

Project2

March 2, 2023

```
[1]: !pip install -r requirements.txt
```

```
Collecting pint>=0.18
  Using cached Pint-0.20.1-py3-none-any.whl (269 kB)
Requirement already satisfied: requests>=2.26.0 in
/opt/conda/lib/python3.9/site-packages (from -r requirements.txt (line 6))
(2.26.0)
Collecting python-gnupg
  Using cached python_gnupg-0.5.0-py2.py3-none-any.whl (18 kB)
Collecting eep153_tools
  Using cached eep153_tools-0.11-py2.py3-none-any.whl (4.4 kB)
Collecting fooddatacentral
  Using cached fooddatacentral-1.0.9-py3-none-any.whl
Requirement already satisfied: urllib3<1.27,>=1.21.1 in
/opt/conda/lib/python3.9/site-packages (from requests>=2.26.0->-r
requirements.txt (line 6)) (1.26.7)
Requirement already satisfied: idna<4,>=2.5 in /opt/conda/lib/python3.9/site-
packages (from requests>=2.26.0->-r requirements.txt (line 6)) (3.1)
Requirement already satisfied: charset-normalizer~=2.0.0 in
/opt/conda/lib/python3.9/site-packages (from requests>=2.26.0->-r
requirements.txt (line 6)) (2.0.0)
Requirement already satisfied: certifi>=2017.4.17 in
/opt/conda/lib/python3.9/site-packages (from requests>=2.26.0->-r
requirements.txt (line 6)) (2021.10.8)
Installing collected packages: python-gnupg, fooddatacentral, eep153_tools, pint
  Attempting uninstall: pint
    Found existing installation: Pint 0.17
    Uninstalling Pint-0.17:
      Successfully uninstalled Pint-0.17
Successfully installed eep153_tools-0.11 fooddatacentral-1.0.9 pint-0.20.1
python-gnupg-0.5.0
```

```
[2]: # API key for Gov;
apikey = "bwFohFv0W79JagEjhjfy121CHf29UEljz00Yel1N"
```

```
[3]: # read in dietary requirements (max and min)
import pandas as pd
dri_max = pd.read_csv("Dietary Requirements Max.csv").set_index('Nutrition')
```

```
dri_min = pd.read_csv("Dietary Requirements Min.csv").set_index('Nutrition')

# convert kcal to kJ
temp = dri_max.loc['Energy']
temp.iloc[1:] = temp.iloc[1:] * 4.184
dri_max.loc['Energy'] = temp

temp = dri_min.loc['Energy']
temp.iloc[1:] = temp.iloc[1:] * 4.184
dri_min.loc['Energy'] = temp
```

/opt/conda/lib/python3.9/site-packages/pandas/core/indexing.py:1965:

SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

self.obj._check_is_chained_assignment_possible()

/opt/conda/lib/python3.9/site-packages/pandas/core/indexing.py:1732:

SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

self._setitem_single_block(indexer, value, name)

```
[3]:
```

	Source	C 1-3	F 4-8	M 4-8	F 9-13	M 9-13	\
Nutrition							
Energy	---	4184.0	5020.8	5857.6	6694.4	7531.2	
Protein	RDA	13.0	19.0	19.0	34.0	34.0	
Fiber, total dietary	---	14.0	16.8	19.6	22.4	25.2	
Folate, DFE	RDA	150.0	200.0	200.0	300.0	300.0	
Calcium, Ca	RDA	700.0	1000.0	1000.0	1300.0	1300.0	
Carbohydrate, by difference	RDA	130.0	130.0	130.0	130.0	130.0	
Iron, Fe	RDA	7.0	10.0	10.0	8.0	8.0	
Magnesium, Mg	RDA	80.0	130.0	130.0	240.0	240.0	
Niacin	RDA	6.0	8.0	8.0	12.0	12.0	
Phosphorus, P	RDA	460.0	500.0	500.0	1250.0	1250.0	
Potassium, K	AI	3000.0	3800.0	3800.0	4500.0	4500.0	
Riboflavin	RDA	0.5	0.6	0.6	0.9	0.9	
Thiamin	RDA	0.5	0.6	0.6	0.9	0.9	
Vitamin A, RAE	RDA	300.0	400.0	400.0	600.0	600.0	
Vitamin B-12	RDA	0.9	1.2	1.2	1.8	1.8	
Vitamin B-6	RDA	0.5	0.6	0.6	1.0	1.0	
Vitamin C, total ascorbic acid	RDA	15.0	25.0	25.0	45.0	45.0	
Vitamin E (alpha-tocopherol)	RDA	6.0	7.0	7.0	11.0	11.0	

