for fat
nutritions_fat = nutritions[nutritions_filters.get('vet')].copy()
nutritions_fat = nutritions_fat.set_index('recipe')

# convert 'value' column type to int64
nutritions_fat['value'] = nutritions_fat['value'].str.replace(' g', '').
    .astype(float).astype(int)

# retain unit of measurement
nutritions_fat['unit'] = 'g'
display(nutritions_fat.head())
```

```

# very large outlier filtering
fat_outlier_filter = nutritions_fat['value'] < 125
# fat_values = nutritions_fat['value'].value_counts()
# print(fat_values)

# histogram and boxplot of fat
fig, (fat_ax1, fat_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

# histogram
fat_ax1.hist(nutritions_fat.loc[fat_outlier_filter, 'value'], bins=50)
fat_ax1.set_xlabel('Fat (g)')
fat_ax1.set_ylabel('Frequency')
fat_ax1.set_title('Histogram of fat')
fat_ax1.grid()

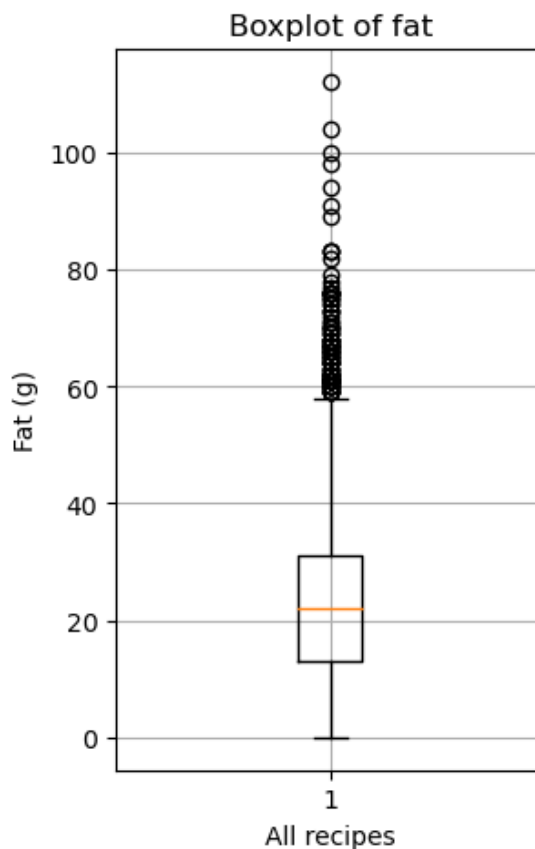
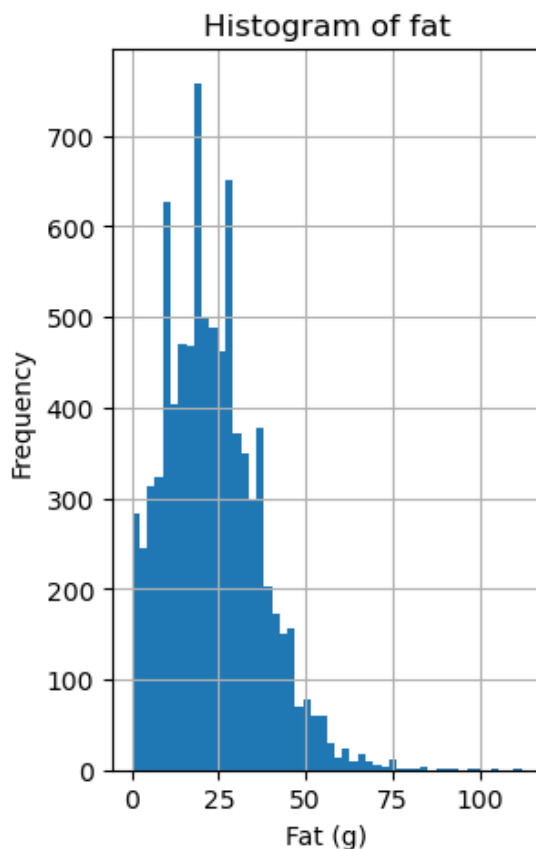
# boxplot
fat_ax2.boxplot(nutritions_fat.loc[fat_outlier_filter, 'value'])
fat_ax2.set_xlabel('All recipes')
fat_ax2.set_ylabel('Fat (g)')
fat_ax2.set_title('Boxplot of fat')
fat_ax2.grid()

plt.show()

