```
In [95]: import pandas as pd import numpy as np
```

Preprocessing

```
In [96]: df = pd.read_csv("nutrition 2.csv")
           df.drop(columns=['Unnamed: 0','lucopene', 'water'], inplace=True)
In [97]: | df.head()
           df.rename(columns={'zink': 'zinc'}, inplace=True)
           df.rename(columns={'irom': 'iron'}, inplace=True)
In [98]: def remove_units_and_convert(value):
                if pd.isna(value):
                     return 0
                if isinstance(value, str):
                          return float(''.join(filter(lambda x: x.isdigit() or x == '.', v
                     except ValueError:
                         return 0
                else:
                     return value
           # Applying the function to all the columns except 'name', 'serving_size', an
           for col in df.columns:
                if col not in ['name', 'Unnamed: 0']:
                     df[col] = df[col].apply(remove_units_and_convert)
           # Renaming the columns to include unit
           new_column_names = {}
           for col in df.columns:
                if col in [ 'vitamin_e',
    'tocopherol_alpha', 'fatty_acids_total_trans','caffeine' ,'theobroming
                     new_column_names[col] = col + ' (mg)'
                elif col in ['fructose', 'galactose', 'glucose', 'lactose', 'maltose',
                    'arginine', 'aspartic_acid', 'cystine', 'glutamic_acid', 'glycine', 'histidine', 'hydroxyproline', 'isoleucine', 'leucine', 'lysine', 'methionine', 'phenylalanine', 'proline', 'serine', 'threonine',
                    'tryptophan', 'tyrosine', 'valine']:
                     new_column_names[col] = col + ' (g)'
                elif col in ['calories']:
                     new_column_names[col] = col + ' (kcal)'
                elif col in [ 'vitamin_a_rae', 'folate',
                    'carotene_alpha', 'carotene_beta', 'cryptoxanthin_beta',
'lutein_zeaxanthin','folic_acid', "selenium", 'vitamin_k']:
   new_column_names[col] = col + ' (mcg)'
                elif col in ['vitamin_a', 'vitamin_d']:
                     new_column_names[col] = col + ' (IU)'
                else:
                     new_column_names[col] = col # For columns that don't need a unit
           df.rename(columns=new_column_names, inplace=True)
```

Out[99]:

	name	serving_size (g)	calories (kcal)	total_fat (g)	saturated_fat (g)	cholesterol (mg)	sodium (mg)	choli (m
	0 Cornstarch	100.0	381	0.1	0.0	0.0	9.0	(
	Nuts, pecans	100.0	691	72.0	6.2	0.0	0.0	4(
	2 Eggplant, raw	100.0	25	0.2	0.0	0.0	2.0	ť
	3 Teff, uncooked	100.0	367	2.4	0.4	0.0	12.0	1:
	4 Sherbet, orange	100.0	144	2.0	1.2	1.0	46.0	
,								
878	Beef, raw, all grades, trimmed to 0" fat, sepa	100.0	125	3.5	1.4	62.0	54.0	64
878	Lamb, cooked, separable lean only, composite 0	100.0	206	8.9	3.9	109.0	50.0	(
878	Lamb, raw, separable lean and fat, composite 0	100.0	277	23.0	12.0	78.0	39.0	(
878	Beef, raw, all grades, trimmed to 0" fat, sepa	100.0	121	3.0	1.1	60.0	53.0	64
878	Beef, raw, all grades, trimmed to 0" fat, sepa	100.0	121	3.0	1.1	60.0	53.0	64

8789 rows × 74 columns

Dataset definition

In [100... df.loc[240]

```
McDONALD'S, BIG MAC
          name
Out[100]:
           serving_size (g)
                                                           100.0
           calories (kcal)
                                                             257
           total_fat (g)
                                                            15.0
           saturated_fat (g)
                                                             3.8
           fatty_acids_total_trans (mg)
                                                            36.0
                                                             0.0
           alcohol (g)
           ash (g)
                                                            1.87
           caffeine (mg)
                                                             0.0
           theobromine (mg)
                                                             0.0
          Name: 240, Length: 74, dtype: object
          df.loc[736]
In [101...
                                            KEEBLER, Iced Oatmeal Cookies
          name
Out[101]:
           serving_size (g)
                                                                     100.0
                                                                        467
           calories (kcal)
           total_fat (g)
                                                                       18.0
           saturated_fat (g)
                                                                        5.8
           fatty_acids_total_trans (mg)
                                                                        0.0
           alcohol (g)
                                                                        0.0
           ash (g)
                                                                        0.0
           caffeine (mg)
                                                                        0.0
           theobromine (mg)
                                                                        0.0
          Name: 736, Length: 74, dtype: object
```

In [102...

df.head()

Out[102]:

:		name	serving_size (g)	calories (kcal)	total_fat (g)	saturated_fat (g)	cholesterol (mg)	sodium (mg)	choline (mg)
	0	Cornstarch	100.0	381	0.1	0.0	0.0	9.0	0.4
	1	Nuts, pecans	100.0	691	72.0	6.2	0.0	0.0	40.5
	2	Eggplant, raw	100.0	25	0.2	0.0	0.0	2.0	6.9
	3	Teff, uncooked	100.0	367	2.4	0.4	0.0	12.0	13.1
	4	Sherbet, orange	100.0	144	2.0	1.2	1.0	46.0	7.7

5 rows × 74 columns

Price df

```
In [103... #abhishek's
   price_df = pd.read_csv("Price_per_unit.csv", index_col=0)
In [104... price_df
```

Out[104]:		Ingredients	Prices	Weights	Price per unit			
	0	ANDREA'S	4.39	13.00	0.337692			
	1	APPLEBEE'S	0.00	0.00	10000.000000			
	2	ARBY'S	6.99	22.00	0.317727			
	3	ARCHWAY Home Style Cookies	5.49	9.25	0.593514			
	4	AUSTIN	0.00	0.00	10000.000000			
	•••		•••	•••				
	589	Yellow rice with seasoning	8.49	2.00	4.245000			
	590	Yogurt	2.89	32.00	0.090313			
	591	Yogurt parfait	1.19	6.00	0.198333			
	592	Yokan	16.99	21.00	0.809048			
	593	Zwieback	0.00	0.00	10000.000000			
n [105	<pre>price_per_unit = {} for index, row in price_df.iterrows(): price_per_unit[row["Ingredients"]] = row["Price per unit"] if row['Weights'] == 1: price_per_unit[row["Ingredients"]] = row["Price per unit"]</pre>							
[106	<pre>for index, row in df.iterrows(): curr = ''.join(row["name"].split(",")[:1]) try: df.loc[index, "price_per_unit"] = price_per_unit[except: df.loc[index, "price_per_unit"] = 10000</pre>							
n [107	<pre># Get the serving size value serving_size = df['serving_size (g)'].values[0] # Divide all columns by the serving size value, except for the 'name' co for col in df.columns: if col != 'name': df[col] = df[col] / serving_size</pre>							
	<pre># drop any columns that are all 0 df = df.loc[:, (df != 0).any(axis=0)]</pre>							
		op any rows that are all df.loc[(df != 0).any(axi						

df

Out[107]:

:		name	serving_size (g)	calories (kcal)	total_fat (g)	saturated_fat (g)	cholesterol (mg)	sodium (mg)	cho (r
	0	Cornstarch	1.0	3.81	0.001	0.000	0.00	0.09	0.0
	1	Nuts, pecans	1.0	6.91	0.720	0.062	0.00	0.00	0.4
	2	Eggplant, raw	1.0	0.25	0.002	0.000	0.00	0.02	0.0
	3	Teff, uncooked	1.0	3.67	0.024	0.004	0.00	0.12	0
	4	Sherbet, orange	1.0	1.44	0.020	0.012	0.01	0.46	0.
	•••	•••	•••	•••	•••	•••			
	8784	Beef, raw, all grades, trimmed to 0" fat, sepa	1.0	1.25	0.035	0.014	0.62	0.54	0.0
	8785	Lamb, cooked, separable lean only, composite o	1.0	2.06	0.089	0.039	1.09	0.50	0.0
	8786	Lamb, raw, separable lean and fat, composite o	1.0	2.77	0.230	0.120	0.78	0.39	0.1
	8787	Beef, raw, all grades, trimmed to 0" fat, sepa	1.0	1.21	0.030	0.011	0.60	0.53	0.0
	8788	Beef, raw, all grades, trimmed to 0" fat, sepa	1.0	1.21	0.030	0.011	0.60	0.53	0.0

8789 rows × 75 columns

Optimization Model

```
import gurobipy as gb
In [109...
          import pandas as pd
          # Assuming 'df' is a pandas DataFrame already defined with nutritional info
          # 'W' contains the decision variables representing ingredient weights
          # Initialize the model
         model = gb.Model()
         # Create variables (change vtype to GRB.CONTINUOUS if fractional weights are
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
         # Set objective to minimize calories
          obj = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
         model.setObjective(obj, gb.GRB.MINIMIZE)
          # Assuming 'mini' and 'maxi' are defined correctly
          # Add constraints for nutrient consumption
          for key in keys:
              if key in mini:
                  model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.index)
                  model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.index)
          #Constraint of the 1/5th (to remove any excesses of one particular ingredien
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df.</pre>
          # Optimize the model
         model.optimize()
          # Print the optimal solution and the name of the ingredients used
          print('Optimal solution:')
          for i in W.keys():
              if W[i].X > 0:
                  print(f'W[\{i\}] = \{W[i].X\}')
                  print(f'Ingredient: {df.loc[i, "name"]}')
          print(f'Objective Value (Minimum Price): {model.ObjVal * 100/28.3495}')
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0x16f3e7b9
Coefficient statistics:
                   [1e-05, 1e+03]
 Matrix range
  Objective range [3e-05, 1e+02]
                   [0e+00, 0e+00]
  Bounds range
                   [2e-01, 3e+05]
  RHS range
Presolve removed 20 rows and 0 columns (presolve time = 7s) ...
Presolve removed 23 rows and 0 columns (presolve time = 16s) ...
Presolve removed 23 rows and 0 columns (presolve time = 72s) ...
Presolve removed 23 rows and 0 columns (presolve time = 76s) ...
Presolve removed 23 rows and 0 columns (presolve time = 84s) ...
Presolve removed 23 rows and 0 columns (presolve time = 86s) ...
Presolve removed 76 rows and 0 columns
Presolve time: 87.43s
Presolved: 8857 rows, 8842 columns, 77600180 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 1.29s
Barrier statistics:
 AA' NZ
        : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 80 seconds per iteration)
 Threads
           : 3
Barrier performed 0 iterations in 140.69 seconds (432.64 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration Objective
                           Primal Inf.
                                           Dual Inf.
                                                           Time
           1.0835521e+00
                           0.000000e+00
     126
                                           0.000000e+00
                                                           150s
Solved in 126 iterations and 150.05 seconds (46.07 work units)
Optimal objective 1.083552094e+00
Optimal solution:
W[256] = 5.676798333138195
Ingredient: Fish oil, cod liver
W[285] = 0.5929759195615101
Ingredient: Acerola juice, raw
W[297] = 33.33275821212947
Ingredient: Onions, raw, welsh
W[356] = 17.873501390548142
Ingredient: Fish oil, herring
W[665] = 156.65345302937155
Ingredient: Yam, raw
W[696] = 34.704418721122856
Ingredient: Tofu, dried-frozen (koyadofu)
W[883] = 39.03041462550613
Ingredient: Seeds, low-fat, sesame flour
W[2437] = 1.453650556034502
Ingredient: Nuts, blanched, hazelnuts or filberts
W[2857] = 9.573238858287318
Ingredient: KELLOGG'S, Original 3-Bean Chips, BEANATURAL
W[3598] = 16.45002832836686
Ingredient: Sea lion, meat with fat (Alaska Native), Steller
```

```
W[3810] = 156.65345302937158
Ingredient: Cardoon, without salt, drained, boiled, cooked
W[4291] = 35.29158066920942
Ingredient: Yam, without salt, or baked, drained, boiled, cooked
W[5058] = 61.8699630854659
Ingredient: Cereals, dry, 10 minute cooking, regular, CREAM OF WHEAT
W[5120] = 9.366579299337232
Ingredient: Cereals ready-to-eat, RALSTON Enriched Wheat Bran flakes
W[5312] = 10.399372835673548
Ingredient: USDA Commodity Food, low saturated fat, vegetable, oil
W[5334] = 134.17563260296305
Ingredient: Spaghetti, enriched (n x 6.25), dry, protein-fortified
W[5392] = 12.748092348793582
Ingredient: Wocas, yellow pond lily (Klamath), Oregon, dried seeds
W[5929] = 9.67365950923953
Ingredient: Tofu, prepared with calcium sulfate, dried-frozen (koyadofu)
W[6220] = 0.5468103467066588
Ingredient: Beef, raw, liver, variety meats and by-products, imported, New
Zealand
W[6525] = 34.232059022512054
Ingredient: Whale, skin and subcutaneous fat (muktuk) (Alaska Native), bowh
W[8028] = 2.9688244235188104
Ingredient: Margarine, CANOLA HARVEST Soft Spread (canola, palm and palm ke
rnel oils), tub, 80% fat
Objective Value (Minimum Price): 3.82212065153449
```

Optimal solution

```
In [110... # Print the optimal solution and the name of the ingredients used in tabular
         # Create a list of the ingredients used
          ingredients = []
          for i in W.keys():
             if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
          # Create a DataFrame with the optimal solution
          solution = pd.DataFrame(columns=['Ingredient', 'Weight (g)'])
          for i in W.keys():
             if W[i].X > 0:
                  solution.loc[i, 'Ingredient'] = df.loc[i, 'name']
                 solution.loc[i, 'Weight (g)'] = W[i].X
          # Print the DataFrame
          print(solution)
         # Print the total cost of the diet
         print(f'\nTotal cost of the diet: ${model.0bjVal * 100/28.3495}')
         # Print the total weight of the diet
          print(f'\nTotal weight of the diet: {sum(solution["Weight (g)"])} grams')
```

```
Ingredient Weight (g)
256
                                    Fish oil, cod liver
                                                           5.676798
285
                                     Acerola juice, raw
                                                           0.592976
297
                                     Onions, raw, welsh
                                                          33.332758
356
                                      Fish oil, herring
                                                          17.873501
                                               Yam, raw
665
                                                         156.653453
696
                          Tofu, dried-frozen (koyadofu)
                                                           34.704419
883
                           Seeds, low-fat, sesame flour
                                                           39.030415
2437
                  Nuts, blanched, hazelnuts or filberts
                                                           1.453651
           KELLOGG'S, Original 3-Bean Chips, BEANATURAL
2857
                                                           9.573239
3598
       Sea lion, meat with fat (Alaska Native), Steller
                                                           16.450028
3810
         Cardoon, without salt, drained, boiled, cooked
                                                         156.653453
4291
     Yam, without salt, or baked, drained, boiled, ...
                                                           35.291581
5058 Cereals, dry, 10 minute cooking, regular, CREA...
                                                           61.869963
5120
     Cereals ready-to-eat, RALSTON Enriched Wheat B...
                                                           9.366579
      USDA Commodity Food, low saturated fat, vegeta...
5312
                                                           10.399373
      Spaghetti, enriched (n x 6.25), dry, protein-f...
5334
                                                         134.175633
5392
     Wocas, yellow pond lily (Klamath), Oregon, dri...
                                                           12.748092
5929
     Tofu, prepared with calcium sulfate, dried-fro...
                                                             9.67366
6220
      Beef, raw, liver, variety meats and by-product...
                                                             0.54681
6525
     Whale, skin and subcutaneous fat (muktuk) (Ala...
                                                           34.232059
8028 Margarine, CANOLA HARVEST Soft Spread (canola,...
                                                           2.968824
Total cost of the diet: $3.82212065153449
```