Vitamin K (phylloquinone)	AI	30.0	55.0	55.0	60.0	60.0
Zinc, Zn	RDA	3.0	5.0	5.0	8.0	8.0
	F 14-18	M 14-18	F 19-30	M 19-30	F 31-50	\
Nutrition						
Energy	7531.2	9204.8	8368.0	10041.6	7531.2	
Protein	46.0	52.0	46.0	56.0	46.0	
Fiber, total dietary	25.2	30.8	28.0	33.6	25.2	
Folate, DFE	400.0	400.0	400.0	400.0	400.0	
Calcium, Ca	1300.0	1300.0	1000.0	1000.0	1000.0	
Carbohydrate, by difference	130.0	130.0	130.0	130.0	130.0	
Iron, Fe	15.0	11.0	18.0	8.0	18.0	
Magnesium, Mg	360.0	410.0	310.0	400.0	320.0	
Niacin	14.0	16.0	14.0	16.0	14.0	
Phosphorus, P	1250.0	1250.0	700.0	700.0	700.0	
Potassium, K	4700.0	4700.0	4700.0	4700.0	4700.0	
Riboflavin	1.0	1.3	1.1	1.3	1.1	
Thiamin	1.0	1.2	1.1	1.2	1.1	
Vitamin A, RAE	700.0	900.0	700.0	900.0	700.0	
Vitamin B-12	2.4	2.4	2.4	2.4	2.4	
Vitamin B-6	1.2	1.3	1.3	1.3	1.3	
Vitamin C, total ascorbic acid	65.0	75.0	75.0	90.0	75.0	
Vitamin E (alpha-tocopherol)	15.0	15.0	15.0	15.0	15.0	
Vitamin K (phylloquinone)	75.0	75.0	90.0	120.0	90.0	
Zinc, Zn	9.0	11.0	8.0	11.0	8.0	
	M 31-50	F 51+	M 51+			
Nutrition						
Energy	9204.8	6694.4	8368.0			
Protein	56.0	46.0	56.0			
Fiber, total dietary	30.8	22.4	28.0			
Folate, DFE	400.0	400.0	400.0			
Calcium, Ca	1000.0	1200.0	1000.0			
Carbohydrate, by difference	130.0	130.0	130.0			
Iron, Fe	8.0	8.0	8.0			
Magnesium, Mg	420.0	320.0	420.0			
Niacin	16.0	14.0	16.0			
Phosphorus, P	700.0	700.0	700.0			
Potassium, K	4700.0	4700.0	4700.0			
Riboflavin	1.3	1.1	1.3			
Thiamin	1.2	1.1	1.2			
Vitamin A, RAE	900.0	700.0	900.0			
Vitamin B-12	2.4	2.4	2.4			
Vitamin B-6	1.3	1.5	1.7			
Vitamin C, total ascorbic acid	90.0	75.0	90.0			
Vitamin E (alpha-tocopherol)	15.0	15.0	15.0			
Vitamin K (phylloquinone)	120.0	90.0	120.0			

Zinc, Zn 11.0 8.0 11.0

```
[7]: import re
# function for age-sex specific DRI
def dri(age,sex,dietmin,dietmax):
    if age <= 3:
        index = 2

    else:
        for i, j in enumerate(list(dietmax)[3:]):
            if j[0] == sex:
                interval = re.findall(r'\d+', j)
                if len(interval) == 1:
                    if age >= int(interval[0]):
                        index = i + 3
                        break
                else:
                    if age >= int(interval[0]) and age <= int(interval[1]):
                        index = i + 3
                        break

    df = pd.DataFrame({'Nutrition': dietmin.iloc[:, 0],
                      'Max/Min': 'Minimum',
                      'Age & Sex': list(dietmin)[index],
                      'Intake': dietmin.iloc[:, index]})
    df_max = pd.DataFrame({'Nutrition': dietmax.iloc[:, 0],
                          'Max/Min': 'Maximum',
                          'Age & Sex': list(dietmax)[index],
                          'Intake': dietmax.iloc[:, index]})

    df = pd.concat([df, df_max], axis=0)

    return df
```

```
[8]: # test
dri(10, 'F', dri_min, dri_max)
```

```
[8]:
```

	Nutrition	Max/Min	Age & Sex	Intake
Nutrition				
Energy	---	Minimum	F 9-13	1600.0
Protein	RDA	Minimum	F 9-13	34.0
Fiber, total dietary	---	Minimum	F 9-13	22.4
Folate, DFE	RDA	Minimum	F 9-13	300.0
Calcium, Ca	RDA	Minimum	F 9-13	1300.0
Carbohydrate, by difference	RDA	Minimum	F 9-13	130.0
Iron, Fe	RDA	Minimum	F 9-13	8.0

Magnesium, Mg	RDA	Minimum	F 9-13	240.0
Niacin	RDA	Minimum	F 9-13	12.0
Phosphorus, P	RDA	Minimum	F 9-13	1250.0
Potassium, K	AI	Minimum	F 9-13	4500.0
Riboflavin	RDA	Minimum	F 9-13	0.9
Thiamin	RDA	Minimum	F 9-13	0.9
Vitamin A, RAE	RDA	Minimum	F 9-13	600.0
Vitamin B-12	RDA	Minimum	F 9-13	1.8
Vitamin B-6	RDA	Minimum	F 9-13	1.0
Vitamin C, total ascorbic acid	RDA	Minimum	F 9-13	45.0
Vitamin E (alpha-tocopherol)	RDA	Minimum	F 9-13	11.0
Vitamin K (phylloquinone)	AI	Minimum	F 9-13	60.0
Zinc, Zn	RDA	Minimum	F 9-13	8.0
Sodium, Na	UL	Maximum	F 9-13	2200.0
Energy	NaN	Maximum	F 9-13	11715.2

```
[90]: # get food list from five restaurants
food_list_total = pd.read_csv("FoodList.csv")
food_list_total = food_list_total.astype({"FDC": str})
food_list_total
```

```
[90]: Restaurant      Dish  Ingredients  Dish_Price  Quantity  Unit  \
0      Chipotle  Chicken burrito    chicken      8.85   132.0000  gram
1      Chipotle  Chicken burrito  white rice      8.85   120.0000  gram
2      Chipotle  Chicken burrito  black beans      8.85    60.0000  gram
3      Chipotle  Chicken burrito    lettuce      8.85    60.0000  gram
4      Chipotle  Chicken burrito     salsa      8.85    40.0000  gram
..      ...
364     Poke Bar  Wazzup Poke Bowl    cucumber     15.95    28.3500  gram
365     Poke Bar  Wazzup Poke Bowl  green onion     15.95     7.0875  gram
366     Poke Bar  Wazzup Poke Bowl     ponzu      15.95    35.4375  gram
367     Poke Bar  Wazzup Poke Bowl     wasabi     15.95   452.1825  gram
368     Poke Bar  Wazzup Poke Bowl      mayo      15.95    35.4375  gram
```

	FDC	Calorie/100g	Ingredient_Price/100 gm
0	331960	237.0	1.320
1	790214	359.0	0.274
2	747444	180.0	0.440
3	2346389	21.0	1.110
4	746777	34.0	0.590
..
364	168409	15.0	0.880
365	170006	27.0	0.440
366	2451144	33.0	1.900
367	171831	292.0	8.780
368	171002	334.0	0.560