# show excluded outliers
fat_excluded = nutritions_fat[~fat_outlier_filter]
display(fat_excluded)

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	vet	12	g
Kruidnoten in marsepein	vet	9	g
Kruidnoten met chocodips	vet	18	g
Pepernotentaart met marsepeinstrik	vet	33	g
Perencake	vet	11	g



	nutrition	value	unit
recipe			
Zelfgemaakte pindakaas	vet	253	g

```
[14]: # ANALYSE 8: WAARVAN VERZADIGD CATEGORY - (CELL 14)

# make dataframe copy for saturated fat
nutritions_saturated = nutritions_filters.get('waarvan verzadigd').
    ↪ copy()
nutritions_saturated = nutritions_saturated.set_index('recipe')

# convert 'value' column type to int64
nutritions_saturated['value'] = nutritions_saturated['value'].str.replace(' g', '
    ↪ ').astype(float).astype(int)

# retain unit of measurement
nutritions_saturated['unit'] = 'g'
display(nutritions_saturated.head())

# very large outlier filtering
```

```

saturated_outlier_filter = nutritions_saturated['value'] < 60
# saturated_values = nutritions_saturated['value'].value_counts()
# print(saturated_values)

# histogram and boxplot of saturated fat
fig, (saturated_ax1, saturated_ax2) = plt.subplots(1, 2)
fig.tight_layout(pad=2.0)

# histogram
saturated_ax1.hist(nutritions_saturated.loc[saturated_outlier_filter, 'value'],
    ↪bins=50)
saturated_ax1.set_xlabel('Saturated fat (g)')
saturated_ax1.set_ylabel('Frequency')
saturated_ax1.set_title('Histogram of saturated fat')
saturated_ax1.grid()

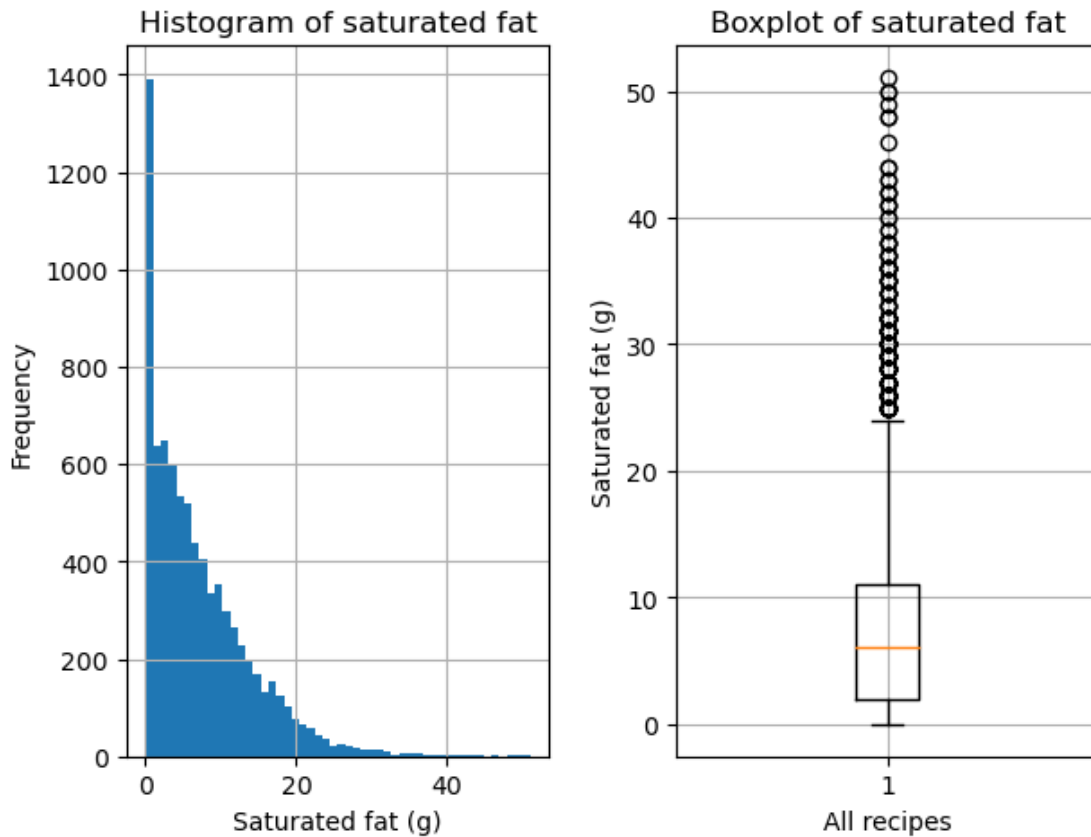
# boxplot
saturated_ax2.boxplot(nutritions_saturated.loc[saturated_outlier_filter,
    ↪'value'])
saturated_ax2.set_xlabel('All recipes')
saturated_ax2.set_ylabel('Saturated fat (g)')
saturated_ax2.set_title('Boxplot of saturated fat')
saturated_ax2.grid()

plt.show()

# show excluded outliers
saturated_excluded = nutritions_saturated[~saturated_outlier_filter]
display(saturated_excluded)

