DS0103EN-3-3-1-From-Understanding-to-Preparation-v2.0

August 11, 2019

From Understanding to Preparation

0.1 Introduction

In this lab, we will continue learning about the data science methodology, and focus on the **Data Understanding** and the **Data Preparation** stages.

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1 Recap

In Lab From Requirements to Collection, we learned that the data we need to answer the question developed in the business understanding stage, namely *can we automate the process of determining the cuisine of a given recipe?*, is readily available. A researcher named Yong-Yeol Ahn scraped tens of thousands of food recipes (cuisines and ingredients) from three different websites, namely:

www.allrecipes.com

www.epicurious.com

www.menupan.com

For more information on Yong-Yeol Ahn and his research, you can read his paper on Flavor Network and the Principles of Food Pairing.

We also collected the data and placed it on an IBM server for your convenience.

2 Data Understanding

Important note: Please note that you are not expected to know how to program in Python. The following code is meant to illustrate the stages of data understanding and data preparation, so it is totally fine if you do not understand the individual lines of code. We have a full course on programming in Python, Python for Data Science, which is also offered on Coursera. So make sure to complete the Python course if you are interested in learning how to program in Python.

2.0.1 Using this notebook:

To run any of the following cells of code, you can type **Shift + Enter** to excute the code in a cell. Get the version of Python installed.

```
[]: # check Python version | python -V
```

Download the library and dependencies that we will need to run this lab.

```
[2]: import pandas as pd # import library to read data into dataframe pd.set_option('display.max_columns', None) import numpy as np # import numpy library import re # import library for regular expression
```

Download the data from the IBM server and read it into a pandas dataframe.

```
[3]: recipes = pd.read_csv("https://s3-api.us-geo.objectstorage.softlayer.net/cf-courses-data/

→CognitiveClass/DS0103EN/labs/data/recipes.csv")

print("Data read into dataframe!") # takes about 30 seconds
```

Data read into dataframe!

```
Show the first few rows.
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[4]: recipes.head()
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[4]: country almond angelica anise anise_seed apple apple_brandy apricot \
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Get the dimensions of the dataframe.

- [5]: recipes.shape
- **[5]**: (57691, 384)

So our dataset consists of 57,691 recipes. Each row represents a recipe, and for each recipe, the corresponding cuisine is documented as well as whether 384 ingredients exist in the recipe or not, beginning with almond and ending with zucchini.

We know that a basic sushi recipe includes the ingredients: * rice * soy sauce * wasabi * some fish/vegetables

Let's check that these ingredients exist in our dataframe:

```
[8]: ingredients = list(recipes.columns.values)

print([match.group(0) for ingredient in ingredients for match in [(re.compile(".*(rice).*")).

→search(ingredient)] if match])

print([match.group(0) for ingredient in ingredients for match in [(re.compile(".*(wasabi).*")).

→search(ingredient)] if match])

print([match.group(0) for ingredient in ingredients for match in [(re.compile(".*(soy).*")).

→search(ingredient)] if match])
```

```
['brown_rice', 'licorice', 'rice']
['wasabi']
['soy sauce', 'soybean', 'soybean oil']
```

Yes, they do!

- rice exists as rice.
- wasabi exists as wasabi.
- soy exists as soy_sauce.

So maybe if a recipe contains all three ingredients: rice, wasabi, and soy_sauce, then we can confidently say that the recipe is a **Japanese** cuisine! Let's keep this in mind!

3 Data Preparation

In this section, we will prepare data for the next stage in the data science methodology, which is modeling. This stage involves exploring the data further and making sure that it is in the right format for the machine learning algorithm that we selected in the analytic approach stage, which is decision trees.

First, look at the data to see if it needs cleaning.

```
[9]: recipes["country"].value_counts() # frequency table
```

```
[9]: American 40150
Mexico 1754
```

```
Italian
              1715
Italy
              1461
Asian
               1176
Indonesia
                 12
Belgium
                 11
East-African
                  11
Israel
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Bangladesh
Name: country, Length: 69, dtype: int64
```

By looking at the above table, we can make the following observations:

- 1. Cuisine column is labeled as Country, which is inaccurate.
- 2. Cuisine names are not consistent as not all of them start with an uppercase first letter.
- 3. Some cuisines are duplicated as variation of the country name, such as Vietnam and Vietnamese.
- 4. Some cuisines have very few recipes.

Let's fixes these problems. Fix the name of the column showing the cuisine.

```
[12]: column names = recipes.columns.values
     column names[0] = "cuisine"
     #print(column names)
     recipes.columns = column names
     recipes
[12]:
            cuisine almond angelica anise anise seed apple apple brandy apricot \
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[57691 rows x 384 columns]

Make all the cuisine names lowercase.

```
[13]: recipes["cuisine"] = recipes["cuisine"].str.lower()
```

Make the cuisine names consistent.

```
[]: recipes.loc[recipes["cuisine"] == "austria", "cuisine"] = "austrian"
    recipes.loc[recipes["cuisine"] == "belgium", "cuisine"] = "belgian"
    recipes.loc[recipes["cuisine"] == "china", "cuisine"] = "chinese"
    recipes.loc[recipes["cuisine"] == "canada", "cuisine"] = "canadian"
    recipes.loc[recipes["cuisine"] == "netherlands", "cuisine"] = "dutch"
    recipes.loc[recipes["cuisine"] == "france", "cuisine"] = "french"
    recipes.loc[recipes["cuisine"] == "germany", "cuisine"] = "german"
    recipes.loc[recipes["cuisine"] == "india", "cuisine"] = "indian"
    recipes.loc[recipes["cuisine"] == "indonesia", "cuisine"] = "indonesian"
    recipes.loc[recipes["cuisine"] == "iran", "cuisine"] = "iranian"
    recipes.loc[recipes["cuisine"] == "italy", "cuisine"] = "italian"
    recipes.loc[recipes["cuisine"] == "japan", "cuisine"] = "japanese"
    recipes.loc[recipes["cuisine"] == "israel", "cuisine"] = "jewish"
    {\tt recipes.loc[recipes["cuisine"] == "korea", "cuisine"] = "korean"}
    recipes.loc[recipes["cuisine"] == "lebanon", "cuisine"] = "lebanese"
    recipes.loc[recipes["cuisine"] == "malaysia", "cuisine"] = "malaysian"
    recipes.loc[recipes["cuisine"] == "mexico", "cuisine"] = "mexican"
    recipes.loc[recipes["cuisine"] == "pakistan", "cuisine"] = "pakistani"
    recipes.loc[recipes["cuisine"] == "philippines", "cuisine"] = "philippine"
    recipes.loc[recipes["cuisine"] == "scandinavia", "cuisine"] = "scandinavian"
```

```
recipes.loc[recipes["cuisine"] == "spain", "cuisine"] = "spanish_portuguese"
recipes.loc[recipes["cuisine"] == "portugal", "cuisine"] = "spanish_portuguese"
recipes.loc[recipes["cuisine"] == "switzerland", "cuisine"] = "swiss"
recipes.loc[recipes["cuisine"] == "thailand", "cuisine"] = "thail"
recipes.loc[recipes["cuisine"] == "turkey", "cuisine"] = "turkish"
recipes.loc[recipes["cuisine"] == "vietnam", "cuisine"] = "vietnamese"
recipes.loc[recipes["cuisine"] == "uk-and-ireland", "cuisine"] = "uk-and-irish"
recipes.loc[recipes["cuisine"] == "irish", "cuisine"] = "uk-and-irish"
recipes
```