[369 rows x 9 columns]

```
[92]: # split food_list by restaurant
grouped = food_list_total.groupby(food_list_total.Restaurant)
restaurants = ['Chipotle', 'Thai Basil', 'Ttoust', 'IB', 'Poke Bar']

food_list_res = []

for r in restaurants:
    food_list_res.append(grouped.get_group(r))
```

```
[70]: import fooddatacentral as fdc
import warnings
from collections import defaultdict

# get nutritional information for ingredients
ing_res = []
for i in range(5):
    L = []
    D = {}
    items = []
    count = 0
    food_list = food_list_res[i]
    for food in food_list.Ingredients.tolist():
        try:
            FDC = food_list.iloc[count,:].FDC
            count+=1
            temp = fdc.nutrients(apikey,FDC)
            key = temp.Units
            # convert units if necessary
            if 'Energy' in key.index:
                if key['Energy'] != 'kJ':
                    temp.Quantity['Energy'] = temp.Quantity['Energy']*4.184

            L.append(temp.Quantity)
            D[food] = temp.Quantity
            items.append(food)
        except AttributeError:
            warnings.warn("Couldn't find FDC Code %s for food %s." % (food,FDC))

FoodNutrients_Ing = pd.DataFrame(L,dtype=float)
FoodNutrients_Ing.index = items
FoodNutrients_Ing = FoodNutrients_Ing.fillna(0)
FoodNutrients_Ing = FoodNutrients_Ing.transpose()

#FoodNutrients_Ing
```

```
FoodNutrients_Ing_d = pd.DataFrame(D,dtype=float)
FoodNutrients_Ing_d = FoodNutrients_Ing_d.fillna(0)
ing_res.append(FoodNutrients_Ing_d)
```

/tmp/ipykernel_29/329324121.py:22: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
temp.Quantity['Energy'] = temp.Quantity['Energy']*4.184

[75]: ing_res[4]

```
[75]:
```

	salmon	white rice	sweet onion	green onion	\
Alanine	1.271	0.332	0.017	0.00	
Alcohol, ethyl	0.000	0.000	0.000	0.00	
Amino acids	0.000	0.000	0.000	0.00	
Arginine	1.221	0.516	0.111	0.00	
Ash	1.130	0.610	0.340	0.51	
...	
Vitamin K (Menaquinone-4)	0.000	0.000	0.000	0.00	
Vitamin K (phylloquinone)	0.500	0.000	0.300	156.30	
Vitamins and Other Components	0.000	0.000	0.000	0.00	
Water	64.890	11.890	91.240	92.32	
Zinc, Zn	0.360	0.800	0.130	0.20	

	kale	shoyu	spicy mayo	ahi tuna	cucumber	\
Alanine	0.147	0.0	0.0	1.331	0.024	
Alcohol, ethyl	0.000	0.0	0.0	0.000	0.000	
Amino acids	0.000	0.0	0.0	0.000	0.000	
Arginine	0.163	0.0	0.0	1.316	0.044	
Ash	1.540	0.0	0.0	1.300	0.380	
...	
Vitamin K (Menaquinone-4)	0.000	0.0	0.0	0.000	0.000	
Vitamin K (phylloquinone)	389.600	0.0	0.0	0.000	16.400	
Vitamins and Other Components	0.000	0.0	0.0	0.000	0.000	
Water	89.630	0.0	0.0	70.580	95.230	
Zinc, Zn	0.390	0.0	0.0	0.820	0.200	

	sweet chili	house dressing	edamame	ponzu	\
Alanine	0.0	0.0	0.00	0.0	
Alcohol, ethyl	0.0	0.0	0.00	0.0	
Amino acids	0.0	0.0	0.00	0.0	
Arginine	0.0	0.0	0.00	0.0	
Ash	0.0	0.0	0.00	0.0	
...	
Vitamin K (Menaquinone-4)	0.0	0.0	0.00	0.0	

Vitamin K (phylloquinone)	0.0	0.0	28.10	0.0
Vitamins and Other Components	0.0	0.0	0.00	0.0
Water	0.0	0.0	70.80	0.0
Zinc, Zn	0.0	0.0	1.33	0.0

	tofu	wasabi	mayo
Alanine	0.00	0.00	0.0
Alcohol, ethyl	0.00	0.00	0.0
Amino acids	0.00	0.00	0.0
Arginine	0.00	0.00	0.0
Ash	1.05	9.04	2.1
...
Vitamin K (Menaquinone-4)	0.00	0.00	0.0
Vitamin K (phylloquinone)	0.00	3.50	155.1
Vitamins and Other Components	0.00	0.00	0.0
Water	82.87	31.70	55.4
Zinc, Zn	0.00	0.61	0.0

[144 rows x 16 columns]

```
[7]: # construct table of nutritional information for dishes

dishes = food_list.groupby('Dish', sort=False)['Ingredients'].count()

FoodNutrients = pd.DataFrame(columns=dishes.keys().tolist(),
                              index=FoodNutrients_Ing.index, )

start = 0
end = 0
for i, column in enumerate(FoodNutrients):

    FoodNutrients[column] = FoodNutrients_Ing.iloc[:, start:start+dishes[i]].
    ↪sum(axis=1)
    start = start+dishes[i]
FoodNutrients
```

```
[7]:
```