```

	nutrition	value	unit
recipe			
Kruidnoten met choco-discodip	waarvan verzadigd	7	g
Kruidnoten in marsepein	waarvan verzadigd	4	g
Kruidnoten met chocodips	waarvan verzadigd	10	g
Pepernotentaart met marsepeinstrik	waarvan verzadigd	21	g
Perencake	waarvan verzadigd	2	g



	nutrition	value \
recipe		
Broodje kipburger met snelle salade	waarvan verzadigd	100
Rendang Padang van Vanja van der Leeden	waarvan verzadigd	68
Runderballetjes met broccoli & kikkererwten uit...	waarvan verzadigd	111

	unit
recipe	
Broodje kipburger met snelle salade	g
Rendang Padang van Vanja van der Leeden	g
Runderballetjes met broccoli & kikkererwten uit...	g

```
[15]: # CREATE FINAL DATAFRAME 'food' - (CELL 15)

food = recipes.loc[:, 'title'].to_frame().copy()
food = food.rename(columns={'title': 'recipe'})
food = food.set_index('recipe')

# link category 1: energy
food = food.join(nutritions_energy)
```

```

food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'energy_kcal'})
food['energy_kcal'] = food['energy_kcal'].fillna(0)
food['energy_kcal'] = food['energy_kcal'].astype(int)

# link category 2: natrium
food = food.join(nutritions_natrium)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'natrium_mg'})
food['natrium_mg'] = food['natrium_mg'].fillna(0)
food['natrium_mg'] = food['natrium_mg'].astype(int)

# link category 3: protein
food = food.join(nutritions_protein)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'protein_g'})
food['protein_g'] = food['protein_g'].fillna(0)
food['protein_g'] = food['protein_g'].astype(int)

# link category 4: fiber
food = food.join(nutritions_fiber)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'fiber_g'})
food['fiber_g'] = food['fiber_g'].fillna(0)
food['fiber_g'] = food['fiber_g'].astype(int)

# link category 5: carbohydrates
food = food.join(nutritions_carbs)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'carbohydrates_total_g'})
food['carbohydrates_total_g'] = food['carbohydrates_total_g'].fillna(0)
food['carbohydrates_total_g'] = food['carbohydrates_total_g'].astype(int)

# link category 6: sugar
food = food.join(nutritions_sugar)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'carbohydrates_sugar_g'})
food['carbohydrates_sugar_g'] = food['carbohydrates_sugar_g'].fillna(0)
food['carbohydrates_sugar_g'] = food['carbohydrates_sugar_g'].astype(int)

# link category 7: fat
food = food.join(nutritions_fat)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'fat_total_g'})
food['fat_total_g'] = food['fat_total_g'].fillna(0)
food['fat_total_g'] = food['fat_total_g'].astype(int)

```

```
# link category 8: saturated
food = food.join(nutritions_saturated)
food = food.drop(columns=['nutrition', 'unit'])
food = food.rename(columns={'value': 'fat_saturated_g'})
food['fat_saturated_g'] = food['fat_saturated_g'].fillna(0)
food['fat_saturated_g'] = food['fat_saturated_g'].astype(int)

display(food)
print(food.info())
```

	energy_kcal	sodium_mg	protein_g	\
recipe				
Kruidnoten met choco-discodip	260	200	3	
Kruidnoten in marsepein	265	120	3	
Kruidnoten met chocodips	335	160	5	
Pepernotentaart met marsepeinstrik	560	240	5	
Perencake	265	120	5	
...	
Paddenstoelen en courgettegratin	285	0	11	
Peren-amandelcoupe	160	0	1	
Ceviche met sint-jakobsschelpen	210	0	14	
Pittige truffels	65	0	1	
Biefstuk met rodewijnsaus en ham	360	0	28	

	fiber_g	carbohydrates_total_g	\
recipe			
Kruidnoten met choco-discodip	1	34	
Kruidnoten in marsepein	1	43	
Kruidnoten met chocodips	6	35	
Pepernotentaart met marsepeinstrik	1	60	
Perencake	1	36	
...	
Paddenstoelen en courgettegratin	0	13	
Peren-amandelcoupe	0	29	
Ceviche met sint-jakobsschelpen	0	7	
Pittige truffels	0	3	
Biefstuk met rodewijnsaus en ham	0	2	

	carbohydrates_sugar_g	fat_total_g	\
recipe			
Kruidnoten met choco-discodip	22	12	
Kruidnoten in marsepein	34	9	
Kruidnoten met chocodips	23	18	
Pepernotentaart met marsepeinstrik	39	33	
Perencake	21	11	
...	
Paddenstoelen en courgettegratin	0	20	