Remove cuisines with < 50 recipes.

```
[]: # get list of cuisines to keep
recipes_counts = recipes["cuisine"].value_counts()
cuisines_indices = recipes_counts > 50

cuisines_to_keep = list(np.array(recipes_counts.index.values)[np.array(cuisines_indices)])

[]: rows_before = recipes.shape[0] # number of rows of original dataframe
print("Number of rows of original dataframe is {}.".format(rows_before))

recipes = recipes.loc[recipes['cuisine'].isin(cuisines_to_keep)]

rows_after = recipes.shape[0] # number of rows of processed dataframe
print("Number of rows of processed dataframe is {}.".format(rows_after))

print("{} rows removed!".format(rows_before - rows_after))
```

Convert all Yes's to 1's and the No's to 0's

```
[19]: recipes = recipes.replace(to_replace="Yes", value=1)
recipes = recipes.replace(to_replace="No", value=0)
```

Let's analyze the data a little more in order to learn the data better and note any interesting preliminary observations. Run the following cell to get the recipes that contain rice and soy and wasabi and seaweed.

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[20]: recipes.head()
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[21]: check recipes = recipes.loc[
         (recipes["rice"] == 1) \&
         (recipes["soy sauce"] == 1) \&
         (recipes["wasabi"] == 1) \&
         (recipes["seaweed"] == 1)
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Based on the results of the above code, can we classify all recipes that contain **rice** and **soy** and **wasabi** and **seaweed** as **Japanese** recipes? Why? Your Answer: Double-click **here** for the solution. Let's count the ingredients across all recipes.

```
[17]: # sum each column
ing = recipes.iloc[:, 1:].sum(axis=0)
print(ing)
```

```
almond
angelica
 anise
 anise seed
 apple
 wood
 yam
 yeast
 yogurt
zucchini
 Length: 383, dtype: object
```

```
[]: # define each column as a pandas series
ingredient = pd.Series(ing.index.values, index = np.arange(len(ing)))
count = pd.Series(list(ing), index = np.arange(len(ing)))

# create the dataframe
ing_df = pd.DataFrame(dict(ingredient = ingredient, count = count))
ing_df = ing_df[["ingredient", "count"]]
print(ing_df.to_string())
```

Now we have a dataframe of ingredients and their total counts across all recipes. Let's sort this dataframe in descending order.

```
[]: ing_df.sort_values(["count"], ascending=False, inplace=True)
ing_df.reset_index(inplace=True, drop=True)
print(ing_df)
```

What are the 3 most popular ingredients? Your Answer: 1.

2

3. Double-click **here** for the solution.

However, note that there is a problem with the above table. There are ~40,000 American recipes in our dataset, which means that the data is biased towards American ingredients.

Therefore, let's compute a more objective summary of the ingredients by looking at the ingredients per cuisine.

Let's create a *profile* **for each cuisine.** In other words, let's try to find out what ingredients Chinese people typically use, and what is **Canadian** food for example.

```
[22]: cuisines = recipes.groupby("cuisine").mean()
      cuisines.head()
                                                               apple apple brandy \
[22]:
                 almond angelica
                                        anise anise seed
      cuisine
      african
                 0.156522 \ 0.000000 \ 0.000000
                                                    0.000000 \quad 0.034783
                                                                             0.000000
                   0.040598 \ 0.000025 \ 0.003014
      american
                                                      0.000573 \quad 0.052055
                                                                               0.000623
      asian
                 0.007544 \ 0.000000 \ 0.000838
                                                    0.002515 \quad 0.012573
                                                                             0.000000
                 0.238095 \ 0.000000 \ 0.000000
                                                    0.000000 \quad 0.047619
                                                                             0.000000
      austria
      bangladesh 0.000000 0.000000 0.000000
                                                      0.000000 - 0.000000
                                                                                0.000000
                 apricot armagnac artemisia artichoke asparagus avocado
      cuisine
      african
                 0.069565
                              0.0000
                                           0.0 \quad 0.000000 \quad 0.000000 \quad 0.008696
                   0.011308
                               0.0001
                                             0.0 \quad 0.006351 \quad 0.007522 \quad 0.007323
      american
                                           0.0 \quad 0.000000 \quad 0.019279 \quad 0.010897
      asian
                 0.005029
                              0.0000
                                                 0.000000 \quad 0.000000 \quad 0.000000
      austria
                 0.142857
                              0.0000
                                                   0.000000 \quad 0.000000 \quad 0.000000
      bangladesh 0.000000
                                0.0000
                  bacon baked potato
                                              balm
                                                       banana
                                                                  barley \
      cuisine
                               0.000000 \ 0.000000 \ 0.017391 \ 0.017391
      african
                 0.008696
                                 0.000199 \ \ 0.000075 \ \ 0.021594 \ \ 0.003885
      american
                   0.041220
                               0.000000 \quad 0.000000 \quad 0.006706 \quad 0.029338
      asian
                 0.013412
                                0.000000 0.000000 0.000000 0.000000
                 0.000000
      austria
                                  0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
      bangladesh 0.000000
                bartlett pear
                                                      bean beech
                                   basil
                                              bay
                                                                        beef \
      cuisine
      african
                     0.000000 \ 0.017391 \ 0.034783 \ 0.008696
                                                                   0.0 \quad 0.052174
      american
                       0.000423 0.058655 0.020697 0.028767
                                                                     0.0 \ 0.075118
      asian
                     0.000000 \ 0.055323 \ 0.011735 \ 0.083822
                                                                   0.0 \ 0.103940
                     0.000000 \quad 0.000000 \quad 0.047619 \quad 0.000000
      austria
                                                                   0.0 0.047619
                       0.000000 \quad 0.000000 \quad 0.500000 \quad 0.000000
      bangladesh
                                                                     0.0 \quad 0.500000
                beef broth beef liver
                                              beer
                                                       beet bell pepper bergamot \
      cuisine
                               0.000000 \ 0.000000 \ 0.008696
      african
                   0.008696
                                                                   0.313043 \ 0.000000
                                 0.000174 \ \ 0.005430 \ \ 0.003686
      american
                     0.009988
                                                                     0.087846 \quad 0.000149
                               0.000000 \ 0.004191 \ 0.000838
                                                                   0.133277 - 0.000000
      asian
                   0.012573
      austria
                   0.047619
                                0.000000 \quad 0.000000 \quad 0.000000
                                                                   0.000000 \quad 0.000000
                     0.000000
                                  0.000000 \quad 0.000000 \quad 0.000000
                                                                     0.000000 \quad 0.000000
      bangladesh
                  berry bitter orange black bean black currant \
      cuisine
      african
                 0.000000
                                 0.000000
                                             0.008696
                                                            0.000000
      american
                   0.003836
                                  0.001245
                                               0.005131
                                                              0.000199
```

```
asian
          0.000838
                         0.001676
                                     0.017603
                                                   0.000000
          0.000000
                         0.000000
                                     0.000000
                                                   0.000000
austria
                                                     0.000000
bangladesh 0.000000
                           0.000000
                                       0.000000
         black mustard seed oil black pepper black raspberry
cuisine
african
                     0.000000
                                   0.295652
                                                   0.000000
american
                       0.000050
                                    0.147621
                                                     0.000199
                     0.001676
                                                   0.000000
asian
                                   0.118189
austria
                     0.000000
                                   0.047619
                                                   0.000000
bangladesh
                        0.000000
                                     0.250000
                                                     0.000000
         black sesame seed black tea blackberry blackberry brandy \
cuisine
african
                     0.0 0.000000
                                       0.000000
                                                         0.000000
                                                          0.000075
american
                       0.0 \quad 0.000573
                                        0.003462
asian
                     0.0 \quad 0.005868
                                                        0.000000
                                       0.000838
austria
                     0.0 \quad 0.047619
                                       0.000000
                                                         0.000000
bangladesh
                        0.0 0.000000
                                         0.000000
                                                           0.000000
         blue cheese blueberry bone oil bourbon whiskey
                                                                   brandy \
cuisine
african
             0.000000 \quad 0.000000 \quad 0.000000
                                                   0.000000 \quad 0.017391
                                                    0.003362 \quad 0.006426
              0.007995 \quad 0.010710 \quad 0.000149
american
asian
            0.000838 \quad 0.001676 \quad 0.000838
                                                  0.000000 \quad 0.003353
                        0.000000 0.000000
austria
             0.000000
                                                   0.000000 \quad 0.047619
               0.000000 \quad 0.000000 \quad 0.000000
                                                     0.000000 \quad 0.000000
bangladesh
         brassica
                     bread broccoli brown rice brussels sprout \
cuisine
african
          0.008696 0.104348 0.008696
                                           0.000000
                                                           0.000000
            0.001021 \ 0.081519 \ 0.018107
                                             0.006999
american
                                                             0.001843
asian
          0.005868 0.036044 0.025147
                                           0.008382
                                                           0.000838
          0.000000 \quad 0.190476 \quad 0.000000
                                            0.000000
                                                            0.000000
austria
bangladesh 0.000000 0.000000 0.000000
                                             0.000000
                                                             0.000000
         buckwheat
                       butter buttermilk cabbage \
cuisine
african
           0.000000 \quad 0.208696
                                  0.000000 \quad 0.008696
american
             0.000448 \quad 0.411582
                                   0.033151 \ 0.014321
asian
           0.017603 \quad 0.058676
                                  0.003353 \ 0.081308
                                  0.000000 \quad 0.000000
austria
           0.000000 \ 0.714286
bangladesh 0.000000 0.000000
                                   0.000000 \quad 0.000000
         cabernet sauvignon wine
                                         cacao camembert cheese \
cuisine
african
                      0.000000 \quad 0.000000
                                                   0.0000
```

american0.000324 0.0007720.0001asian0.000000 0.0000000.0000austria0.000000 0.0000000.0000bangladesh0.000000 0.0000000.0000
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$
celery celery_oil cereal chamomile champagne_wine cuisine african 0.026087 0.000000 0.000000 0.00000 0.00000 american 0.071034 0.019726 0.004832 0.00005 0.001843 asian 0.025985 0.011735 0.000000 0.00000 0.00000 bangladesh 0.000000 0.000000 0.000000 0.000000 0.000000
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$
$\begin{array}{cccccccccccccccccccccccccccccccccccc$