	Chicken burrito	steak burrito	\
Proximates	0.000000e+00	0.000000e+00	
Water	3.795900e+02	3.856900e+02	
Energy	7.384437e+16	7.384437e+16	
Nitrogen	6.626300e+00	1.496300e+00	
Protein	9.385688e+01	8.445687e+01	
...	
Delta-5-avenasterol	0.000000e+00	0.000000e+00	
Delta-7-Stigmastenol	0.000000e+00	0.000000e+00	
Ergothioneine	0.000000e+00	0.000000e+00	
MUFA 18:1-11 t (18:1t n-7)	0.000000e+00	0.000000e+00	
Sugars, added	0.000000e+00	0.000000e+00	

	barbacoa burrito	carnitas burrito \
Proximates	0.000000e+00	0.000000e+00
Water	3.707900e+02	4.275900e+02
Energy	7.384437e+16	7.387602e+16
Nitrogen	1.496300e+00	1.496300e+00
Protein	8.765687e+01	9.775688e+01
...
Delta-5-avenasterol	0.000000e+00	0.000000e+00
Delta-7-Stigmastenol	0.000000e+00	0.000000e+00
Ergothioneine	0.000000e+00	0.000000e+00
MUFA 18:1-11 t (18:1t n-7)	0.000000e+00	0.000000e+00
Sugars, added	0.000000e+00	0.000000e+00

	sofritas burrito	veggie burrito \
Proximates	0.000000e+00	0.000000e+00
Water	3.736900e+02	4.466900e+02
Energy	7.387602e+16	7.387602e+16
Nitrogen	1.496300e+00	1.496300e+00
Protein	7.315687e+01	7.510688e+01
...
Delta-5-avenasterol	0.000000e+00	0.000000e+00
Delta-7-Stigmastenol	0.000000e+00	0.000000e+00
Ergothioneine	0.000000e+00	0.000000e+00
MUFA 18:1-11 t (18:1t n-7)	0.000000e+00	0.000000e+00
Sugars, added	0.000000e+00	0.000000e+00

	chicken quesadilla	steak qusadilla \
Proximates	0.000000e+00	0.000000e+00
Water	4.593900e+02	4.654900e+02
Energy	7.387602e+16	7.387602e+16
Nitrogen	5.516300e+00	3.863000e-01
Protein	1.065169e+02	9.711687e+01
...
Delta-5-avenasterol	0.000000e+00	0.000000e+00
Delta-7-Stigmastenol	0.000000e+00	0.000000e+00
Ergothioneine	0.000000e+00	0.000000e+00
MUFA 18:1-11 t (18:1t n-7)	0.000000e+00	0.000000e+00
Sugars, added	0.000000e+00	0.000000e+00

	barbacoa quesadilla	carnita quesadilla ... \
Proximates	0.000000e+00	0.000000e+00 ...
Water	4.505900e+02	3.885900e+02 ...
Energy	7.387602e+16	7.384437e+16 ...
Nitrogen	3.863000e-01	3.863000e-01 ...
Protein	1.003169e+02	8.761687e+01 ...
...

Delta-5-avenasterol	0.000000e+00	0.000000e+00	...
Delta-7-Stigmastenol	0.000000e+00	0.000000e+00	...
Ergothioneine	0.000000e+00	0.000000e+00	...
MUFA 18:1-11 t (18:1t n-7)	0.000000e+00	0.000000e+00	...
Sugars, added	0.000000e+00	0.000000e+00	...

	Veggie Combo	IB's Original(chicken)	\
Proximates	0.000000	0.000000	
Water	599.720000	497.990000	
Energy	129317.731131	129265.731131	
Nitrogen	0.080000	5.130000	
Protein	50.160000	79.820000	
...	
Delta-5-avenasterol	0.000000	0.000000	
Delta-7-Stigmastenol	0.000000	0.000000	
Ergothioneine	0.000000	0.000000	
MUFA 18:1-11 t (18:1t n-7)	0.000000	0.000000	
Sugars, added	0.000000	0.000000	

	IB's Original(beef)	IB's Original(lamb)	\
Proximates	0.000000	0.000000	
Water	506.390000	492.160000	
Energy	129082.731131	129750.731131	
Nitrogen	0.000000	0.000000	
Protein	71.120000	64.280000	
...	
Delta-5-avenasterol	0.000000	0.000000	
Delta-7-Stigmastenol	0.000000	0.000000	
Ergothioneine	0.000000	0.000000	
MUFA 18:1-11 t (18:1t n-7)	0.000000	0.000000	
Sugars, added	0.000000	0.000000	

	Original Salmon Poke Bowl	Firecracker Poke Bowl	\
Proximates	0.000000	0.000000	
Water	349.970000	349.370000	
Energy	14278.841536	50999.296902	
Nitrogen	0.000000	0.000000	
Protein	42.170000	30.610000	
...	
Delta-5-avenasterol	0.000000	0.000000	
Delta-7-Stigmastenol	0.000000	0.000000	
Ergothioneine	0.000000	0.000000	
MUFA 18:1-11 t (18:1t n-7)	0.000000	0.000000	
Sugars, added	0.000000	13.300000	

	Sunset House Poke Bowl	The O.G. Poke Bowl	\
Proximates	0.000000	0.000000	

Water	424.540000	336.83000
Energy	42197.319302	44274.83239
Nitrogen	0.000000	0.00000
Protein	56.240000	44.55000
...
Delta-5-avenasterol	0.000000	0.00000
Delta-7-Stigmastenol	0.000000	0.00000
Ergothioneine	0.000000	0.00000
MUFA 18:1-11 t (18:1t n-7)	0.000000	0.00000
Sugars, added	13.300000	13.30000

	Goodie Mob Poke Bowl	Wazzup Poke Bowl
Proximates	0.000000	0.000000
Water	444.350000	448.360000
Energy	5629.147776	5466.693248
Nitrogen	0.000000	0.000000
Protein	41.900000	33.200000
...
Delta-5-avenasterol	0.000000	0.000000
Delta-7-Stigmastenol	0.000000	0.000000
Ergothioneine	0.000000	0.000000
MUFA 18:1-11 t (18:1t n-7)	0.000000	0.000000
Sugars, added	0.000000	0.000000