Peren-amandelcoupe	0	1
Ceviche met sint-jakobsschelpen	0	13
Pittige truffels	0	6
Biefstuk met rodewijnsaus en ham	0	23

	fat_saturated_g
recipe	
Kruidnoten met choco-discodip	7
Kruidnoten in marsepein	4
Kruidnoten met chocopips	10
Pepernotentaart met marsepeinstrik	21
Perencake	2
...	...
Paddenstoelen en courgettegratin	0
Peren-amandelcoupe	0
Ceviche met sint-jakobsschelpen	0
Pittige truffels	0
Biefstuk met rodewijnsaus en ham	0

[8706 rows x 8 columns]

```
<class 'pandas.core.frame.DataFrame'>
```

Index: 8706 entries, Kruidnoten met choco-discodip to Biefstuk met rodewijnsaus en ham

Data columns (total 8 columns):

#	Column	Non-Null Count	Dtype
0	energy_kcal	8706 non-null	int64
1	sodium_mg	8706 non-null	int64
2	protein_g	8706 non-null	int64
3	fiber_g	8706 non-null	int64
4	carbohydrates_total_g	8706 non-null	int64
5	carbohydrates_sugar_g	8706 non-null	int64
6	fat_total_g	8706 non-null	int64
7	fat_saturated_g	8706 non-null	int64

dtypes: int64(8)

memory usage: 870.2+ KB

None

```
[16]: # EXPLORE: TAG DATAFRAME - (CELL 16)
```

```
tag_counts = tags['tag'].value_counts() #118
print(tag_counts.head(10))
print(tags.head(10))
```

hoofdgerecht	4595
wat eten we vandaag	2768
oven	2542

lactosevrij	1923
glutenvrij	1679
koken	1588
bakken	1495
vegetarisch	1435
gebak	1291
bijgerecht	1277

Name: tag, dtype: int64

	recipe	tag
0	Kruidnoten met choco-discodip	hollands
1	Kruidnoten met choco-discodip	gebak
2	Kruidnoten met choco-discodip	gebak
3	Kruidnoten met choco-discodip	sinterklaas
4	Kruidnoten met choco-discodip	sinterklaasavond
5	Kruidnoten in marsepein	hollands
6	Kruidnoten in marsepein	gebak
7	Kruidnoten in marsepein	gebak
8	Kruidnoten in marsepein	sinterklaas
9	Kruidnoten in marsepein	sinterklaasavond

[17]: *# label all recipes in 'food' whether they are vegetarian or not - (CELL 17)*

```

vegetarian_filter = tags['tag'] == 'vegetarisch'
vegetarian_recipes = tags[vegetarian_filter]
vegetarian_recipes = vegetarian_recipes.set_index('recipe')
#display(vegetarian_recipes)

#food['vegetarian'] = np.nan
for index, row in food.iterrows():
    if index in vegetarian_recipes.index:
        food.loc[index, 'vegetarian'] = 1
    else:
        food.loc[index, 'vegetarian'] = 0

food['vegetarian'] = food['vegetarian'].astype(int)
display(food)

# assert the right amount of recipes are labeled
assert (food['vegetarian'] == 1).sum() == vegetarian_filter.sum() # 1435
assert (food['vegetarian'] == 0).sum() == len(food['vegetarian']) -
↳ vegetarian_filter.sum() # 7271

```

recipe	energy_kcal	natrium_mg	protein_g	\
Kruidnoten met choco-discodip	260	200	3	
Kruidnoten in marsepein	265	120	3	
Kruidnoten met chocodips	335	160	5	
Pepernotentaart met marsepeinstrik	560	240	5	