Total weight of the diet: 783.267265146858 grams

Case studies

Case1: Iron-Deficieny Anaemia in pregnant women

```
# Initialize the model
In [111...
         model = gb.Model()
         # Create variables (change vtype to GRB.CONTINUOUS if fractional weights are
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
         # Set objective to minimize calories
         obj = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
         model.setObjective(obj, gb.GRB.MINIMIZE)
         # Assuming 'mini' and 'maxi' are defined correctly
         # Add constraints for nutrient consumption
          for key in keys:
              if key in mini:
                  if key =='iron (mg)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                  else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
              if key in maxi:
                  if key =='iron (mg)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
          #Constraint of the 1/5th(to remove any excesses of one particular ingredient
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df</pre>
         # Optimize the model
         model.optimize()
```

```
# Print the optimal solution and the name of the ingredients used
print('Optimal solution:')
for i in W.keys():
    if W[i].X > 0:
        print(f'W[{i}] = {W[i].X}')
        print(f'Ingredient: {df.loc[i, "name"]}')

print(f'Objective Value (Minimum Price): {model.ObjVal * 100/28.3495}')
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0xfcc45001
Coefficient statistics:
                   [1e-05, 1e+03]
 Matrix range
  Objective range [3e-05, 1e+02]
                   [0e+00, 0e+00]
  Bounds range
                   [2e-01, 3e+05]
  RHS range
Presolve removed 18 rows and 0 columns (presolve time = 5s) ...
Presolve removed 23 rows and 0 columns (presolve time = 16s) ...
Presolve removed 23 rows and 0 columns (presolve time = 53s) ...
Presolve removed 23 rows and 0 columns (presolve time = 58s) ...
Presolve removed 23 rows and 0 columns (presolve time = 65s) ...
Presolve removed 23 rows and 0 columns (presolve time = 65s) ...
Presolve removed 76 rows and 0 columns
Presolve time: 68.49s
Presolved: 8857 rows, 8842 columns, 77600180 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 1.25s
Barrier statistics:
 AA' NZ
        : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 70 seconds per iteration)
 Threads
           : 3
Barrier performed 0 iterations in 106.48 seconds (432.64 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration Objective
                           Primal Inf.
                                           Dual Inf.
                                                           Time
            1.2900128e+00
                           0.000000e+00
      83
                                           0.000000e+00
                                                           114s
Solved in 83 iterations and 114.43 seconds (45.99 work units)
Optimal objective 1.290012786e+00
Optimal solution:
W[256] = 5.6789739447503385
Ingredient: Fish oil, cod liver
W[285] = 1.531904705141629
Ingredient: Acerola juice, raw
W[297] = 24.34725942238764
Ingredient: Onions, raw, welsh
W[356] = 6.052562329218256
Ingredient: Fish oil, herring
W[665] = 105.41305639455075
Ingredient: Yam, raw
W[696] = 41.3093606976791
Ingredient: Tofu, dried-frozen (koyadofu)
W[883] = 34.24091671120149
Ingredient: Seeds, low-fat, sesame flour
W[2085] = 136.67787884984597
Ingredient: Whale, raw (Alaska Native), meat, beluga
W[2437] = 23.848322695247756
Ingredient: Nuts, blanched, hazelnuts or filberts
W[2857] = 29.953680900285676
Ingredient: KELLOGG'S, Original 3-Bean Chips, BEANATURAL
```

```
W[3162] = 2.0167006303514525
Ingredient: Cereals, dry, plain, original, MALT-O-MEAL
W[3598] = 18.06805756550674
Ingredient: Sea lion, meat with fat (Alaska Native), Steller
W[3810] = 163.25201740430788
Ingredient: Cardoon, without salt, drained, boiled, cooked
W[5058] = 59.1077381992295
Ingredient: Cereals, dry, 10 minute cooking, regular, CREAM OF WHEAT
W[5120] = 9.30510305071482
Ingredient: Cereals ready-to-eat, RALSTON Enriched Wheat Bran flakes
W[5312] = 20.201245010202346
Ingredient: USDA Commodity Food, low saturated fat, vegetable, oil
W[5334] = 126.34459445753122
Ingredient: Spaghetti, enriched (n x 6.25), dry, protein-fortified
W[5392] = 2.5701793397024826
Ingredient: Wocas, yellow pond lily (Klamath), Oregon, dried seeds
W[5929] = 6.340534713684285
Ingredient: Tofu, prepared with calcium sulfate, dried-frozen (koyadofu)
Objective Value (Minimum Price): 4.550389903280612
```

```
In [112... # Print the optimal solution and the name of the ingredients used in tabular
         # Create a list of the ingredients used
          ingredients = []
          for i in W.keys():
             if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
          # Create a DataFrame with the optimal solution
          solution = pd.DataFrame(columns=['Ingredient', 'Weight (g)'])
         for i in W.keys():
             if W[i].X > 0:
                  solution.loc[i, 'Ingredient'] = df.loc[i, 'name']
                 solution.loc[i, 'Weight (g)'] = W[i].X
          # Print the DataFrame
          print(solution)
          # Print the total cost of the diet
         print(f'\nTotal cost of the diet: ${model.0bjVal * 100/28.3495}')
         # Print the total weight of the diet
          print(f'\nTotal weight of the diet: {sum(solution["Weight (g)"])} grams')
```

```
Ingredient Weight (g)
256
                                    Fish oil, cod liver
                                                           5.678974
285
                                     Acerola juice, raw
                                                           1.531905
297
                                     Onions, raw, welsh
                                                          24.347259
                                      Fish oil, herring
356
                                                           6.052562
                                               Yam, raw
665
                                                         105.413056
696
                          Tofu, dried-frozen (koyadofu)
                                                           41.309361
883
                           Seeds, low-fat, sesame flour
                                                           34.240917
2085
               Whale, raw (Alaska Native), meat, beluga
                                                          136.677879
                  Nuts, blanched, hazelnuts or filberts
2437
                                                           23.848323
           KELLOGG'S, Original 3-Bean Chips, BEANATURAL
2857
                                                           29.953681
3162
             Cereals, dry, plain, original, MALT-O-MEAL
                                                           2.016701
3598
       Sea lion, meat with fat (Alaska Native), Steller
                                                          18.068058
3810
         Cardoon, without salt, drained, boiled, cooked 163.252017
5058 Cereals, dry, 10 minute cooking, regular, CREA...
                                                           59.107738
5120
     Cereals ready-to-eat, RALSTON Enriched Wheat B...
                                                           9.305103
      USDA Commodity Food, low saturated fat, vegeta...
5312
                                                           20.201245
      Spaghetti, enriched (n x 6.25), dry, protein-f...
5334
                                                          126.344594
5392
     Wocas, yellow pond lily (Klamath), Oregon, dri...
                                                           2.570179
5929
     Tofu, prepared with calcium sulfate, dried-fro...
                                                           6.340535
```

Total cost of the diet: \$4.550389903280612

Total weight of the diet: 816.2600870215394 grams

Case 2: Vitamin D deficiency

```
In [113... # Initialize the model
         model = gb.Model()
         # Create variables (change vtype to GRB.CONTINUOUS if fractional weights are
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
         # Set objective to minimize calories
         obj = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
         model.setObjective(obj, gb.GRB.MINIMIZE)
         # Assuming 'mini' and 'maxi' are defined correctly
         # Add constraints for nutrient consumption
          for key in keys:
              if key in mini:
                  if key =='vitamin_d (IU)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                  else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
              if key in maxi:
                  if key =='vitamin d (IU)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                  else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
         #Constraint of the 1/5th(to remove any excesses of one particular ingredient
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df</pre>
         # Optimize the model
         model.optimize()
         # Print the optimal solution and the name of the ingredients used
          print('Optimal solution:')
          for i in W.keys():
              if W[i].X > 0:
                  print(f'W[\{i\}] = \{W[i].X\}')
```

```
print(f'Ingredient: {df.loc[i, "name"]}')
print(f'Objective Value (Minimum Price): {model.ObjVal * 100/28.3495}')
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0xca326616
Coefficient statistics:
                   [1e-05, 1e+03]
 Matrix range
  Objective range [3e-05, 1e+02]
                   [0e+00, 0e+00]
  Bounds range
                   [2e-01, 3e+05]
  RHS range
Presolve removed 0 rows and 0 columns (presolve time = 5s) ...
Presolve removed 23 rows and 0 columns (presolve time = 15s) ...
Presolve removed 23 rows and 0 columns (presolve time = 65s) ...
Presolve removed 23 rows and 0 columns (presolve time = 69s) ...
Presolve removed 23 rows and 0 columns (presolve time = 70s) ...
Presolve removed 23 rows and 0 columns (presolve time = 77s) ...
Presolve removed 76 rows and 0 columns
Presolve time: 81.14s
Presolved: 8857 rows, 8842 columns, 77600180 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 1.21s
Barrier statistics:
 AA' NZ
        : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 70 seconds per iteration)
 Threads
           : 3
Barrier performed 0 iterations in 106.57 seconds (43.73 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration Objective
                           Primal Inf.
                                           Dual Inf.
                                                           Time
           3.4880629e+00
                           0.000000e+00
      96
                                           0.000000e+00
                                                           115s
Solved in 96 iterations and 115.09 seconds (45.81 work units)
Optimal objective 3.488062885e+00
Optimal solution:
W[180] = 7.871248285913017
Ingredient: Amaranth leaves, raw
W[256] = 9.056541354200336
Ingredient: Fish oil, cod liver
W[538] = 0.5311709446314284
Ingredient: Nuts, almonds
W[696] = 36.51282919213001
Ingredient: Tofu, dried-frozen (koyadofu)
W[883] = 15.137086743751775
Ingredient: Seeds, low-fat, sesame flour
W[1270] = 30.877744182154398
Ingredient: Nuts, dried, butternuts
W[1291] = 207.86511664157234
Ingredient: Mushrooms, raw, maitake
W[2027] = 9.814194744634912
Ingredient: Fish, raw, Greenland, halibut
W[2857] = 95.65348427607054
Ingredient: KELLOGG'S, Original 3-Bean Chips, BEANATURAL
W[3162] = 19.149785061644767
Ingredient: Cereals, dry, plain, original, MALT-O-MEAL
```

```
W[3372] = 10.966368226321217
Ingredient: Sea lion, liver (Alaska Native), Steller
W[3598] = 28.024233315196362
Ingredient: Sea lion, meat with fat (Alaska Native), Steller
W[3621] = 10.808509526623311
Ingredient: Sweeteners, packets, EQUAL, aspartame, tabletop
W[4744] = 34.493254093683845
Ingredient: Sweetener, herbal extract powder from Stevia leaf
W[4930] = 11.564330024440991
Ingredient: Cereals ready-to-eat, Warm Cinnamon, KASHI HEART TO HEART
W[4947] = 207.86511664157234
Ingredient: Spaghetti, enriched (n x 6.25), cooked, protein-fortified
W[5058] = 43.38698464763886
Ingredient: Cereals, dry, 10 minute cooking, regular, CREAM OF WHEAT
W[5392] = 21.397535173146178
Ingredient: Wocas, yellow pond lily (Klamath), Oregon, dried seeds
W[5617] = 2.1870637547129483
Ingredient: Babyfood, organic, carrot and squash, apple, 2nd Foods, GERBER
W[5809] = 17.733616446714105
Ingredient: Pork, raw, frozen, ears, variety meats and by-products, fresh
W[5929] = 10.56425328953689
Ingredient: Tofu, prepared with calcium sulfate, dried-frozen (koyadofu)
W[7436] = 207.86511664157237
Ingredient: Mushrooms, raw, exposed to ultraviolet light, or crimini, itali
an, brown
Objective Value (Minimum Price): 12.30378978557047
```

```
In [114... # Print the optimal solution and the name of the ingredients used in tabular
         # Create a list of the ingredients used
          ingredients = []
          for i in W.keys():
             if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
          # Create a DataFrame with the optimal solution
          solution = pd.DataFrame(columns=['Ingredient', 'Weight (g)'])
          for i in W.keys():
             if W[i].X > 0:
                  solution.loc[i, 'Ingredient'] = df.loc[i, 'name']
                  solution.loc[i, 'Weight (g)'] = W[i].X
          # Print the DataFrame
         print(solution)
         # Print the total cost of the diet
          print(f'\nTotal cost of the diet: ${model.ObjVal * 100/28.3495}')
          # Print the total weight of the diet
          print(f'\nTotal weight of the diet: {sum(solution["Weight (q)"])} grams')
```

```
Ingredient Weight (g)
                                                            7.871248
180
                                   Amaranth leaves, raw
256
                                    Fish oil, cod liver
                                                            9.056541
538
                                          Nuts, almonds
                                                            0.531171
696
                          Tofu, dried-frozen (koyadofu)
                                                           36.512829
883
                           Seeds, low-fat, sesame flour
                                                           15.137087
                                Nuts, dried, butternuts
1270
                                                           30.877744
1291
                                                          207.865117
                                Mushrooms, raw, maitake
2027
                          Fish, raw, Greenland, halibut
                                                           9.814195
2857
           KELLOGG'S, Original 3-Bean Chips, BEANATURAL
                                                           95.653484
3162
             Cereals, dry, plain, original, MALT-O-MEAL
                                                           19.149785
               Sea lion, liver (Alaska Native), Steller
3372
                                                           10.966368
3598
       Sea lion, meat with fat (Alaska Native), Steller
                                                           28.024233
3621
        Sweeteners, packets, EQUAL, aspartame, tabletop
                                                           10.80851
4744 Sweetener, herbal extract powder from Stevia leaf
                                                           34.493254
     Cereals ready-to-eat, Warm Cinnamon, KASHI HEA...
4930
                                                            11.56433
4947
      Spaghetti, enriched (n x 6.25), cooked, protei...
                                                          207.865117
      Cereals, dry, 10 minute cooking, regular, CREA...
5058
                                                          43.386985
5392
     Wocas, yellow pond lily (Klamath), Oregon, dri...
                                                           21.397535
      Babyfood, organic, carrot and squash, apple, 2...
5617
                                                           2.187064
5809
      Pork, raw, frozen, ears, variety meats and by-...
                                                           17.733616
5929
     Tofu, prepared with calcium sulfate, dried-fro...
                                                           10.564253
7436 Mushrooms, raw, exposed to ultraviolet light, ...
                                                          207.865117
```

Total cost of the diet: \$12.30378978557047

Total weight of the diet: 1039.3255832078628 grams

Case 3: Protein heavy diet

```
In [115...
        # Initialize the model
         model = gb.Model()
         # Create variables (change vtype to GRB.CONTINUOUS if fractional weights are
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
         # Set objective to minimize calories
          obj = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
         model.setObjective(obj, gb.GRB.MINIMIZE)
         # Assuming 'mini' and 'maxi' are defined correctly
          # Add constraints for nutrient consumption
          for key in keys:
              if key in mini:
                 if key =='protein (g)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
              if key in maxi:
                 if key =='protein (g)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                 else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
         #Constraint of the 1/5th(to remove any excesses of one particular ingredient
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df.
         # Optimize the model
         model.optimize()
         # Print the optimal solution and the name of the ingredients used
          print('Optimal solution:')
```

```
for i in W.keys():
    if W[i].X > 0:
        print(f'W[{i}] = {W[i].X}')
        print(f'Ingredient: {df.loc[i, "name"]}')

print(f'Objective Value (Minimum Price): {model.ObjVal * 100/28.3495}')
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0xc98dff06
Coefficient statistics:
                   [1e-05, 1e+03]
 Matrix range
  Objective range [3e-05, 1e+02]
                   [0e+00, 0e+00]
  Bounds range
                   [2e-01, 3e+05]
  RHS range
Presolve removed 18 rows and 0 columns (presolve time = 5s) ...
Presolve removed 23 rows and 0 columns (presolve time = 13s) ...
Presolve removed 23 rows and 0 columns (presolve time = 45s) ...
Presolve removed 23 rows and 0 columns (presolve time = 49s) ...
Presolve removed 23 rows and 0 columns (presolve time = 51s) ...
Presolve removed 23 rows and 0 columns (presolve time = 55s) ...
Presolve removed 76 rows and 0 columns
Presolve time: 58.45s
Presolved: 8857 rows, 8842 columns, 77600180 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 1.82s
Barrier statistics:
 AA' NZ
        : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 70 seconds per iteration)
 Threads
           : 3
Barrier performed 0 iterations in 81.67 seconds (43.73 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration Objective
                           Primal Inf.
                                           Dual Inf.
                                                           Time
            1.2299986e+00
                           0.000000e+00
      72
                                           0.000000e+00
                                                            90s
Solved in 72 iterations and 90.00 seconds (45.76 work units)
Optimal objective 1.229998619e+00
Optimal solution:
W[256] = 5.979222851877564
Ingredient: Fish oil, cod liver
W[285] = 3.04397874424587
Ingredient: Acerola juice, raw
W[297] = 22.6495112682897
Ingredient: Onions, raw, welsh
W[665] = 85.08871048395295
Ingredient: Yam, raw
W[696] = 14.439823436015232
Ingredient: Tofu, dried-frozen (koyadofu)
W[883] = 34.2704666484676
Ingredient: Seeds, low-fat, sesame flour
W[2085] = 19.499197959655728
Ingredient: Whale, raw (Alaska Native), meat, beluga
W[2857] = 48.94759367122379
Ingredient: KELLOGG'S, Original 3-Bean Chips, BEANATURAL
W[3598] = 5.159294568104607
Ingredient: Sea lion, meat with fat (Alaska Native), Steller
W[3810] = 202.43682372423243
Ingredient: Cardoon, without salt, drained, boiled, cooked
```

```
W[4947] = 190.0256358938021
Ingredient: Spaghetti, enriched (n \times 6.25), cooked, protein-fortified
W[5058] = 59.26577258423876
Ingredient: Cereals, dry, 10 minute cooking, regular, CREAM OF WHEAT
W[5120] = 0.602236177461909
Ingredient: Cereals ready-to-eat, RALSTON Enriched Wheat Bran flakes
W[5312] = 22.20829955661169
Ingredient: USDA Commodity Food, low saturated fat, vegetable, oil
W[5334] = 202.43682372423237
Ingredient: Spaghetti, enriched (n x 6.25), dry, protein-fortified
W[5392] = 33.630925579982595
Ingredient: Wocas, yellow pond lily (Klamath), Oregon, dried seeds
W[5929] = 7.653978150790162
Ingredient: Tofu, prepared with calcium sulfate, dried-frozen (koyadofu)
W[6295] = 10.371225001335956
Ingredient: Pork, braised, cooked, pancreas, variety meats and by-products,
fresh
W[6525] = 44.47459859663973
Ingredient: Whale, skin and subcutaneous fat (muktuk) (Alaska Native), bowh
Objective Value (Minimum Price): 4.338695988601508
```

```
In [116... # Print the optimal solution and the name of the ingredients used in tabular
          # Create a list of the ingredients used
          ingredients = []
          for i in W.keys():
              if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
          # Create a DataFrame with the optimal solution
          solution = pd.DataFrame(columns=['Ingredient', 'Weight (q)'])
          for i in W.keys():
              if W[i].X > 0:
                  solution.loc[i, 'Ingredient'] = df.loc[i, 'name']
                  solution.loc[i, 'Weight (g)'] = W[i].X
          # Print the DataFrame
          print(solution)
          # Print the total cost of the diet
          print(f'\nTotal cost of the diet: ${model.0bjVal * 100/28.3495}')
          # Print the total weight of the diet
          print(f'\nTotal weight of the diet: {sum(solution["Weight (g)"])} grams')
```

```
Ingredient Weight (g)
                                                           5.979223
256
                                    Fish oil, cod liver
285
                                     Acerola juice, raw
                                                           3.043979
297
                                     Onions, raw, welsh
                                                          22.649511
665
                                               Yam, raw
                                                           85.08871
696
                          Tofu, dried-frozen (koyadofu)
                                                          14.439823
883
                           Seeds, low-fat, sesame flour
                                                          34.270467
2085
               Whale, raw (Alaska Native), meat, beluga
                                                          19.499198
2857
           KELLOGG'S, Original 3-Bean Chips, BEANATURAL
                                                          48.947594
       Sea lion, meat with fat (Alaska Native), Steller
3598
                                                           5.159295
         Cardoon, without salt, drained, boiled, cooked
3810
                                                         202.436824
4947
      Spaghetti, enriched (n x 6.25), cooked, protei...
                                                         190.025636
5058 Cereals, dry, 10 minute cooking, regular, CREA...
                                                          59.265773
5120 Cereals ready—to—eat, RALSTON Enriched Wheat B...
                                                           0.602236
5312
      USDA Commodity Food, low saturated fat, vegeta...
                                                            22.2083
      Spaghetti, enriched (n x 6.25), dry, protein-f... 202.436824
5334
5392
     Wocas, yellow pond lily (Klamath), Oregon, dri...
                                                          33.630926
5929
     Tofu, prepared with calcium sulfate, dried-fro...
                                                           7.653978
6295
     Pork, braised, cooked, pancreas, variety meats...
                                                          10.371225
6525 Whale, skin and subcutaneous fat (muktuk) (Ala...
                                                          44.474599
```

Total cost of the diet: \$4.338695988601508

Total weight of the diet: 1012.1841186211607 grams

Case 4: Calorie deficit diet

```
In [117... # Initialize the model
         model = gb.Model()
         # Create variables (change vtype to GRB.CONTINUOUS if fractional weights are
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
         # Set objective to minimize calories
         obj = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
         model.setObjective(obj, gb.GRB.MINIMIZE)
         # Assuming 'mini' and 'maxi' are defined correctly
         # Add constraints for nutrient consumption
          for key in keys:
              if key in mini:
                  if key =='calories (kcal)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                  else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
              if key in maxi:
                  if key =='calories (kcal)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                  else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
         #Constraint of the 1/5th(to remove any excesses of one particular ingredient
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df</pre>
         # Optimize the model
         model.optimize()
         # Print the optimal solution and the name of the ingredients used
          print('Optimal solution:')
          for i in W.keys():
              if W[i].X > 0:
                  print(f'W[\{i\}] = \{W[i].X\}')
```

```
print(f'Ingredient: {df.loc[i, "name"]}')
print(f'Objective Value (Minimum Price): {model.ObjVal * 100/28.3495}')
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0xa3bc8685
Coefficient statistics:
                   [1e-05, 1e+03]
  Matrix range
  Objective range [3e-05, 1e+02]
                   [0e+00, 0e+00]
  Bounds range
                   [2e-01, 3e+05]
  RHS range
Presolve removed 20 rows and 0 columns (presolve time = 6s) ...
Presolve removed 23 rows and 0 columns (presolve time = 12s) ...
Presolve removed 23 rows and 0 columns (presolve time = 51s) ...
Presolve removed 23 rows and 0 columns (presolve time = 56s) ...
Presolve removed 23 rows and 0 columns (presolve time = 60s) ...
Presolve removed 76 rows and 0 columns
Presolve time: 62.84s
Presolved: 8857 rows, 8842 columns, 77600180 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 1.26s
Barrier statistics:
 AA' NZ : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 70 seconds per iteration)
 Threads
Barrier performed 0 iterations in 83.50 seconds (43.73 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration Objective
                            Primal Inf. Dual Inf.
                                                           Time
            1.2072489e+00 0.000000e+00
                                           0.000000e+00
                                                           92s
     116
Solved in 116 iterations and 91.71 seconds (45.83 work units)
Optimal objective 1.207248947e+00
Optimal solution:
W[180] = 4.14951134940416
Ingredient: Amaranth leaves, raw
W[256] = 5.808210494294022
Ingredient: Fish oil, cod liver
W[285] = 0.8052958092447263
Ingredient: Acerola juice, raw
W[297] = 20.339132897977652
Ingredient: Onions, raw, welsh
W[665] = 136.90719803247654
Ingredient: Yam, raw
W[696] = 25.702935027415446
Ingredient: Tofu, dried-frozen (koyadofu)
W[883] = 26.83000864425127
Ingredient: Seeds, low-fat, sesame flour
W[989] = 160.26446785460672
Ingredient: Turnips, unprepared, frozen
W[2437] = 50.3057162133433
Ingredient: Nuts, blanched, hazelnuts or filberts
W[2857] = 6.1608709353683375
Ingredient: KELLOGG'S, Original 3-Bean Chips, BEANATURAL
W[3162] = 6.8155927110312025
```

```
Ingredient: Cereals, dry, plain, original, MALT-O-MEAL
         W[3598] = 23.656707483178103
         Ingredient: Sea lion, meat with fat (Alaska Native), Steller
         W[3810] = 160.2644678546069
         Ingredient: Cardoon, without salt, drained, boiled, cooked
         W[3875] = 31.917569135596985
         Ingredient: Tofu, prepared with calcium sulfate, firm, raw
         W[5120] = 5.236772260921432
         Ingredient: Cereals ready-to-eat, RALSTON Enriched Wheat Bran flakes
         W[5334] = 113.6148117897728
         Ingredient: Spaghetti, enriched (n x 6.25), dry, protein-fortified
         W[5744] = 1.669059068501886
         Ingredient: Cereals ready-to-eat, Honey Toasted Oat, KASHI HEART TO HEART
         W[5929] = 14.236109368179457
         Ingredient: Tofu, prepared with calcium sulfate, dried-frozen (koyadofu)
         W[6157] = 0.8058596162455399
         Ingredient: Cereals ready-to-eat, KELLOGG'S ALL-BRAN COMPLETE Wheat Flakes,
         KELLOGG
         W[6295] = 4.961046675298493
         Ingredient: Pork, braised, cooked, pancreas, variety meats and by-products,
         fresh
         W[8491] = 0.8709960513198554
         Ingredient: Gelatin desserts, vitamin C, sodium, potassium, added phosphoru
         s, with aspartame, reduced calorie, dry mix
         Objective Value (Minimum Price): 4.2584488171291
        # Print the optimal solution and the name of the ingredients used in tabular
In [118...
         # Create a list of the ingredients used
         ingredients = []
         for i in W.keys():
             if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
         # Create a DataFrame with the optimal solution
         solution = pd.DataFrame(columns=['Ingredient', 'Weight (g)'])
         for i in W.keys():
             if W[i].X > 0:
                  solution.loc[i, 'Ingredient'] = df.loc[i, 'name']
                 solution.loc[i, 'Weight (g)'] = W[i].X
         # Print the DataFrame
```

print(f'\nTotal cost of the diet: \${model.0bjVal * 100/28.3495}')

print(f'\nTotal weight of the diet: {sum(solution["Weight (g)"])} grams')

print(solution)

Print the total cost of the diet

Print the total weight of the diet

```
Ingredient Weight (g)
180
                                   Amaranth leaves, raw
                                                           4.149511
256
                                    Fish oil, cod liver
                                                             5.80821
                                     Acerola juice, raw
285
                                                            0.805296
297
                                     Onions, raw, welsh
                                                           20.339133
                                               Yam, raw
665
                                                         136.907198
696
                          Tofu, dried-frozen (koyadofu)
                                                           25.702935
883
                           Seeds, low-fat, sesame flour
                                                           26.830009
989
                            Turnips, unprepared, frozen
                                                          160.264468
2437
                  Nuts, blanched, hazelnuts or filberts
                                                           50.305716
           KELLOGG'S, Original 3-Bean Chips, BEANATURAL
2857
                                                           6.160871
3162
             Cereals, dry, plain, original, MALT-O-MEAL
                                                            6.815593
3598
       Sea lion, meat with fat (Alaska Native), Steller
                                                          23.656707
3810
         Cardoon, without salt, drained, boiled, cooked 160.264468
3875
         Tofu, prepared with calcium sulfate, firm, raw
                                                           31.917569
5120
     Cereals ready—to—eat, RALSTON Enriched Wheat B...
                                                            5.236772
5334
      Spaghetti, enriched (n x 6.25), dry, protein-f...
                                                          113.614812
      Cereals ready-to-eat, Honey Toasted Oat, KASHI...
5744
                                                            1.669059
5929
     Tofu, prepared with calcium sulfate, dried-fro...
                                                           14.236109
6157
      Cereals ready-to-eat, KELLOGG'S ALL-BRAN COMPL...
                                                            0.80586
     Pork, braised, cooked, pancreas, variety meats...
                                                            4.961047
8491 Gelatin desserts, vitamin C, sodium, potassium...
                                                           0.870996
```

Total cost of the diet: \$4.2584488171291

Total weight of the diet: 801.3223392730348 grams

Case 5: Scurvy patient

```
In [119...
        # Initialize the model
         model = qb.Model()
         # Create variables (change vtype to GRB.CONTINUOUS if fractional weights are
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
         # Set objective to minimize calories
          obj = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
         model.setObjective(obj, gb.GRB.MINIMIZE)
         # Assuming 'mini' and 'maxi' are defined correctly
          # Add constraints for nutrient consumption
          for key in keys:
              if key in mini:
                  if key =='vitamin_c (mg)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                 else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
             if key in maxi:
                 if key =='vitamin_c (mg)':
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
                 else:
                      model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.ir
         #Constraint of the 1/5th(to remove any excesses of one particular ingredient
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df
         # Optimize the model
         model.optimize()
          # Print the optimal solution and the name of the ingredients used
          print('Optimal solution:')
          for i in W.keys():
```

```
if W[i].X > 0:
    print(f'W[{i}] = {W[i].X}')
    print(f'Ingredient: {df.loc[i, "name"]}')

print(f'Objective Value (Minimum Price): {model.ObjVal * 100/28.3495}')
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0x89d878cb
Coefficient statistics:
                   [1e-05, 1e+03]
 Matrix range
  Objective range [3e-05, 1e+02]
  Bounds range
                   [0e+00, 0e+00]
                   [2e-01, 3e+05]
  RHS range
Presolve removed 20 rows and 0 columns (presolve time = 7s) ...
Presolve removed 24 rows and 0 columns (presolve time = 12s) ...
Presolve removed 24 rows and 0 columns (presolve time = 53s) ...
Presolve removed 24 rows and 0 columns (presolve time = 58s) ...
Presolve removed 24 rows and 0 columns (presolve time = 62s) ...
Presolve removed 24 rows and 0 columns (presolve time = 70s) ...
Presolve removed 76 rows and 0 columns
Presolve time: 73.69s
Presolved: 8857 rows, 8841 columns, 77600179 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 1.71s
Barrier statistics:
 AA' NZ
        : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 70 seconds per iteration)
 Threads
           : 3
Barrier performed 0 iterations in 125.65 seconds (433.34 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration Objective
                           Primal Inf.
                                           Dual Inf.
                                                           Time
            1.0898859e+00
                           0.000000e+00
     114
                                           0.000000e+00
                                                           134s
Solved in 114 iterations and 134.38 seconds (46.76 work units)
Optimal objective 1.089885883e+00
Optimal solution:
W[256] = 5.660886859645235
Ingredient: Fish oil, cod liver
W[285] = 2.092729139178991
Ingredient: Acerola juice, raw
W[297] = 33.385053306452754
Ingredient: Onions, raw, welsh
W[356] = 17.721485863739183
Ingredient: Fish oil, herring
W[665] = 157.05463190570313
Ingredient: Yam, raw
W[696] = 34.33408181305669
Ingredient: Tofu, dried-frozen (koyadofu)
W[883] = 39.2459271554167
Ingredient: Seeds, low-fat, sesame flour
W[2437] = 0.7194305731409942
Ingredient: Nuts, blanched, hazelnuts or filberts
W[2857] = 10.100356228971815
Ingredient: KELLOGG'S, Original 3-Bean Chips, BEANATURAL
W[3598] = 16.383267151946193
Ingredient: Sea lion, meat with fat (Alaska Native), Steller
```

```
W[3810] = 157.05463190570313
         Ingredient: Cardoon, without salt, drained, boiled, cooked
         W[4291] = 33.82191403224329
         Ingredient: Yam, without salt, or baked, drained, boiled, cooked
         W[5058] = 60.276475289622326
         Ingredient: Cereals, dry, 10 minute cooking, regular, CREAM OF WHEAT
         W[5120] = 9.828108984638314
         Ingredient: Cereals ready-to-eat, RALSTON Enriched Wheat Bran flakes
         W[5312] = 10.347726124375374
         Ingredient: USDA Commodity Food, low saturated fat, vegetable, oil
         W[5334] = 134.71297151086378
         Ingredient: Spaghetti, enriched (n x 6.25), dry, protein-fortified
         W[5392] = 12.878290509694553
         Ingredient: Wocas, yellow pond lily (Klamath), Oregon, dried seeds
         W[5929] = 10.13465198401104
         Ingredient: Tofu, prepared with calcium sulfate, dried-frozen (koyadofu)
         W[6220] = 0.4338038474299795
         Ingredient: Beef, raw, liver, variety meats and by-products, imported, New
         Zealand
         W[6525] = 37.169527946339656
         Ingredient: Whale, skin and subcutaneous fat (muktuk) (Alaska Native), bowh
         W[8028] = 1.9172073963421377
         Ingredient: Margarine, CANOLA HARVEST Soft Spread (canola, palm and palm ke
         rnel oils), tub, 80% fat
         Objective Value (Minimum Price): 3.844462452287473
In [120... | # Print the optimal solution and the name of the ingredients used in tabular
         # Create a list of the ingredients used
         ingredients = []
         for i in W.keys():
             if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
         # Create a DataFrame with the optimal solution
         solution = pd.DataFrame(columns=['Ingredient', 'Weight (g)'])
         for i in W.keys():
             if W[i].X > 0:
```

solution.loc[i, 'Ingredient'] = df.loc[i, 'name']

print(f'\nTotal cost of the diet: \${model.ObjVal * 100/28.3495}')

print(f'\nTotal weight of the diet: {sum(solution["Weight (q)"])} grams')

solution.loc[i, 'Weight (g)'] = W[i].X

Print the DataFrame

Print the total cost of the diet

Print the total weight of the diet

print(solution)

```
Ingredient Weight (g)
                                                            5.660887
256
                                    Fish oil, cod liver
285
                                     Acerola juice, raw
                                                            2.092729
297
                                     Onions, raw, welsh
                                                           33.385053
356
                                       Fish oil, herring
                                                           17.721486
665
                                                Yam, raw
                                                          157.054632
696
                          Tofu, dried-frozen (koyadofu)
                                                           34.334082
883
                           Seeds, low-fat, sesame flour
                                                           39.245927
2437
                  Nuts, blanched, hazelnuts or filberts
                                                            0.719431
2857
           KELLOGG'S, Original 3-Bean Chips, BEANATURAL
                                                           10.100356
3598
       Sea lion, meat with fat (Alaska Native), Steller
                                                           16.383267
3810
         Cardoon, without salt, drained, boiled, cooked
                                                          157.054632
4291
      Yam, without salt, or baked, drained, boiled, ...
                                                           33.821914
5058
     Cereals, dry, 10 minute cooking, regular, CREA...
                                                           60.276475
5120
      Cereals ready—to—eat, RALSTON Enriched Wheat B...
                                                            9.828109
      USDA Commodity Food, low saturated fat, vegeta...
5312
                                                           10.347726
      Spaghetti, enriched (n x 6.25), dry, protein-f...
5334
                                                          134.712972
5392
      Wocas, yellow pond lily (Klamath), Oregon, dri...
                                                           12.878291
5929
      Tofu, prepared with calcium sulfate, dried-fro...
                                                           10.134652
      Beef, raw, liver, variety meats and by-product...
6220
                                                            0.433804
6525
      Whale, skin and subcutaneous fat (muktuk) (Ala...
                                                           37.169528
     Margarine, CANOLA HARVEST Soft Spread (canola,...
8028
                                                            1.917207
```