[213 rows x 46 columns]

```
[8]: # Convert food quantities to FDC units
food_list['FDC Quantity'] = food_list[['Quantity', 'Unit']].T.apply(lambda x :
    ↪fdc.units(x['Quantity'],x['Unit']))

# Now may want to filter df by time or place--need to get a unique set of food
↪names.
food_list['FDC Price'] = food_list['Dish_Price']/food_list.
    ↪groupby('Dish',sort=False)['FDC Quantity'].sum()

food_list.dropna(how='any') # Drop food with any missing data

# To use minimum price observed
Dish_Prices = food_list.groupby('Dish',sort=False)['Dish_Price'].min()/
    ↪food_list.groupby('Dish',sort=False)['FDC Quantity'].sum()
```

```
/opt/conda/lib/python3.9/site-packages/pandas/core/dtypes/cast.py:1990:
UnitStrippedWarning: The unit of the quantity is stripped when downcasting to
ndarray.
    result[:] = values
```

```
[9]: Dish_Prices
```

[9]: Dish

Chicken burrito	1.644981412639405 / hectogram
steak burrito	1.9702602230483268 / hectogram
barbacoa burrito	1.9702602230483268 / hectogram
carnitas burrito	1.765799256505576 / hectogram
sofritas burrito	2.179802955665025 / hectogram
veggie burrito	0.4925650557620817 / hectogram
chicken quesadilla	1.7472118959107805 / hectogram
steak quesadilla	2.0724907063197024 / hectogram
barbacoa quesadilla	2.0724907063197024 / hectogram
carnita quesadilla	1.7472118959107805 / hectogram
sofritas quesadilla	2.3152709359605916 / hectogram
chicken salad	1.644981412639405 / hectogram
steak salad	1.9702602230483268 / hectogram
barbacoa salad	1.9702602230483268 / hectogram
carnitas salad	1.765799256505576 / hectogram
sofritas salad	2.179802955665025 / hectogram
veggie salad	1.5102389078498295 / hectogram
chicken taco	1.682509505703422 / hectogram
steak taco	1.4763231197771587 / hectogram
barbacoa taco	1.715210355987055 / hectogram
carnitas taco	1.5372168284789645 / hectogram
sofritas taco	1.8209876543209877 / hectogram
kid's meal quesadilla	0.8544303797468354 / hectogram
Pineapple Fried Rice	2.326666666666666 / hectogram
Basil Eggplant Chicken	1.9074074074074074 / hectogram
Pad Kee Mow Chicken	2.653225806451613 / hectogram
Pad Thai Chicken & Prawns	1.852497096399535 / hectogram
Combo Garlic Pepper	1.8911335578002246 / hectogram
Spicy Basil Catfish	1.8994708994708995 / hectogram
Bibim Bop	3.3369330453563713 / hectogram
Kimchi Soup	1.6732283464566928 / hectogram
Gaibi Short Rib	2.6473509933774837 / hectogram
Spicy Rice Cake	1.6846543001686343 / hectogram
BBQ Chicken	1.3934426229508197 / hectogram
Cheeseburger	2.472527472527472 / hectogram
Avogobble sandwich	3.1055900621118013 / hectogram
Veggie Combo	3.535353535353536 / hectogram
IB's Original(chicken)	2.2569444444444446 / hectogram
IB's Original(beef)	2.2569444444444446 / hectogram
IB's Original(lamb)	2.2569444444444446 / hectogram
Original Salmon Poke Bowl	3.2149155958679763 / hectogram
Firecracker Poke Bowl	6.082272748939414 / hectogram
Sunset House Poke Bowl	2.6790963298899806 / hectogram
The O.G. Poke Bowl	1.7337757450751807 / hectogram
Goodie Mob Poke Bowl	1.7472367368847699 / hectogram
Wazzup Poke Bowl	1.6819438842358623 / hectogram

dtype: object

```
[76]: # Convert food quantities to FDC units
ing_prices = []
for r in food_list_res:
    food_list = r
    food_list['FDC Quantity'] = food_list[['Quantity', 'Unit']].T.apply(lambda x:
    ↪ fdcc.units(x['Quantity'], x['Unit']))

    # Now may want to filter df by time or place--need to get a unique set of
    ↪ food names.
    food_list['FDC Price'] = food_list['Ingredient_Price/100 gm']

    food_list.dropna(how='any') # Drop food with any missing data

    # To use minimum price observed
    Ingredient_Prices = food_list.groupby('Ingredients', sort=False)['FDC
    ↪ Price'].min()
    ing_prices.append(Ingredient_Prices)
```

/opt/conda/lib/python3.9/site-packages/pandas/core/dtypes/cast.py:1990:
UnitStrippedWarning: The unit of the quantity is stripped when downcasting to
ndarray.

```
result[:] = values
/tmp/ipykernel_29/2842241641.py:5: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
food_list['FDC Quantity'] = food_list[['Quantity', 'Unit']].T.apply(lambda x :
fdcc.units(x['Quantity'], x['Unit']))
/tmp/ipykernel_29/2842241641.py:8: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
food_list['FDC Price'] = food_list['Ingredient_Price/100 gm']
```

```
[81]: ing_prices[4]
```

```
[81]: Ingredients
salmon          2.20
white rice      0.28
sweet onion     0.44
green onion     0.44
```

kale	0.88
shoyu	1.69
spicy mayo	1.38
ahi tuna	2.36
cucumber	0.88
sweet chili	1.05
house dressing	3.17
edamame	0.56
ponzu	1.90
tofu	0.74
wasabi	8.78
mayo	0.56