Perencake	265	120	5
...
Paddenstoelen en courgettegratin	285	0	11
Peren-amandelcoupe	160	0	1
Ceviche met sint-jakobsschelpen	210	0	14
Pittige truffels	65	0	1
Biefstuk met rodewijnsaus en ham	360	0	28

	fiber_g	carbohydrates_total_g	\
recipe			
Kruidnoten met choco-discodip	1	34	
Kruidnoten in marsepein	1	43	
Kruidnoten met chocodips	6	35	
Pepernotentaart met marsepeinstrik	1	60	
Perencake	1	36	
...	
Paddenstoelen en courgettegratin	0	13	
Peren-amandelcoupe	0	29	
Ceviche met sint-jakobsschelpen	0	7	
Pittige truffels	0	3	
Biefstuk met rodewijnsaus en ham	0	2	

	carbohydrates_sugar_g	fat_total_g	\
recipe			
Kruidnoten met choco-discodip	22	12	
Kruidnoten in marsepein	34	9	
Kruidnoten met chocodips	23	18	
Pepernotentaart met marsepeinstrik	39	33	
Perencake	21	11	
...	
Paddenstoelen en courgettegratin	0	20	
Peren-amandelcoupe	0	1	
Ceviche met sint-jakobsschelpen	0	13	
Pittige truffels	0	6	
Biefstuk met rodewijnsaus en ham	0	23	

	fat_saturated_g	vegetarian
recipe		
Kruidnoten met choco-discodip	7	0
Kruidnoten in marsepein	4	0
Kruidnoten met chocodips	10	0
Pepernotentaart met marsepeinstrik	21	0
Perencake	2	0
...
Paddenstoelen en courgettegratin	0	0
Peren-amandelcoupe	0	0
Ceviche met sint-jakobsschelpen	0	0
Pittige truffels	0	0

Biefstuk met rodewijnsaus en ham

0

0

[8706 rows x 9 columns]

```
[18]: # SIMULATE USER INPUT - (CELL 18)

# columns: user_id, gender, age, height_m, weight_kg, bmi, pa_level,
#         ↪ pa_activity, daily_kcal

sim_user_amount = 200
np.random.seed(177)

# generate 1: user_id
user_ids = np.array(['U' + str(n).zfill(3)) for n in range(0,
    ↪ sim_user_amount)])
print(user_ids[0:10])

# generate 2: gender
random_ints = np.random.randint(2, size=sim_user_amount)
genders = np.array(['male' if n == 0 else 'female' for n in random_ints])
print(genders[0:10])

# generate 3: age
ages = np.array([])
group_20_40 = int(0.36 * sim_user_amount) # 72 out of 200 (36%)
group_40_65 = int(0.46 * sim_user_amount) # 92 out of 200 (46%)
group_65_80 = int(0.18 * sim_user_amount) # 36 out of 200 (18%)
ages_20_40 = np.random.randint(20, 40, group_20_40)
ages_40_65 = np.random.randint(40, 65, group_40_65)
ages_65_80 = np.random.randint(65, 80, group_65_80)
ages = np.concatenate((ages_20_40, ages_40_65, ages_65_80))
ages = ages.astype(int)
print(ages[0:10])

# generate 4: height_m
heights = np.array([])
unique, counts = np.unique(genders, return_counts=True) # 106 male, 94 female
gender_amount = dict(zip(unique, counts))
for gender in genders:
    if gender == 'male':
        height_value = np.round(np.random.normal(1.81, 0.06, 1), 2)
        heights = np.append(heights, height_value)
    else:
        height_value = np.round(np.random.normal(1.67, 0.06, 1), 2)
        heights = np.append(heights, height_value)
print(heights[0:10])
```

```

# generate 5: weight_kg
weights = np.array([])
for gender in genders:
    if gender == 'male':
        weight_value = np.round(np.random.normal(85, 4, 1), 0)
        weights = np.append(weights, weight_value)
    else:
        weight_value = np.round(np.random.normal(72, 4, 1), 0)
        weights = np.append(weights, weight_value)
weights = weights.astype(int)
print(weights[0:10])

# generate 6: bmi
bmis = np.round(weights / (heights ** 2), 1)
print(bmis[0:10])

# generate 7 and 8: physical_level and physical_activity
pa_levels = np.array([])
pa_activities = np.array([])
pa_levels_unique = ['sedentary', 'low active', 'active', 'very active']
pa_probabilities = [0.15, 0.45, 0.35, 0.05]
pa_gender_level = {
    'male': {
        'sedentary': 1.00,
        'low active': 1.12,
        'active': 1.27,
        'very active': 1.54
    },
    'female': {
        'sedentary': 1.00,
        'low active': 1.14,
        'active': 1.27,
        'very active': 1.45
    }
}
for gender in genders:
    pa_level = np.random.choice(a=pa_levels_unique, size=1, p=pa_probabilities)[0]
    pa_levels = np.append(pa_levels, pa_level)
    pa_activity = pa_gender_level.get(gender).get(pa_level)
    pa_activities = np.append(pa_activities, pa_activity)
print(pa_levels[0:10])
print(pa_activities[0:10])

# generate 9: daily_kcal
# male:  $864 - 9.72 \times \text{age} + PA \times (14.2 \times \text{weight} + 503 \times \text{height})$ 
# female:  $387 - 7.31 \times \text{age} + PA \times (10.9 \times \text{weight} + 660.7 \times \text{height})$ 