cuisine

```
0.000000 \ 0.000000 \ 0.000000 \ 0.243478 \ 0.286957
african
           0.000000
             0.001469
                              0.000025 \ \ 0.025031 \ \ 0.023263 \ \ 0.020224 \ \ 0.110884
american
                            0.004191 0.018441 0.013412 0.204526 0.030176
asian
           0.003353
                            0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.095238
           0.000000
austria
bangladesh 0.000000
                               0.000000 \ 0.000000 \ 0.000000 \ 0.500000 \ 0.500000
           citrus citrus peel
                                     clam
                                              clove
                                                        cocoa coconut \
cuisine
african
           0.008696
                             0.0 \quad 0.000000 \quad 0.000000 \quad 0.008696 \quad 0.008696
american
             0.002167
                               0.0 \quad 0.004932 \quad 0.000174 \quad 0.106052 \quad 0.033051
                             0.0 \ 0.012573 \ 0.0000000 \ 0.005029 \ 0.093881
asian
           0.006706
austria
           0.000000
                             0.0 \quad 0.000000 \quad 0.000000 \quad 0.238095 \quad 0.000000
                               0.000000, 0.000000, 0.000000, 0.000000, 0.000000
bangladesh 0.000000
          coconut oil
                                    coffee
                                             cognac concord grape \
                             cod
cuisine
              0.000000 \ 0.043478 \ 0.000000 \ 0.000000
                                                               0.000000
african
american
               0.000299 \ 0.002167 \ 0.013674 \ 0.000548
                                                                 0.000299
asian
             0.000000 \ 0.005868 \ 0.003353 \ 0.000838
                                                               0.000000
              0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
austria
                                                               0.000000
                0.000000 \ 0.000000 \ 0.000000 \ 0.000000
                                                                 0.000000
bangladesh
          condiment coriander
                                      corn corn flake corn grit \
cuisine
african
            0.008696 \quad 0.278261 \quad 0.034783
                                                0.000000 \quad 0.000000
american
              0.000125 \quad 0.016538 \quad 0.080174
                                                  0.005131 - 0.001743
asian
            0.000000 \quad 0.138307 \quad 0.049455
                                                0.000000 - 0.000838
            0.000000 \quad 0.000000 \quad 0.000000
                                                0.000000 \quad 0.000000
austria
bangladesh 0.000000 0.500000 0.000000
                                                  0.000000 \quad 0.000000
          cottage cheese
                                                     cream cream cheese \
                                crab cranberry
cuisine
african
                0.000000 \ 0.000000 \ 0.000000 \ 0.034783
                                                                 0.000000
american
                  0.006227 \quad 0.010411 \quad 0.021320 \quad 0.196737
                                                                   0.062740
                0.000000 \ 0.020117 \ 0.003353 \ 0.035205
asian
                                                                 0.003353
austria
                0.000000 \quad 0.000000 \quad 0.000000 \quad 0.238095
                                                                  0.047619
                  0.000000 0.000000 0.000000 0.000000
bangladesh
                                                                    0.000000
                         cumin cured pork currant
          cucumber
                                                              date
                                                                        dill \
cuisine
african
           0.017391 \ 0.426087
                                   0.000000 \ 0.017391 \ 0.034783 \ 0.000000
                                     0.004134 \quad 0.003512 \quad 0.007547 \quad 0.021220
american
             0.029489 \quad 0.033524
asian
           0.082146 \quad 0.084661
                                   0.000838 \ 0.000838 \ 0.002515 \ 0.002515
austria
           0.000000 \quad 0.000000
                                   0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
                                      0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
bangladesh 0.000000 0.250000
```

egg egg noodle elderberry emmental cheese \

durian eel

```
cuisine
african
             0.0 0.0 0.200000
                                   0.000000
                                                 0.0000
                                                                   0.0
american
               0.0 \ 0.0 \ 0.405131
                                    0.005729
                                                  0.0001
                                                                    0.0
             0.0 \ 0.0 \ 0.136630
                                                 0.0000
                                                                   0.0
asian
                                   0.009220
austria
             0.0 \ 0.0 \ 0.809524
                                   0.000000
                                                 0.0000
                                                                   0.0
               0.0 0.0 0.000000
                                     0.000000
                                                   0.0000
                                                                     0.0
bangladesh
           endive enokidake
                                 fennel fenugreek feta cheese
                                                                      fig \
cuisine
african
           0.000000
                          0.0 \ 0.052174 \ 0.060870
                                                        0.008696 \quad 0.000000
american
            0.001295
                            0.0 \ 0.011283 \ 0.012005
                                                         0.010062 \ 0.001943
asian
           0.000838
                          0.0 \ 0.005029 \ 0.057837
                                                        0.001676 \quad 0.000000
austria
           0.000000
                          0.0 0.000000
                                          0.000000
                                                        0.000000 - 0.000000
                            0.0 0.000000 0.000000
bangladesh 0.000000
                                                          0.000000 \quad 0.000000
            fish
                   flower frankfurter
                                          fruit galanga gardenia \
cuisine
african
           0.078261 \ 0.000000
                                   0.000000 \quad 0.00000 \quad 0.000000
                                                                      0.0
                                    0.000648 0.00924 0.000125
american
            0.015816 0.000448
                                                                       0.0
asian
           0.196144 \ 0.001676
                                   0.000000 \quad 0.00000 \quad 0.014250
                                                                     0.0
           0.000000 \quad 0.000000
                                   0.000000 \quad 0.00000 \quad 0.000000
                                                                      0.0
austria
bangladesh 0.000000 0.000000
                                     0.000000 \quad 0.00000 \quad 0.000000
                                                                        0.0
           garlic gelatin geranium
                                           gin
                                                  ginger goat cheese \
cuisine
           0.495652 0.008696 0.000000 0.000000 0.260870
african
                                                                   0.000000
            0.240722 \quad 0.031308 \quad 0.000025 \quad 0.001469 \quad 0.054321
american
                                                                    0.003910
asian
           0.479464 \ 0.006706 \ 0.000000 \ 0.000000 \ 0.486169
                                                                   0.000838
           0.000000 0.000000 0.000000 0.000000 0.000000
austria
                                                                   0.000000
bangladesh \ 0.750000 \ 0.000000 \ 0.000000 \ 0.000000 \ 0.500000
                                                                     0.000000
            grape grape brandy grape juice grapefruit \
cuisine
african
           0.000000
                                    0.008696
                                                0.000000
                             0.0
american
            0.006999
                              0.0
                                     0.013848
                                                  0.002192
asian
           0.000838
                             0.0
                                    0.011735
                                                0.003353
           0.000000
                             0.0
                                    0.000000
                                                0.000000
austria
bangladesh 0.000000
                               0.0
                                      0.000000
                                                  0.000000
         green bell pepper green tea gruyere cheese
                                                                guava haddock \
cuisine
                  0.017391 \quad 0.000000
                                             0.000000 \quad 0.000000 \quad 0.008696
african
american
                    0.046575
                               0.000299
                                               0.000448 0.000199 0.000374
asian
                  0.010059 \quad 0.002515
                                             0.000838 \ 0.000000 \ 0.000000
                  0.000000 \quad 0.000000
                                             0.000000 \quad 0.000000 \quad 0.000000
austria
                    0.000000 \quad 0.000000
                                               0.000000 \quad 0.000000 \quad 0.000000
bangladesh
```

```
cuisine
african
           0.000000 \quad 0.017391 \quad 0.000000
                                              0.000000 \quad 0.147826 \quad 0.00000
             0.022242 \ 0.003910 \ 0.000075
                                               0.000000 \quad 0.047472 \quad 0.00005
american
asian
           0.009220 \quad 0.000000 \quad 0.000000
                                             0.000838 0.062867 0.00000
           0.000000 \ 0.142857 \ 0.000000
                                              0.000000 \quad 0.000000 \quad 0.000000
austria
bangladesh 0.000000 0.000000 0.000000
                                                0.000000 \quad 0.000000 \quad 0.00000
         horseradish huckleberry jamaican rum japanese plum jasmine
cuisine
                                             0.0
african
             0.000000
                           0.000000
                                                          0.0 - 0.000000
american
               0.008095
                            0.000224
                                               0.0
                                                            0.0 0.000050
asian
             0.007544
                           0.000000
                                             0.0
                                                          0.0 \quad 0.000838
austria
             0.000000
                           0.000000
                                             0.0
                                                           0.0 \quad 0.000000
               0.000000
                             0.000000
                                               0.0
                                                             0.0 0.000000
bangladesh
         jasmine tea juniper berry kaffir lime
                                                          kale katsuobushi \
cuisine
african
             0.000000
                             0.000000
                                          0.000000 \quad 0.000000
                                                                  0.000000
american
               0.000025
                              0.000199
                                            0.000000 \quad 0.001245
                                                                    0.000025
             0.000838
                             0.000000
                                          0.000838 \ 0.003353
asian
                                                                  0.011735
              0.000000
                             0.000000
                                          0.000000 \quad 0.000000
                                                                   0.000000
austria
bangladesh
               0.000000
                               0.000000
                                            0.000000 \quad 0.000000
                                                                     0.000000
             kelp kidney bean
                                      kiwi kohlrabi kumquat
                                                                      lamb \
cuisine
african
                        0.000000 \ 0.000000 \ 0.000000 \ 0.008696 \ 0.130435
           0.000000
             0.000000
                          0.006849 \ 0.001818 \ 0.000075 \ 0.000523 \ 0.005031
american
                        0.000000 \quad 0.003353 \quad 0.000000 \quad 0.004191 \quad 0.013412
asian
           0.000838
                        0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
           0.000000
austria
bangladesh 0.000000
                           0.000000 0.000000 0.000000 0.000000 0.000000
             lard laurel lavender
                                        leaf
                                                 leek
                                                          lemon \
cuisine
           0.008696 0.00000 0.000000 0.00000 0.008696 0.165217
african
american
             0.061445 \ \ 0.00005 \ \ 0.000847 \ \ 0.00005 \ \ 0.005355 \ \ 0.053948
           0.008382 \quad 0.00000 \quad 0.000000 \quad 0.00000 \quad 0.012573 \quad 0.016764
asian
           0.047619 \ 0.00000 \ 0.000000 \ 0.00000 \ 0.047619 \ 0.095238
austria
bangladesh \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000
         lemon juice lemon peel lemongrass
                                                      lentil lettuce licorice \
cuisine
african
             0.260870
                          0.008696
                                       0.008696 \ 0.026087 \ 0.017391 \ 0.000000
american
               0.090535
                           0.012379
                                        0.000722 \ 0.003611 \ 0.017111 \ 0.000399
                          0.011735
                                       0.070411 \ \ 0.000838 \ \ 0.049455 \ \ 0.000838
asian
             0.055323
                                       0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
             0.000000
                          0.000000
austria
                                         0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
                            0.000000
bangladesh
               0.000000
```

ham hazelnut herring holy basil

honey

hop \

```
lilac flower oil lima bean
                                              lime lime juice lime peel oil \
cuisine
african
                  0.000000 \quad 0.000000 \quad 0.008696
                                                       0.043478
                                                                      0.017391
american
                    0.000025 \quad 0.002715 \quad 0.016837
                                                        0.017733
                                                                        0.001619
                  0.000000 \quad 0.000000 \quad 0.068734
asian
                                                       0.163453
                                                                      0.006706
                  0.000000 \quad 0.000000 \quad 0.000000
                                                       0.000000
                                                                       0.000000
austria
                    0.000000 \quad 0.000000 \quad 0.000000
bangladesh
                                                         0.000000
                                                                         0.000000
          lingonberry
                          litchi
                                    liver lobster long pepper
                                                                      lovage \
cuisine
african
              0.000000 \ 0.000000 \ 0.000000 \ 0.017391
                                                              0.000000 - 0.000000
american
               0.000075 \quad 0.000174 \quad 0.000523 \quad 0.002117
                                                                0.000000 \quad 0.003064
              0.000000 \quad 0.002515 \quad 0.000838 \quad 0.004191
asian
                                                              0.001676 0.000000
              0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
                                                              0.000000 \quad 0.000000
austria
                0.000000 \ 0.000000 \ 0.000000 \ 0.000000
                                                                0.000000 \quad 0.000000
bangladesh
          macadamia nut macaroni
                                             mace mackerel
                                                                    malt mandarin \
cuisine
african
                0.000000 \quad 0.026087 \quad 0.008696
                                                      0.0 \quad 0.000000 \quad 0.000000
american
                 0.002466 \ \ 0.046252 \ \ 0.002192
                                                        0.0 \ 0.000672 \ 0.006575
asian
               0.000838 \ 0.036044 \ 0.002515
                                                      0.0 \ 0.000838 \ 0.000838
austria
               0.000000 \quad 0.000000 \quad 0.000000
                                                      0.0 \ 0.000000 \ 0.000000
                  0.000000 \quad 0.000000 \quad 0.000000
                                                        0.0 \ 0.000000 \ 0.000000
bangladesh
          mandarin peel
                               mango maple syrup marjoram
                                                                         mate \
cuisine
african
                0.000000 \quad 0.034783
                                         0.000000 \ 0.034783 \ 0.000000
                                          0.010760 \ 0.010610 \ 0.000025
american
                 0.000050 \ 0.006002
               0.004191 \ 0.026823
                                         0.005868 \ 0.000000 \ 0.000000
asian
               0.000000 \quad 0.000000
                                         0.000000 \ 0.047619 \ 0.000000
austria
                                           0.000000 \quad 0.000000 \quad 0.000000
                  0.000000 \quad 0.000000
bangladesh
          matsutake
                          meat
                                    melon
                                                milk milk fat
                                                                      mint \
cuisine
african
            0.000000 \ \ 0.017391 \ \ 0.000000 \ \ 0.086957 \ \ 0.034783 \ \ 0.060870
              0.000000 \ \ 0.015866 \ \ 0.003238 \ \ 0.266002 \ \ 0.012603 \ \ 0.011880
american
asian
            0.000838 \quad 0.017603 \quad 0.005029 \quad 0.025147 \quad 0.012573 \quad 0.082146
            0.000000 \ \ 0.000000 \ \ 0.000000 \ \ 0.476190 \ \ 0.047619 \ \ 0.000000
austria
bangladesh \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
          mozzarella cheese mung bean munster cheese muscat grape
cuisine
african
                   0.000000 \quad 0.000000
                                                0.000000
                                                               0.000000
                     0.018431 \quad 0.000025
                                                 0.000598
                                                                0.000025
american
asian
                   0.000838 \quad 0.004191
                                               0.000000
                                                              0.000000
                   0.000000
austria
                               0.000000
                                                0.000000
                                                               0.000000
```

bangladesh $0.000000 0.0$	0.00000.0 0.000000 0.000000
---------------------------	-----------------------------

olive olive oil onion orange orange flower \ cuisine african $0.104348 \quad 0.521739 \quad 0.530435 \quad 0.043478$ 0.0000 $0.025056 \quad 0.132628 \quad 0.293325 \quad 0.031681$ 0.0001american asian $0.001676 \quad 0.066220 \quad 0.145851 \quad 0.015926$ 0.0000 $0.000000 \quad 0.000000 \quad 0.142857 \quad 0.047619$ 0.0000austria bangladesh 0.000000 0.000000 1.000000 0.000000 0.0000

palm \ orange juice orange peel oregano ouzo oyster cuisine 0.008696 0.008696 0.000000 0.000000 0.000000african 0.0173910.035019 $0.010336 \quad 0.046077 \quad 0.000025 \quad 0.003736 \quad 0.000399$ american asian 0.023470 $0.020117 \ 0.002515 \ 0.000000 \ 0.045264 \ 0.007544$ $0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000$ 0.000000 austria $0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000$ bangladesh 0.000000

papaya parmesan cheese parsley parsnip passion fruit \ cuisine african 0.008696 $0.017391 \ 0.191304 \ 0.000000$ 0.008696american 0.000648 $0.048568 \ \ 0.088568 \ \ 0.002491$ 0.000374asian 0.009220 $0.005868 \ 0.014250 \ 0.000838$ 0.0000000.000000 $0.000000 \ 0.047619 \ 0.000000$ 0.000000austria bangladesh 0.000000 $0.000000 \quad 0.000000 \quad 0.000000$ 0.000000

peanut peanut butter peanut oil peach pea pear \ cuisine african $0.043478 \ 0.000000 \ 0.026087$ 0.034783 $0.034783 \quad 0.000000$ $0.017858 \ 0.011507 \ 0.008244$ $0.002366 \quad 0.007323$ 0.022441american $0.076278 \quad 0.002515 \quad 0.049455$ $0.085499 \quad 0.013412$ asian 0.028500

 $0.000000 \quad 0.000000 \quad 0.000000$ $0.000000 \quad 0.000000$ austria 0.000000bangladesh $0.250000 \ 0.000000 \ 0.000000$ 0.000000 $0.000000 \quad 0.000000$ pear brandy pecan pelargonium pepper peppermint \ cuisine $0.000000 \quad 0.008696$ $0.000000 \quad 0.165217$ 0.000000 african american $0.000199 \quad 0.050336$ $0.000025 \quad 0.168369$ 0.003362 $0.000000 \quad 0.001676$ $0.000000 \quad 0.186085$ asian 0.000000 $0.000000 \quad 0.190476$ $0.000000 \quad 0.047619$ 0.000000 austria bangladesh $0.000000 \quad 0.000000$ $0.000000 \quad 0.000000$ 0.000000peppermint oil pimenta pimento pineapple pistachio plum \ cuisine african 0.000000 $0.0 \ 0.008696 \ 0.008696 \ 0.008696 \ 0.034783$ 0.000199 $0.0 \ 0.005330 \ 0.036538 \ 0.003213 \ 0.004284$ american 0.000000 asian $0.0 \ 0.000000 \ 0.018441 \ 0.002515 \ 0.010897$ 0.000000 $0.0 \ \ 0.000000 \ \ \ 0.000000 \ \ \ 0.000000 \ \ \ 0.095238$ austria bangladesh 0.000000 $0.0 \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000$ pork pork liver pork sausage port wine \ popcorn porcini cuisine african $0.000000 \ 0.000000 \ 0.008696$ 0.000000 $0.008696 \quad 0.000000$ american $0.002267 \ 0.001046 \ 0.030884$ 0.000075 $0.021719 \quad 0.000797$ $0.000000 \quad 0.000000 \quad 0.090528$ asian 0.000000 0.007544 - 0.000000austria $0.000000 \ 0.000000 \ 0.047619$ 0.000000 $0.000000 \quad 0.000000$ bangladesh $0.000000 \ 0.000000 \ 0.000000$ 0.000000 $0.000000 \quad 0.000000$ potato potato chip prawn prickly pear provolone cheese \ cuisine $0.000000 \quad 0.008696$ african 0.0260870.000000 0.000000 american 0.061395 $0.001494 \ 0.000423$ 0.0000750.002665asian $0.000000 \quad 0.000000$ 0.000000 0.0008380.013412 $0.000000 \quad 0.000000$ 0.0952380.000000 0.000000 austria $0.000000 \quad 0.000000$ bangladesh 0.500000 0.000000 0.000000 pumpkin quince radish raisin rapeseed raspberry \ cuisine african $0.000000 \ 0.008696 \ 0.000000 \ 0.139130$ $0.0 \quad 0.000000$ $0.014321 \ 0.000324 \ 0.002565 \ 0.034994$ american 0.0 0.016687 asian $0.002515 \quad 0.000838 \quad 0.015926 \quad 0.001676$ $0.0 \quad 0.001676$ austria $0.000000 \quad 0.000000 \quad 0.000000 \quad 0.047619$ 0.0 0.047619 bangladesh 0.000000 0.000000 0.000000 0.000000 $0.0 \quad 0.000000$ raw beef red algae red bean red kidney bean red wine \ cuisine 0.00.0african 0.0 $0.000000 \quad 0.034783$ 0.0 0.0 0.0 $0.001071 \ \ 0.019925$ american

```
0.0
                        0.0
                                 0.0
asian
                                           0.000000 \quad 0.005029
               0.0
                        0.0
                                 0.0
                                           0.000000 \quad 0.000000
austria
bangladesh
                 0.0
                          0.0
                                   0.0
                                             0.000000 \quad 0.000000
          rhubarb
                       rice roasted almond roasted beef \
cuisine
african
           0.000000 \quad 0.104348
                                      0.00000
                                                  0.000000
american
            0.003686 \quad 0.040473
                                       0.00005
                                                    0.003885
           0.000000 \quad 0.413244
                                      0.00000
asian
                                                  0.005029
austria
           0.000000 \quad 0.000000
                                      0.00000
                                                  0.000000
bangladesh 0.000000 0.250000
                                        0.00000
                                                     0.000000
         roasted hazelnut roasted meat roasted nut roasted peanut \
cuisine
african
                 0.000000
                               0.000000
                                            0.000000
                                                            0.008696
american
                   0.000025
                                0.000324
                                              0.000025
                                                             0.002516
asian
                 0.000000
                               0.000000
                                            0.000000
                                                           0.033529
austria
                 0.000000
                               0.000000
                                            0.000000
                                                            0.000000
bangladesh
                   0.000000
                                 0.000000
                                              0.000000
                                                              0.000000
         roasted pecan roasted pork roasted sesame seed romano cheese \
cuisine
african
               0.000000
                             0.000000
                                                0.000000
                                                               0.000000
                0.000025
                              0.002291
                                                  0.001395
                                                                0.002989
american
asian
               0.000000
                            0.000000
                                                0.003353
                                                               0.000000
austria
               0.000000
                             0.000000
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bangladesh
                 0.000000
                               0.000000
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            root roquefort cheese
                                         rose rosemary
                                                              rum \
cuisine
african
           0.000000
                            0.000000 \ 0.008696 \ 0.008696 \ 0.008696
                             0.000399 \ \ 0.000648 \ \ 0.033474 \ \ 0.011308
american
            0.000822
asian
           0.022632
                            0.000000 \ 0.000000 \ 0.002515 \ 0.000838
                            0.000000 \ \ 0.000000 \ \ 0.000000 \ \ 0.142857
           0.000000
austria
                              0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
bangladesh 0.000000
         rutabaga rye bread rye flour saffron
                                                         sage
                                                                  sake \
cuisine
african
           0.000000 \quad 0.000000 \quad 0.000000 \quad 0.130435 \quad 0.008696 \quad 0.000000
american
            0.000473 \quad 0.001793 \quad 0.002242 \quad 0.001494 \quad 0.017335 \quad 0.003288
           0.000000 \quad 0.000838
                                 0.000838 0.000000 0.000838 0.047779
asian
           0.000000 \quad 0.000000
                                  0.000000 \ 0.000000 \ 0.000000 \ 0.000000
austria
bangladesh \ 0.000000 \ \ 0.000000 \ \ 0.000000 \ \ 0.000000 \ \ 0.000000 \ \ 0.000000
           salmon salmon roe sassafras sauerkraut
                                                           savory scallion \
cuisine
                                               0.000000 \quad 0.000000 \quad 0.052174
african
           0.008696
                       0.000000
                                  0.000000
```

```
american
            0.008269
                         0.000100 \quad 0.000423
                                                 0.003088 \ 0.001868 \ 0.053225
                       0.001676 \quad 0.000000
asian
           0.015088
                                                0.000838 0.000838 0.382230
austria
           0.000000
                        0.000000 \quad 0.000000
                                                0.000000 \quad 0.000000 \quad 0.000000
                                                  0.000000 \quad 0.000000 \quad 0.000000
                         0.000000 \quad 0.000000
bangladesh 0.250000
          scallop sea algae
                                              seed sesame oil sesame seed \
                               seaweed
cuisine
                           0.0 \ 0.000000 \ 0.095652
                                                       0.000000
african
           0.000000
                                                                     0.043478
            0.003761
                            0.0 \ 0.000324 \ 0.022217
                                                         0.007821
                                                                      0.008792
american
asian
           0.026823
                          0.0 \ 0.022632 \ 0.027661
                                                       0.298407
                                                                    0.105616
                           0.0 \ 0.000000 \ 0.047619
           0.000000
                                                       0.000000
                                                                     0.000000
austria
bangladesh 0.000000
                             0.0 \quad 0.000000 \quad 0.000000
                                                         0.000000
                                                                       0.000000
          shallot sheep cheese shellfish
                                               sherry shiitake
                                                                   shrimp \
cuisine
                                  0.000000 \ 0.008696 \ 0.000000 \ 0.034783
african
           0.043478
                             0.0
                               0.0 \quad 0.000025 \quad 0.009489 \quad 0.002665 \quad 0.017958
american
            0.017310
asian
           0.103101
                             0.0 \quad 0.000000 \quad 0.064543 \quad 0.070411 \quad 0.123219
                                   0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
           0.000000
                             0.0
austria
                               0.0 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.250000
bangladesh 0.000000
            smoke smoked fish smoked salmon smoked sausage sour cherry \
cuisine
                        0.000000
                                       0.000000
                                                       0.000000
african
           0.026087
                                                                     0.000000
american
            0.006600
                          0.000149
                                         0.001519
                                                         0.005106
                                                                      0.000797
asian
           0.005868
                        0.000000
                                       0.002515
                                                       0.000000
                                                                     0.001676
austria
           0.000000
                        0.000000
                                       0.000000
                                                       0.000000
                                                                     0.000000
bangladesh 0.000000
                          0.000000
                                         0.000000
                                                          0.000000
                                                                       0.000000
         sour milk soy sauce soybean soybean oil spearmint
                                                                           squash \
cuisine
african
            0.000000 \quad 0.008696 \quad 0.000000
                                                 0.00000 \quad 0.000000 \quad 0.043478
american
             0.001096 \quad 0.038705 \quad 0.007895
                                                  0.00005 \quad 0.000100 \quad 0.010461
asian
            0.000000 \quad 0.496228 \quad 0.136630
                                                0.00000 \quad 0.000838 \quad 0.012573
            0.000000 \quad 0.000000 \quad 0.000000
                                                 0.00000 \quad 0.000000 \quad 0.000000
austria
bangladesh 0.000000 0.000000 0.000000
                                                   0.00000 \quad 0.000000 \quad 0.000000
                                  starch strawberry strawberry jam \
            squid star anise
cuisine
african
           0.008696
                       0.008696 \quad 0.008696
                                               0.000000
                                                                   0.0
            0.000473
                         0.000922 \ 0.046227
                                                0.023213
                                                                     0.0
american
asian
           0.008382
                       0.035205 \quad 0.129925
                                               0.002515
                                                                   0.0
           0.000000
                        0.000000 \quad 0.000000
                                               0.000000
                                                                   0.0
austria
bangladesh 0.000000
                         0.000000 \quad 0.000000
                                                 0.000000
                                                                     0.0
         strawberry juice sturgeon caviar sumac sunflower oil \
```

cuisine

```
african
                     0.0
                               0.000000 \quad 0.0000
                                                      0.008696
american
                      0.0
                                 0.000025 \ 0.0001
                                                        0.000025
asian
                     0.0
                               0.000000 \quad 0.0000
                                                      0.000000
                     0.0
                               0.000000 0.0000
                                                      0.000000
austria
bangladesh
                       0.0
                                 0.000000 0.0000
                                                        0.000000
         sweet potato swiss cheese tabasco pepper tamarind tangerine \
cuisine
                                           0.008696 \ \ 0.000000 \ \ \ 0.000000
african
              0.043478
                            0.000000
american
               0.010187
                             0.011233
                                             0.018356 \ 0.033773 \ 0.000523
asian
              0.010897
                           0.000838
                                           0.010059 - 0.015926
                                                                0.006706
austria
              0.000000
                            0.000000
                                           0.000000 \quad 0.000000
                                                                 0.000000
                                             0.000000 0.000000 0.000000
bangladesh
                0.000000
                              0.000000
                             tequila thai pepper
                                                       thyme
                                                                 tomato \
         tarragon
cuisine
african
          0.000000 \quad 0.000000 \quad 0.000000
                                             0.000000 \ 0.069565 \ 0.252174
american
            0.008692 \ 0.001793 \ 0.001768
                                              0.000648 \ 0.052329 \ 0.138680
asian
          0.001676 \quad 0.006706 \quad 0.000000
                                             0.041911 \ 0.004191 \ 0.057837
          0.000000 \ 0.047619 \ 0.000000
                                             0.000000 \quad 0.000000 \quad 0.000000
austria
bangladesh 0.000000 0.000000 0.000000
                                               0.000000 \ 0.000000 \ 0.250000
         tomato juice
                         truffle
                                     tuna
                                             turkey turmeric
                                                                 turnip \
cuisine
african
              0.000000 \ 0.000000 \ 0.017391 \ 0.008696 \ 0.156522 \ 0.043478
american
               0.003213 0.000598 0.007796 0.017758 0.014670 0.002516
              0.000000 \ 0.000000 \ 0.016764 \ 0.006706 \ 0.080469 \ 0.004191
asian
              0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
austria
                0.000000 \ 0.000000 \ 0.000000 \ 0.000000 \ 1.000000 \ 0.000000
bangladesh
          vanilla
                      veal vegetable vegetable oil vinegar violet
cuisine
          0.026087 \ 0.000000 \ 0.034783
                                               0.173913 \quad 0.052174 \quad 0.0000
african
american
            0.197061 \ 0.001694 \ 0.019303
                                                 0.187397 \ 0.135492 \ 0.0001
asian
          0.012573 \quad 0.000838 \quad 0.037720
                                               0.360436 \ 0.336966 \ 0.0000
austria
          0.428571 \ 0.047619
                                0.000000
                                               0.095238 \quad 0.047619 \quad 0.0000
                                                  1.000000 \quad 0.000000 \quad 0.0000
bangladesh 0.000000 0.000000 0.000000
           walnut
                     wasabi watercress watermelon
                                                          wheat wheat bread \
cuisine
african
          0.026087 \ 0.000000
                                 0.000000
                                              0.000000 \quad 0.260870
                                                                     0.000000
american
            0.059950 \quad 0.001096
                                   0.002092
                                               0.002167 \ 0.398406
                                                                       0.001569
asian
          0.004191 \ 0.026823
                                 0.015088
                                              0.001676 \quad 0.095557
                                                                     0.000838
austria
          0.047619 \ 0.000000
                                  0.000000
                                              0.000000 \quad 0.809524
                                                                     0.000000
bangladesh 0.000000 0.000000
                                   0.000000
                                                0.000000 \quad 0.250000
                                                                       0.000000
```

whiskey white bread white wine whole grain wheat flour \

```
cuisine
african
           0.000000
                         0.008696
                                     0.043478
                                                             0.008696
american
            0.002964
                          0.006874
                                       0.030809
                                                              0.014819
asian
           0.000838
                        0.001676
                                     0.038558
                                                             0.001676
           0.000000
                         0.047619
                                     0.000000
                                                             0.000000
austria
bangladesh 0.000000
                           0.000000
                                       0.000000
                                                               0.000000
             wine
                       wood
                                                    yogurt zucchini
                                   yam
                                           yeast
cuisine
african
           0.017391 \ 0.000000 \ 0.008696 \ 0.017391 \ 0.000000 \ 0.034783
             0.011009 \quad 0.000672 \quad 0.001445 \quad 0.068219 \quad 0.016912 \quad 0.018630
american
asian
           0.124895 \quad 0.000000 \quad 0.001676 \quad 0.004191 \quad 0.010897 \quad 0.011735
austria
           0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
bangladesh \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000 \ 0.000000
```

As shown above, we have just created a dataframe where each row is a cuisine and each column (except for the first column) is an ingredient, and the row values represent the percentage of each ingredient in the corresponding cuisine.

For example:

- *almond* is present across 15.65% of all of the **African** recipes.
- *butter* is present across 38.11% of all of the **Canadian** recipes.

Let's print out the profile for each cuisine by displaying the top four ingredients in each cuisine.

```
[]: num_ingredients = 4 # define number of top ingredients to print

# define a function that prints the top ingredients for each cuisine
def print_top_ingredients(row):
    print(row.name.upper())
    row_sorted = row.sort_values(ascending=False)*100
    top_ingredients = list(row_sorted.index.values)[0:num_ingredients]
    row_sorted = list(row_sorted)[0:num_ingredients]

for ind, ingredient in enumerate(top_ingredients):
    print("%s (%d%%)" % (ingredient, row_sorted[ind]), end=' ')
    print("\n")

# apply function to cuisines dataframe
create_cuisines_profiles = cuisines.apply(print_top_ingredients, axis=1)
```

At this point, we feel that we have understood the data well and the data is ready and is in the right format for modeling!

3.0.1 Thank you for completing this lab!

This notebook was created by Alex Aklson. We hope you found this lab session interesting. Feel free to contact us if you have any questions!

This notebook is part of a course on **Coursera** called *Data Science Methodology*. If you accessed this notebook outside the course, you can take this course, online by clicking here.

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