Name: FDC Price, dtype: float64

```
[86]: from scipy.optimize import linprog as lp
import numpy as np
import warnings

def
    solve_subsistence_problem(FoodNutrients, Prices, dietmin, dietmax, max_weight=None, tol=1e-6):
    """Solve Stigler's Subsistence Cost Problem.

    Inputs:
        - FoodNutrients : A pd.DataFrame with rows corresponding to foods,
        columns to nutrients.
        - Prices : A pd.Series of prices for different foods
        - diet_min : A pd.Series of DRIs, with index corresponding to columns of
        FoodNutrients,
            describing minimum intakes.
        - diet_max : A pd.Series of DRIs, with index corresponding to columns of
        FoodNutrients,
            describing maximum intakes.
        - max_weight : Maximum weight (in hectograms) allowed for diet.
        - tol : Solution values smaller than this in absolute value treated as
        zeros.

    """
    try:
        p = Prices.apply(lambda x:x.magnitude)
    except AttributeError: # Maybe not passing in prices with units?
        warnings.warn("Prices have no units. BE CAREFUL! We're assuming
        prices are per hectogram or deciliter!")
        p = Prices

    p = p.dropna()
```

```

# Compile list that we have both prices and nutritional info for; drop if
↪either missing
use = p.index.intersection(FoodNutrients.columns)
p = p[use]

# Drop nutritional information for foods we don't know the price of,
# and replace missing nutrients with zeros.
Aall = FoodNutrients[p.index].fillna(0)
#print(Aall)
# Drop rows of A that we don't have constraints for.
Amin = Aall.loc[Aall.index.intersection(dietmin.index)]
#print(dietmin)
#print(Amin)
Amin = Amin.reindex(dietmin.index,axis=0)
#print(dietmin.index)
#print(Amin)
idx = Amin.index.to_frame()
#print(Amin)
idx['type'] = 'min'
#print(Amin)
#Amin.index = pd.MultiIndex.from_frame(idx)
#dietmin.index = Amin.index

Amax = Aall.loc[Aall.index.intersection(dietmax.index)]
Amax = Amax.reindex(dietmax.index,axis=0)
idx = Amax.index.to_frame()
idx['type'] = 'max'
#Amax.index = pd.MultiIndex.from_frame(idx)
#dietmax.index = Amax.index

# Minimum requirements involve multiplying constraint by -1 to make <=.
A = pd.concat([Amin,
               -Amax])

b = pd.concat([dietmin,
               -dietmax]) # Note sign change for max constraints

# Make sure order of p, A, b are consistent
A = A.reindex(p.index,axis=1)
A = A.reindex(b.index,axis=0)

if max_weight is not None:
    # Add up weights of foods consumed
    A.loc['Hectograms'] = -1

```

```

    b.loc['Hectograms'] = -max_weight
    #print(p)
    #print(A)
    #print(b)
    # Now solve problem! (Note that the linear program solver we'll use assumes
    # "less-than-or-equal" constraints. We can switch back and forth by
    # multiplying $A$ and $b$ by $-1$.)

    result = lp(p, -A, -b, method='interior-point', options={'presolve': True,
                                                            'cholesky': False,
                                                            'sym_pos': False,
                                                            'lstsq': True})

    result.A = A
    result.b = b

    if result.success:
        result.diet = pd.Series(result.x, index=p.index)
    else: # No feasible solution?
        warnings.warn(result.message)
        result.diet = pd.Series(result.x, index=p.index)*np.nan

    return result

```

```

[99]: # dish-based result
group = 'M 31-50'
tol = 1e-6
#FoodNutrients_t = FoodNutrients.iloc[0:10,]
#print(FoodNutrients_t)
result = □
    ↪ solve_subsistence_problem(FoodNutrients, Dish_Prices, dri_min[group], dri_max[group], tol=tol)

print("Cost of diet for %s is $%4.2f per day.\n" % (group, result.fun))

# Put back into nice series
diet = result.diet

print("\nDiet (in 100s of grams or milliliters):")
print(diet[diet >= tol]) # Drop items with quantities less than precision of □
    ↪ calculation.
print()

tab = pd.DataFrame({"Outcome": np.abs(result.A).dot(diet), "Recommendation": np.
    ↪ abs(result.b)})
print("\nWith the following nutritional outcomes of interest:")
print(tab)
print()

```



```
print("\nConstraining nutrients are:")
excess = tab.diff(axis=1).iloc[:,1]
print(excess.loc[np.abs(excess) < tol*100].index.tolist())
```

Cost of diet for M 31-50 is \$6.75 per day.

Diet (in 100s of grams or milliliters):

```
Basil Eggplant Chicken      1.631341
Pad Thai Chicken & Prawns   1.817563
Cheeseburger                 0.108056
dtype: float64
```

With the following nutritional outcomes of interest:

	Outcome	Recommendation
Nutrition		
Energy	12970.399698	9204.8
Protein	215.554768	56.0
Fiber, total dietary	34.452112	30.8
Folate, DFE	728.109424	400.0
Calcium, Ca	1187.572224	1000.0
Carbohydrate, by difference	269.608350	130.0
Iron, Fe	23.351720	8.0
Magnesium, Mg	714.713210	420.0
Niacin	45.940157	16.0
Phosphorus, P	2394.471782	700.0
Potassium, K	5358.507778	4700.0
Riboflavin	2.308153	1.3
Thiamin	2.641435	1.2
Vitamin A, RAE	899.999776	900.0
Vitamin B-12	3.055109	2.4
Vitamin B-6	2.978857	1.3
Vitamin C, total ascorbic acid	478.494956	90.0
Vitamin E (alpha-tocopherol)	15.000003	15.0
Vitamin K (phylloquinone)	709.607968	120.0
Zinc, Zn	24.585825	11.0
Sodium, Na	1215.458895	2300.0
Energy	12970.399698	12970.4