```

```

daily_kcals = np.array([])
for gender in genders:
    if gender == 'male':
        calc_kcal = 864 - 9.72 * ages + pa_activities * (14.2 * weights + 503 *
↪ heights)
        daily_kcals = np.round(calc_kcal, 0)
    else:
        calc_kcal = 387 - 7.31 * ages + pa_activities * (10.9 * weights + 660.7
↪ * heights)
        daily_kcals = np.round(calc_kcal, 0)
daily_kcals = daily_kcals.astype(int)
print(daily_kcals[0:10])

# assert all list-likes are a 'numpy.ndarray'
assert type(user_ids) == np.ndarray
assert type(ages) == np.ndarray
assert type(user_ids) == np.ndarray
assert type(heights) == np.ndarray
assert type(weights) == np.ndarray
assert type(pa_levels) == np.ndarray
assert type(pa_activities) == np.ndarray
assert type(daily_kcals) == np.ndarray

```

```

['U000' 'U001' 'U002' 'U003' 'U004' 'U005' 'U006' 'U007' 'U008' 'U009']
['female' 'female' 'male' 'male' 'female' 'male' 'female' 'female'
 'female' 'male']
[33 29 27 35 36 21 23 28 29 29]
[1.6  1.66 1.74 1.76 1.74 1.72 1.66 1.71 1.68 1.71]
[73 66 83 88 74 81 72 73 78 84]
[28.5 24.  27.4 28.4 24.4 27.4 26.1 25.  27.6 28.7]
['sedentary' 'low active' 'low active' 'low active' 'low active' 'active'
 'active' 'active' 'low active' 'low active']
[1.  1.14 1.12 1.12 1.14 1.27 1.27 1.27 1.14 1.12]
[2385 2602 2902 2915 2710 3219 2999 3001 2808 2881]

```

[42]: *# TRANSFORM SIMULATED USER INPUT INTO DATAFRAME - (CELL 19)*

```

sim_users = {
    'user_id': user_ids,
    'gender': genders,
    'age': ages,
    'height_m': heights,
    'weight_kg': weights,
    'bmi': bmis,
    'pa_level': pa_levels,
    'pa_activity': pa_activities,
    'daily_kcal': daily_kcals
}

```

```

}
users = pd.DataFrame(data=sim_users)

# ADD DAILY INTAKE COLUMNS CORRESPONDING TO THE 8 NUTRITION CATEGORIES

# 1. daily energy
# already done (daily_kcal)

# 2. daily natrium
users['daily_natrium_min_mg'] = 0
users['daily_natrium_min_mg'] = users['daily_natrium_min_mg'].astype(int)

users['daily_natrium_max_mg'] = 2400
users['daily_natrium_max_mg'] = users['daily_natrium_max_mg'].astype(int)

# 3. daily protein
users['daily_protein_min_g'] = 0.996 * users['weight_kg']
users['daily_protein_min_g'] = users['daily_protein_min_g'].round(0).astype(int)

users['daily_protein_max_g'] = 1.079 * users['weight_kg']
users['daily_protein_max_g'] = users['daily_protein_max_g'].round(0).astype(int)

# 4. daily fiber
users['daily_fiber_min_g'] = (users['daily_kcal'] / 1000) * 14
users['daily_fiber_min_g'] = users['daily_fiber_min_g'].round(0).astype(int)

users['daily_fiber_max_g'] = 55
users['daily_fiber_max_g'] = users['daily_fiber_max_g'].astype(int)

# 5. daily carbohydrates
users['daily_carbohydrates_min_g'] = (0.45 * users['daily_kcal']) / 4
users['daily_carbohydrates_min_g'] = users['daily_carbohydrates_min_g'].
    ↪round(0).astype(int)

users['daily_carbohydrates_max_g'] = (0.65 * users['daily_kcal']) / 4
users['daily_carbohydrates_max_g'] = users['daily_carbohydrates_max_g'].
    ↪round(0).astype(int)

# 6. daily sugar
users['daily_sugar_min_g'] = 0
users['daily_sugar_min_g'] = users['daily_sugar_min_g'].astype(int)

users['daily_sugar_max_g'] = (0.1 * users['daily_kcal']) / 4
users['daily_sugar_max_g'] = users['daily_sugar_max_g'].round(0).astype(int)

# 7 daily fat
users['daily_fat_min_g'] = (0.2 * users['daily_kcal']) / 9

```

```

users['daily_fat_min_g'] = users['daily_fat_min_g'].round(0).astype(int)

users['daily_fat_max_g'] = (0.3 * users['daily_kcal']) / 9
users['daily_fat_max_g'] = users['daily_fat_max_g'].round(0).astype(int)

# daily saturated fat
users['daily_fat_saturated_min_g'] = 0
users['daily_fat_saturated_min_g'] = users['daily_fat_saturated_min_g'].
↳astype(int)

users['daily_fat_saturated_max_g'] = (0.1 * users['daily_kcal']) / 9
users['daily_fat_saturated_max_g'] = users['daily_fat_saturated_max_g'].
↳astype(int)

display(users.head())
print(users.info())

```

	user_id	gender	age	height_m	weight_kg	bmi	pa_level	pa_activity	\
0	U000	female	33	1.60	73	28.5	sedentary	1.00	
1	U001	female	29	1.66	66	24.0	low active	1.14	
2	U002	male	27	1.74	83	27.4	low active	1.12	
3	U003	male	35	1.76	88	28.4	low active	1.12	
4	U004	female	36	1.74	74	24.4	low active	1.14	

	daily_kcal	daily_natrium_min_mg	...	daily_fiber_min_g	\
0	2385	0	...	33	
1	2602	0	...	36	
2	2902	0	...	41	
3	2915	0	...	41	
4	2710	0	...	38	

	daily_fiber_max_g	daily_carbohydrates_min_g	daily_carbohydrates_max_g	\
0	55		268	388
1	55		293	423
2	55		326	472
3	55		328	474
4	55		305	440

	daily_sugar_min_g	daily_sugar_max_g	daily_fat_min_g	daily_fat_max_g	\
0	0	60	53	80	
1	0	65	58	87	
2	0	73	64	97	
3	0	73	65	97	
4	0	68	60	90	

	daily_fat_saturated_min_g	daily_fat_saturated_max_g
0	0	26

1	0	28
2	0	32
3	0	32
4	0	30

[5 rows x 23 columns]

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 200 entries, 0 to 199

Data columns (total 23 columns):

#	Column	Non-Null Count	Dtype
0	user_id	200 non-null	object
1	gender	200 non-null	object
2	age	200 non-null	int64
3	height_m	200 non-null	float64
4	weight_kg	200 non-null	int64
5	bmi	200 non-null	float64
6	pa_level	200 non-null	object
7	pa_activity	200 non-null	float64
8	daily_kcal	200 non-null	int64
9	daily_natrium_min_mg	200 non-null	int64
10	daily_natrium_max_mg	200 non-null	int64
11	daily_protein_min_g	200 non-null	int64
12	daily_protein_max_g	200 non-null	int64
13	daily_fiber_min_g	200 non-null	int64
14	daily_fiber_max_g	200 non-null	int64
15	daily_carbohydrates_min_g	200 non-null	int64
16	daily_carbohydrates_max_g	200 non-null	int64
17	daily_sugar_min_g	200 non-null	int64
18	daily_sugar_max_g	200 non-null	int64
19	daily_fat_min_g	200 non-null	int64
20	daily_fat_max_g	200 non-null	int64
21	daily_fat_saturated_min_g	200 non-null	int64
22	daily_fat_saturated_max_g	200 non-null	int64

dtypes: float64(3), int64(17), object(3)

memory usage: 36.1+ KB

None

[20]: # ADD EACH RECIPE AS COLUMN TO USER SIMULATION - (CELL 20)

```
recipe_cols = food[food['vegetarian'] == 1].transpose()
recipe_cols = recipe_cols.reset_index(drop=True)
recipe_cols = recipe_cols.drop(range(0, len(recipe_cols)))
user_ratings = users.join(recipe_cols)
```

[21]: # FILL EACH RECIPE BY USER A LIKE (1) OR DISLIKE (0) - (CELL 21)


```

# values that replace NaN
ratings_unique = np.array([0, 1])
ratings_probabilities = np.array([0.5, 0.5])

# row and column indices with NaN
col_inds = np.array(range(9, len(user_ratings.columns)))
row_inds = np.array(range(0, len(user_ratings)))

# change NaN per column per row to value
for col_ind in col_inds:
    for row_ind in row_inds:
        #if user_ratings.iloc[row_ind, 'gender'] == 'female'
        user_ratings.iat[row_ind, col_ind] = np.random.choice(a=ratings_unique,
↪size=1, p=ratings_probabilities)[0]
        user_ratings.iloc[:, col_ind] = user_ratings.iloc[:, col_ind].astype(int)
display(user_ratings.head())

```

	user_id	gender	age	height_m	weight_kg	bmi	pa_level	pa_activity	\
0	U000	female	33	1.60	73	28.5	sedentary	1.00	
1	U001	female	29	1.66	66	24.0	low active	1.14	
2	U002	male	27	1.74	83	27.4	low active	1.12	
3	U003	male	35	1.76	88	28.4	low active	1.12	
4	U004	female	36	1.74	74	24.4	low active	1.14	

	daily_kcal	Pierogi	...	Aardappel en tomaatpakketjes	Aardappel en prei	\
0	2385	1	...		0	0
1	2602	1	...		0	1
2	2902	1	...		0	0
3	2915	0	...		0	1
4	2710	1	...		0	1

	Aardappel en peen	Krieltjes en courgette	\
0	0	1	
1	0	1	
2	0	1	
3	1	0	
4	0	1	

	Aardappelen en paprika uit de oven	Aardappel en auberginefrites	\
0	1	1	
1	1	1	
2	0	0	
3	0	0	
4	0	1	

	Aardappel en knolselderij	Falafelburger	Ovenpasta met ei	\
0	1	1	0	

1	0	0	0
2	0	1	0
3	1	0	1
4	0	1	1

	Honingwortel met abrikoos
0	1
1	0
2	1
3	1
4	0

[5 rows x 1444 columns]

[22]: *# CREATE COMBINATIONS OF VEGETERIAN RECIPES AND USERS - (CELL 22)*

```
# filter out only vegetarian recipes out of 'food' dataframe
veg_food = food[food['vegetarian'] == 1]
veg_food = veg_food.reset_index()

# create cartesian product of vegetarian recipes and users
veg_food_users = veg_food.merge(users, how='cross')
veg_food_users['rating'] = np.nan

# create some patterns for 'rating' column
mean_protein_g = veg_food_users['protein_g'].mean()
mean_fiber_g = veg_food_users['fiber_g'].mean()
mean_fat_saturated_g = veg_food_users['fat_saturated_g'].mean()
for index, row in veg_food_users.iterrows():
    # male and above average protein = like
    if row['gender'] == 'male' and row['protein_g'] > mean_protein_g:
        veg_food_users.at[index, 'rating'] = 1
    # female and above average fiber = like
    elif row['gender'] == 'female' and row['fiber_g'] > mean_fiber_g:
        veg_food_users.at[index, 'rating'] = 1
    # above average saturated fat = dislike
    elif row['fat_saturated_g'] > mean_fat_saturated_g:
        veg_food_users.at[index, 'rating'] = 0
    # everything else = dislike
    else:
        veg_food_users.at[index, 'rating'] = 0

veg_food_users['rating'] = veg_food_users['rating'].astype(int)
display(veg_food_users.head())
```

	recipe	energy_kcal	sodium_mg	protein_g	fiber_g	\
0	Pierogi	115	80	2	1	
1	Pierogi	115	80	2	1	

2	Pierogi	115	80	2	1
3	Pierogi	115	80	2	1
4	Pierogi	115	80	2	1

	carbohydrates_total_g	carbohydrates_sugar_g	fat_total_g	fat_saturated_g	\
0	10	1	7	5	
1	10	1	7	5	
2	10	1	7	5	
3	10	1	7	5	
4	10	1	7	5	

	vegeterian	user_id	gender	age	height_m	weight_kg	bmi	pa_level	\
0	1	U000	female	33	1.60	73	28.5	sedentary	
1	1	U001	female	29	1.66	66	24.0	low active	
2	1	U002	male	27	1.74	83	27.4	low active	
3	1	U003	male	35	1.76	88	28.4	low active	
4	1	U004	female	36	1.74	74	24.4	low active	

	pa_activity	daily_kcal	rating
0	1.00	2385	0
1	1.14	2602	0
2	1.12	2902	0
3	1.12	2915	0
4	1.14	2710	0

```
[23]: # check like to dislike amount - (CELL 23)
print(veg_food_users['rating'].value_counts())
```

```
0    163838
1     123162
Name: rating, dtype: int64
```