Total cost of the diet: \$3.844462452287473

Total weight of the diet: 785.2731595285155 grams

Case 6: God's diet (Maxed-out Diet)

Use of the multi-objective gurobi environment

```
In [121... model = gb.Model("Multi_Objective")
         W = model.addVars(df.index, vtype=gb.GRB.CONTINUOUS, name='W')
          #Setting the maximization of the nutrient value as the primary objective ful
          obj1 = -1*gb.quicksum(gb.quicksum(W[i] * df.loc[i, key] for key in keys) for
          model.setObjectiveN(obj1, 0, 1)
          #Setting the minimization of the price as the secondary objective function
          obj2 = gb.quicksum(W[i] * df.loc[i, 'price_per_unit'] for i in df.index)
          model.setObjectiveN(obj2, 1, 0)
         model.ModelSense = gb.GRB.MINIMIZE
          for key in keys:
              if key in mini:
                  model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.index]
              if key in maxi:
                  model.addConstr(gb.quicksum(W[i] * df.loc[i, key] for i in df.index)
          #Constraint of the 1/5th (to remove any excesses of one particular ingredien
         model.addConstrs( W[i] <= (gb.quicksum(W[j] for j in df.index))/5 for i in df
          # Optimize the model
          model.optimize()
```

```
Gurobi Optimizer version 10.0.3 build v10.0.3rc0 (mac64[x86])
CPU model: Intel(R) Core(TM) i5-8257U CPU @ 1.40GHz
Thread count: 4 physical cores, 8 logical processors, using up to 8 threads
Optimize a model with 8933 rows, 8789 columns and 77977215 nonzeros
Model fingerprint: 0x6edc0741
Variable types: 8789 continuous, 0 integer (0 binary)
Coefficient statistics:
                   [1e-05, 1e+03]
  Matrix range
  Objective range [3e-05, 1e+03]
  Bounds range
                   [0e+00, 0e+00]
                  [2e-01, 3e+05]
  RHS range
Multi-objectives: starting optimization with 2 objectives ...
Multi-objectives: applying initial presolve ...
Presolve removed 20 rows and 0 columns (presolve time = 5s) ...
Presolve removed 23 rows and 0 columns (presolve time = 12s) ...
Presolve removed 23 rows and 0 columns (presolve time = 52s) ...
Presolve removed 23 rows and 0 columns (presolve time = 56s) ...
Presolve removed 23 rows and 0 columns (presolve time = 63s) ...
Presolve removed 23 rows and 0 columns
Presolved: 8910 rows and 8789 columns
Multi-objectives: optimize objective 1 () ...
Presolve removed 0 rows and 0 columns (presolve time = 5s) ...
Presolve removed 0 rows and 0 columns (presolve time = 14s) ...
Presolve removed 0 rows and 0 columns (presolve time = 37s) ...
Presolve removed 0 rows and 0 columns (presolve time = 40s) ...
Presolve removed 53 rows and 0 columns
Presolve time: 111.75s
Presolved: 8857 rows, 8842 columns, 77600180 nonzeros
Concurrent LP optimizer: dual simplex and barrier
Showing barrier log only...
Ordering time: 2.14s
Barrier statistics:
 AA' NZ : 3.922e+07
 Factor NZ : 3.923e+07 (roughly 300 MB of memory)
 Factor Ops: 2.316e+11 (roughly 100 seconds per iteration)
 Threads
Barrier performed 0 iterations in 156.77 seconds (456.65 work units)
Barrier solve interrupted - model solved by another algorithm
Solved with dual simplex
Iteration
           Objective
                           Primal Inf.
                                          Dual Inf.
                                                          Time
          -5.6391048e+04 0.000000e+00
     178
                                          0.000000e+00
                                                           166s
Solved in 178 iterations and 166.02 seconds (70.30 work units)
Optimal objective -5.639104827e+04
```

```
IterationObjectivePrimal Inf.Dual Inf.Time02.6401431e+040.000000e+003.179171e-01181s22.4927089e+040.000000e+000.000000e+00181s
```

Solved in 2 iterations and 181.18 seconds (71.08 work units) Optimal objective 2.492708924e+04

Multi-objectives: solved in 182.16 seconds (71.08 work units), solution count 2

```
In [122... # Print the optimal solution and the name of the ingredients used in tabular
         # Create a list of the ingredients used
         ingredients = []
         for i in W.keys():
             if W[i].X > 0:
                  ingredients.append(df.loc[i, "name"])
         # Create a DataFrame with the optimal solution
          solution = pd.DataFrame(columns=['Ingredient', 'Weight (g)'])
          for i in W.keys():
             if W[i].X > 0:
                  solution.loc[i, 'Ingredient'] = df.loc[i, 'name']
                  solution.loc[i, 'Weight (g)'] = W[i].X
          # Print the DataFrame
         print(solution[["Ingredient", "Weight (g)"]])
         # Print the total cost of the diet
          obj_val = gb.quicksum(W[i].X * df.loc[i, 'price_per_unit'] for i in df.index
         print(f'\nTotal cost of the diet: ${obj_val * 100/28.3495}')
          # Print the total weight of the diet
         print(f'\nTotal weight of the diet: {sum(solution["Weight (g)"])} grams')
```

	Ingredient	Weight (g)
67	Oil, soybean lecithin	7.762224
180	Amaranth leaves, raw	1.286512
256	Fish oil, cod liver	1.221551
450	Oil, wheat germ	4.36787
711	Pumpkin, without salt, canned	52.305005
1378	Soy protein isolate, potassium type	19.088659
1618	Gelatins, unsweetened, dry powder	40.387709
1761	Cereals, dry, unenriched, farina	69.155478
2057	SMART SOUP, Vietnamese Carrot Lemongrass	154.707742
2140	KASHI, unprepared, 7 Whole Grain, Pilaf	86.243194
2601	Beverages, sugar free, Energy Drink	402.474342
2775	KASHI, Frozen Entree, Chicken Pasta Pomodoro	113.972411
2828	Beverages, decaffeinated, brewed, green, tea	87684.987617
3372	Sea lion, liver (Alaska Native), Steller	42.70884
3598	Sea lion, meat with fat (Alaska Native), Steller	58.387807
4285	Bamboo shoots, without salt, drained, boiled,	460.13465
4480	Beverages, Glacial Natural spring water, ICELA	87956.50965
4583	Beverages, brewed, other than chamomile, herb,	20239.6774
4668	Beverages, DANNON, non-carbonated, bottled, water	87956.50965
4671	Candies, dietetic or low calorie (sorbitol), hard	151.289218
4744	Sweetener, herbal extract powder from Stevia leaf	596.310724
4899	Babyfood, without added fluoride., GERBER, bot	87956.50965
5617	Babyfood, organic, carrot and squash, apple, 2	58.823529
5767	Beverages, fortified with vitamin C, Apple jui	406.436241
6209	Alcoholic beverage, all (gin, rum, vodka, whis	70.528967
6272	Beverages, diet, peach, ready to drink, black	3390.102631
7403	Beverages, non-carbonated, bottled, water, DAS	61583.347213
7436	Mushrooms, raw, exposed to ultraviolet light,	161.693379
7774	Oil, woks and light frying, principal uses sal	41.822239
7839	Beverages, fortified with vitamin C, unsweeten	13.796147

Total cost of the diet: \$87927.79144622775

Total weight of the diet: 439782.5482489649 grams