Constraining nutrients are:

```
['Vitamin E (alpha-tocopherol)']
```

/tmp/ipykernel_30/3506648488.py:80: OptimizeWarning: Solving system with option 'cholesky':True failed. It is normal for this to happen occasionally, especially as the solution is approached. However, if you see this frequently, consider

setting option 'cholesky' to False.

```
result = lp(p, -A, -b, method='interior-point')
/tmp/ipykernel_30/3506648488.py:80: OptimizeWarning: Solving system with option
'sym_pos':True failed. It is normal for this to happen occasionally, especially
as the solution is approached. However, if you see this frequently, consider
setting option 'sym_pos' to False.
```

```
result = lp(p, -A, -b, method='interior-point')
/tmp/ipykernel_30/3506648488.py:80: OptimizeWarning: Solving system with option
'sym_pos':False failed. This may happen occasionally, especially as the solution
is approached. However, if you see this frequently, your problem may be
numerically challenging. If you cannot improve the formulation, consider setting
'lstsq' to True. Consider also setting `presolve` to True, if it is not already.
```

```
result = lp(p, -A, -b, method='interior-point')
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=3.32494e-64): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=4.34568e-55): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=4.06036e-54): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=4.55428e-23): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=1.44453e-23): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=4.87971e-24): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=1.95512e-23): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
/opt/conda/lib/python3.9/site-packages/scipy/optimize/_linprog_ip.py:117:
LinAlgWarning: Ill-conditioned matrix (rcond=1.14032e-22): result may not be
accurate.
```

```
return sp.linalg.solve(M, r, sym_pos=sym_pos)
```

```
[88]: # ingredient-based results
group = 'M 19-30'
tol = 1e-6
#FoodNutrients_t = FoodNutrients.iloc[0:10,]
#print(FoodNutrients_t)
results = []
for i in range(5):
    result =
    ↪solve_subsistence_problem(ing_res[i],ing_prices[i],dri_min[group],dri_max[group],tol=tol)

    print("Result for restaurant: " + restaurants[i])
    print("Cost of diet for %s is $%4.2f per day.\n" % (group,result.fun))

    # Put back into nice series
    diet = result.diet

    print("\nDiet (in 100s of grams or milliliters):")
    print(diet[diet >= tol]) # Drop items with quantities less than precision
    ↪of calculation.
    print()

    tab = pd.DataFrame({"Outcome":np.abs(result.A).dot(diet),"Recommendation":
    ↪np.abs(result.b)})
    print("\nWith the following nutritional outcomes of interest:")
    print(tab)
    print()

    print("\nConstraining nutrients are:")
    excess = tab.diff(axis=1).iloc[:,1]
    print(excess.loc[np.abs(excess) < tol*100].index.tolist())
```

Result for restaurant: Chipotle
Cost of diet for M 19-30 is \$0.00 per day.

Diet (in 100s of grams or milliliters):
Series([], dtype: float64)

With the following nutritional outcomes of interest:

	Outcome	Recommendation
--	---------	----------------

Nutrition		
Energy	NaN	10041.6
Protein	NaN	56.0
Fiber, total dietary	NaN	33.6
Folate, DFE	NaN	400.0
Calcium, Ca	NaN	1000.0

Carbohydrate, by difference	NaN	130.0
Iron, Fe	NaN	8.0
Magnesium, Mg	NaN	400.0
Niacin	NaN	16.0
Phosphorus, P	NaN	700.0
Potassium, K	NaN	4700.0
Riboflavin	NaN	1.3
Thiamin	NaN	1.2
Vitamin A, RAE	NaN	900.0
Vitamin B-12	NaN	2.4
Vitamin B-6	NaN	1.3
Vitamin C, total ascorbic acid	NaN	90.0
Vitamin E (alpha-tocopherol)	NaN	15.0
Vitamin K (phylloquinone)	NaN	120.0
Zinc, Zn	NaN	11.0
Sodium, Na	NaN	2300.0
Energy	NaN	12970.4

Constraining nutrients are:

[]

Result for restaurant: Thai Basil

Cost of diet for M 19-30 is \$6.69 per day.

Diet (in 100s of grams or milliliters):

egg	4.947712
carrots	3.846580
rice	0.179987
broccoli	1.176471
peanuts	3.770187
tofu	1.708200

dtype: float64

With the following nutritional outcomes of interest:

	Outcome	Recommendation
Nutrition		
Energy	12970.399989	10041.6
Protein	182.869415	56.0
Fiber, total dietary	48.402655	33.6
Folate, DFE	901.074617	400.0
Calcium, Ca	1000.000000	1000.0
Carbohydrate, by difference	130.000000	130.0
Iron, Fe	22.193402	8.0
Magnesium, Mg	777.823342	400.0
Niacin	53.041100	16.0
Phosphorus, P	2591.924648	700.0

Potassium, K	4700.000234	4700.0
Riboflavin	3.066529	1.3
Thiamin	3.199720	1.2
Vitamin A, RAE	900.000000	900.0
Vitamin B-12	5.046667	2.4
Vitamin B-6	2.410318	1.3
Vitamin C, total ascorbic acid	109.290786	90.0
Vitamin E (alpha-tocopherol)	24.908895	15.0
Vitamin K (phylloquinone)	120.000000	120.0
Zinc, Zn	24.454724	11.0
Sodium, Na	1108.886424	2300.0
Energy	12970.399989	12970.4

Constraining nutrients are:

['Calcium, Ca', 'Carbohydrate, by difference', 'Vitamin A, RAE', 'Vitamin K (phylloquinone)', 'Energy']

Result for restaurant: Ttoust

Cost of diet for M 19-30 is \$0.00 per day.

Diet (in 100s of grams or milliliters):

Series([], dtype: float64)

With the following nutritional outcomes of interest:

	Outcome	Recommendation
Nutrition		
Energy	NaN	10041.6
Protein	NaN	56.0
Fiber, total dietary	NaN	33.6
Folate, DFE	NaN	400.0
Calcium, Ca	NaN	1000.0
Carbohydrate, by difference	NaN	130.0
Iron, Fe	NaN	8.0
Magnesium, Mg	NaN	400.0
Niacin	NaN	16.0
Phosphorus, P	NaN	700.0
Potassium, K	NaN	4700.0
Riboflavin	NaN	1.3
Thiamin	NaN	1.2
Vitamin A, RAE	NaN	900.0
Vitamin B-12	NaN	2.4
Vitamin B-6	NaN	1.3
Vitamin C, total ascorbic acid	NaN	90.0
Vitamin E (alpha-tocopherol)	NaN	15.0
Vitamin K (phylloquinone)	NaN	120.0
Zinc, Zn	NaN	11.0

Sodium, Na	NaN	2300.0
Energy	NaN	12970.4

Constraining nutrients are:

[]

Result for restaurant: IB

Cost of diet for M 19-30 is \$0.00 per day.

Diet (in 100s of grams or milliliters):

Series([], dtype: float64)

With the following nutritional outcomes of interest:

	Outcome	Recommendation
Nutrition		
Energy	NaN	10041.6
Protein	NaN	56.0
Fiber, total dietary	NaN	33.6
Folate, DFE	NaN	400.0
Calcium, Ca	NaN	1000.0
Carbohydrate, by difference	NaN	130.0
Iron, Fe	NaN	8.0
Magnesium, Mg	NaN	400.0
Niacin	NaN	16.0
Phosphorus, P	NaN	700.0
Potassium, K	NaN	4700.0
Riboflavin	NaN	1.3
Thiamin	NaN	1.2
Vitamin A, RAE	NaN	900.0
Vitamin B-12	NaN	2.4
Vitamin B-6	NaN	1.3
Vitamin C, total ascorbic acid	NaN	90.0
Vitamin E (alpha-tocopherol)	NaN	15.0
Vitamin K (phylloquinone)	NaN	120.0
Zinc, Zn	NaN	11.0
Sodium, Na	NaN	2300.0
Energy	NaN	12970.4

Constraining nutrients are:

[]

Result for restaurant: Poke Bar

Cost of diet for M 19-30 is \$17.20 per day.

Diet (in 100s of grams or milliliters):

```
salmon      1.437845
white rice  6.306049
kale        13.942400
dtype: float64
```

With the following nutritional outcomes of interest:

	Outcome	Recommendation
Nutrition		
Energy	12970.400170	10041.6
Protein	107.593601	56.0
Fiber, total dietary	72.298361	33.6
Folate, DFE	927.037001	400.0
Calcium, Ca	3617.370820	1000.0
Carbohydrate, by difference	566.929153	130.0
Iron, Fe	25.003825	8.0
Magnesium, Mg	719.632765	400.0
Niacin	45.253694	16.0
Phosphorus, P	1729.907707	700.0
Potassium, K	5853.152909	4700.0
Riboflavin	5.193306	1.3
Thiamin	2.743360	1.2
Vitamin A, RAE	3443.513531	900.0
Vitamin B-12	4.644240	2.4
Vitamin B-6	5.713440	1.3
Vitamin C, total ascorbic acid	1307.827800	90.0
Vitamin E (alpha-tocopherol)	15.000000	15.0
Vitamin K (phylloquinone)	5432.678145	120.0
Zinc, Zn	11.000000	11.0
Sodium, Na	823.780089	2300.0
Energy	12970.400170	12970.4

Constraining nutrients are:

```
['Vitamin E (alpha-tocopherol)', 'Zinc, Zn']
```

```
/tmp/ipykernel_29/2046845037.py:22: UserWarning: Prices have no units.  BE CAREFUL!  We're assuming prices are per hectogram or deciliter!
```

```
warnings.warn("Prices have no units.  BE CAREFUL!  We're assuming prices are per hectogram or deciliter!")
```

```
/tmp/ipykernel_29/2046845037.py:91: UserWarning: The solution does not satisfy the constraints within the required tolerance of 3.16E-04, yet no errors were raised and there is no certificate of infeasibility or unboundedness. Check whether the slack and constraint residuals are acceptable; if not, consider enabling presolve, adjusting the tolerance option(s), and/or using a different method. Please consider submitting a bug report.
```

```
warnings.warn(result.message)
```

```
/tmp/ipykernel_29/2046845037.py:22: UserWarning: Prices have no units.  BE
```

```

CAREFUL! We're assuming prices are per hectogram or deciliter!
warnings.warn("Prices have no units. BE CAREFUL! We're assuming prices are
per hectogram or deciliter!")
/tmp/ipykernel_29/2046845037.py:22: UserWarning: Prices have no units. BE
CAREFUL! We're assuming prices are per hectogram or deciliter!
warnings.warn("Prices have no units. BE CAREFUL! We're assuming prices are
per hectogram or deciliter!")
/tmp/ipykernel_29/2046845037.py:91: UserWarning: The solution does not satisfy
the constraints within the required tolerance of 3.16E-04, yet no errors were
raised and there is no certificate of infeasibility or unboundedness. Check
whether the slack and constraint residuals are acceptable; if not, consider
enabling presolve, adjusting the tolerance option(s), and/or using a different
method. Please consider submitting a bug report.
warnings.warn(result.message)
/tmp/ipykernel_29/2046845037.py:22: UserWarning: Prices have no units. BE
CAREFUL! We're assuming prices are per hectogram or deciliter!
warnings.warn("Prices have no units. BE CAREFUL! We're assuming prices are
per hectogram or deciliter!")
/tmp/ipykernel_29/2046845037.py:91: UserWarning: The solution does not satisfy
the constraints within the required tolerance of 3.16E-04, yet no errors were
raised and there is no certificate of infeasibility or unboundedness. Check
whether the slack and constraint residuals are acceptable; if not, consider
enabling presolve, adjusting the tolerance option(s), and/or using a different
method. Please consider submitting a bug report.
warnings.warn(result.message)
/tmp/ipykernel_29/2046845037.py:22: UserWarning: Prices have no units. BE
CAREFUL! We're assuming prices are per hectogram or deciliter!
warnings.warn("Prices have no units. BE CAREFUL! We're assuming prices are
per hectogram or deciliter!")

```

[]: