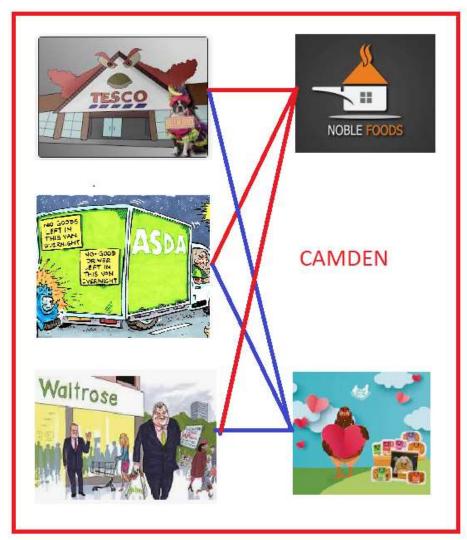
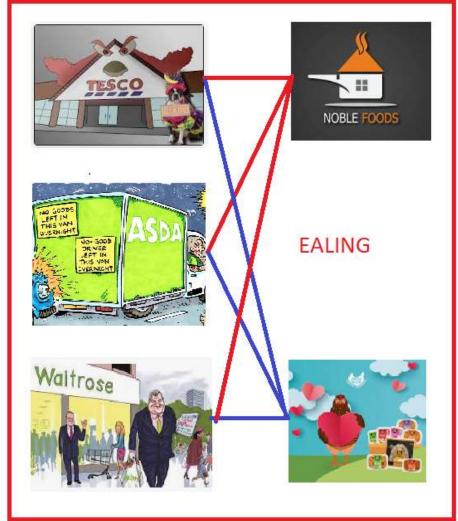
Author: Alex Dolia, Company: Deep Intellect, Date: 5/06/2022

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In []: ▶ import pandas as pd import numpy as np





Problem statement:

We gave three supermarket brands (for example, Lidl, Tesco and Asda) we denote them Shop 1, Shop 2 and Shop 3. They have branches in Camden, Ealing, Greenwich, Hounslow, Richmond upon Thames, Hammersmith and Fulham, Kensington and Chelsea and City of Westminster. They use two suppliers that have branches in the same London Boroughs, we have historical probability of item being in the given supplier branch of London Borough. We know how many items each supplier can deliver per days.

We are given total number of items demanded by every supermarket brand and information about when (date) and where (London Borough) the given supermarket can accept part of this total demand but exact value is not provided. The supplier can deliver items to supermarkets from the same Borough only. We have weights or probability that total supply for the given location is going to a particular supermarket. The task is to find date, location and number of items should be delivered to all three supermarkets.

```
# the following dhontAD code based on the link above
          def dhontAD(nSeats, votes):
              nSeats is the number of seats
              votes is an aaray of probabilities
              t votes = votes.copy()
              seats = np.zeros(len(votes))
              if sum(votes) > 0:
                while sum(seats) < nSeats:</pre>
                     next seat = np.argmax(t votes)
                     seats[next_seat] += 1
                     t votes[next seat] = votes[next seat] / (seats[next seat] + 1)
              return seats
          nSeats = 100 # we want to allocate 100 seats
          votes = np.array([0.2, 0.3, 0.5])
          dhontAD(nSeats, votes)
```

$$\max_{x} \sum_{d} \sum_{b} w_{1} \times x_{db1} + w_{2} \times x_{db2} + \dots + w_{N} \times x_{dbN}$$
s.t. $x \in X$

we have one weight per supermarket; d is the date and b is the London borough or location; x is the number of items given date, London Borough and supermarket; X is the feasable set for x. Supply and Demand has to be from the same London Borough.

Demand Weights could be weight of the objective function that are used in linear programming.

De	mand We	ight
Shop 1	Shop 2	Shop 3
0.2	0.3	0.5

where $w_1 = 0.2$, $w_2 = 0.3$ and $w_3 = 0.5$.

The table below shows how many items is required by every supermarket in all considered locations during two days.

Shop_Demand									
Shop 1 Shop 2 Shop 3									
150	500	300							

Information about when (date) and where (London Borough) the given supermarket is available to accept part of the above total demand (see the table called Shop_Demand above) but how much it will accept it depends on the supply ib the given Borough and Demand Weights.

If it is "+" (True) the the supermarket is available to accept the items on the particular date and London Borough (location) and it does not accept otherwise (when it is "-" or False).

81	Data	Landan Barrayah	Shop De	emand Ava	ilability
N	Date	London Borough	Shop 1	Shop 2	Shop 3
1	11/06/2022	Camden)(5)	NE)	536
2	11/06/2022	Ealing	949	16	0. 1 6
3	11/06/2022	Greenwich	954	+	836
4	11/06/2022	Hounslow	044	·+	1
5	11/06/2022	Richmond upon Thames	+	1.20	3.26
6	11/06/2022	Hammersmith and Fulham	+	100	0 16
7	11/06/2022	Kensington and Chelsea	+	+	856
8	11/06/2022	City of Westminster	+	0.45	· +
9	12/06/2022	Camden	374		
10	12/06/2022	Ealing	(44)	3.23	+
11	12/06/2022	Greenwich	874	+	
12	12/06/2022	Hounslow	(54-)	4	14
13	12/06/2022	Richmond upon Thames	+	-	-
14	12/06/2022	Hammersmith and Fulham	4	2.23	+
15	12/06/2022	Kensington and Chelsea	+	+	-
16	12/06/2022	City of Westminster	+	+	+
17	Total	(a+)	150	500	300

```
In [ ]: ▶ # We define the INPUTS in this cell!!!
            nShops = 3
            dates = ["11/06/2022"] * 8 + ["12/06/2022"] * 8
            London Boroughs = ["Camden",
                               "Ealing",
                               "Greenwich",
                               "Hounslow",
                               "Richmond upon Thames",
                               "Hammersmith and Fulham",
                               "Kensington and Chelsea",
                               "City of Westminster"] * 2
            Demand Weights = {"Shop 1": 0.2, "Shop 2": 0.3, "Shop 3": 0.5}
            print("Demand Weights: ", Demand Weights)
            Shop Demand = {"Shop 1": 150, "Shop 2": 500, "Shop 3": 300}
            print("Shop Demand: ", Shop Demand)
            Avalablity Shop 1 = [False, False, False, False, True, True, True] * 2
            Avalablity Shop 2 = [False, False, True, True] * 4
            Avalablity Shop 3 = [False, True] * 8
            demand = pd.DataFrame({"date": dates,
                                   "London Borough": London Boroughs,
                                   "Avalablity Shop 1": Avalablity Shop 1,
                                   "Avalablity Shop 2": Avalablity Shop 2,
                                   "Avalablity Shop 3": Avalablity_Shop_3})
            demand
```

The information about Supply include the probability of supply over different London Borough (location) and daily total amount of the supplied items (see Table below).

The probability could be different for different supplier but in our example it is the same for simplicity of presentation.

				Sup	ply	
N	Date	London Borough	Supp	lier 1	Supplier 2	
		1000	Probability	Daily Total	Probability	Daily Tota
1	11/06/2022	Camden	0.118		0.118	
2	11/06/2022	Ealing	0.157		0.157	
3	11/06/2022	Greenwich	0.118		0.118	
4	11/06/2022	Hounslow	0.220	255	0.220	255
5	11/06/2022	Richmond upon Thames	0.078	255	0.078	255
6	11/06/2022	Hammersmith and Fulham	0.118 0.157 0.118 0.220 5 0.078 m 0.192 a 0.039 0.078 0.118 0.157 0.118 0.157 0.118 0.220 5 0.078 m 0.192		0.192	
7	11/06/2022	Kensington and Chelsea		0.039		
8	11/06/2022	City of Westminster	0.078	255	0.078	
9	12/06/2022	Camden	0.118		0.118	
10	12/06/2022	Ealing	0.157		0.157	
11	12/06/2022	Greenwich	0.118		0.118	
12	12/06/2022	Hounslow	0.220	F10	0.220	255
13	12/06/2022	Richmond upon Thames	0.078	510	0.078	255
14	12/06/2022	Hammersmith and Fulham	0.192		0.192	
15	12/06/2022	Kensington and Chelsea	0.039		0.039	
16	12/06/2022	City of Westminster	0.078		0.078	
17		Total	2	765	2	510

We finish definition of INPUTS at this point. Below we have our computations based on the above inputs.

In the rest of the script we use blue colour to show values that can be considered as Inputs to the following cell and red one as the Output.

1 We need to find how many supplied items is available for every supermarket given day and London Borough (location)

1.1 We multiply Shop Demand Availablity by Deman Weights

NI	Date	Landan Barawah	Shop De	emand Ava	ilability	De	mand Wei	ght
N	Date	London Borough	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2 0 0 0.3 0.3 0 0 0.3 0.3 0 0 0.3 0.3 0 0 0.3 0.3	Shop 3
1	11/06/2022	Camden	SES	- 3	3	0	0	0
2	11/06/2022	Ealing	198	-3	+	0	0	0.5
3	11/06/2022	Greenwich	8/25	+	-31	0	0.3	0
4	11/06/2022	Hounslow	198	+	+	0	0.3	0.5
5	11/06/2022	Richmond upon Thames	+	- 8	75	0.2	0	0
6	11/06/2022	Hammersmith and Fulham	0.40	-0	+	0.2	0	0.5
7	11/06/2022	Kensington and Chelsea	+	+	-31	0.2	0.3	0
8	11/06/2022	City of Westminster	0#8	1.6	+	0.2	0.3	0.5
9	12/06/2022	Camden	1.5	8	15	0	0	0
10	12/06/2022	Ealing	3.29	-20	+	0	0	0.5
11	12/06/2022	Greenwich		+	-	0	0.3	0
12	12/06/2022	Hounslow	2.23	- +	+	0	0.3	0.5
13	12/06/2022	Richmond upon Thames	+	8	=	0.2	0	0
14	12/06/2022	Hammersmith and Fulham	+	-2	+	0.2	0	0.5
15	12/06/2022	Kensington and Chelsea	+	+	-	0.2	0.3	0
16	12/06/2022	City of Westminster	+	- +	+	0.2	0.3	0.5
17	Total	3.60	150	500	300		-	

```
In []: M for i in range(1, nShops + 1):
         demand["Weight Shop " + str(i)] = \
          demand["Avalablity Shop " + str(i)].apply(lambda x: Demand_Weights["Shop " + str(i)] * x)
#
demand
```

1.2 For every row normalise Deman Weights after above multiplication that they sum to 1 over all supermarkets.

In order to normalise we divide weights by its sum. If the sum of Demand Weights in row is equal to 0 (see Camden Borough) we do not change anything - keep this row all zeros.

61	Dete	Conden Borrera	Shop De	emand Ava	ilability	De	mand Wei	ght	Row No	ormalised	Weight
N	Date	London Borough	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3
1	11/06/2022	Camden	.596	- 3	3	0	0	0	0	0	0
2	11/06/2022	Ealing	ne:	-3	+	0	0	0.5	0	0	1
3	11/06/2022	Greenwich	15/20	+	126	0	0.3	0	0	1	0
4	11/06/2022	Hounslow	1983	1.8	1.4	0	0.3	0.5	0	0.375	0.625
5	11/06/2022	Richmond upon Thames	+	- 8	26	0.2	0	0	1	0	0
6	11/06/2022	Hammersmith and Fulham	1	-8	+	0.2	0	0.5	0.285714	0	0.714286
7	11/06/2022	Kensington and Chelsea	+	+	- 36	0.2	0.3	0	0.4	0.6	0
8	11/06/2022	City of Westminster	0+	1.6	1 +	0.2	0.3	0.5	0.2	0.3	0.5
9	12/06/2022	Camden	1.5	ā	8	0	0	0	0	0	0
10	12/06/2022	Ealing	141	2	+	0	0	0.5	0	0	1
11	12/06/2022	Greenwich	-	+	18	0	0.3	0	0	1	0
12	12/06/2022	Hounslow	2.23	+	+	0	0.3	0.5	0	0.375	0.625
13	12/06/2022	Richmond upon Thames	+	8	-	0.2	0	0	1	0	0
14	12/06/2022	Hammersmith and Fulham	+	2	+	0.2	0	0.5	0.285714	0	0.714286
15	12/06/2022	Kensington and Chelsea	+	+	18	0.2	0.3	0	0.4	0.6	0
16	12/06/2022	City of Westminster	+	+	+	0.2	0.3	0.5	0.2	0.3	0.5
17	Total	5-1	150	500	300				~		

```
In []: N for i in range(1, nShops + 1):
    if i == 1:
        demand["Weight Shop SUM"] = demand["Weight Shop " + str(i)].copy()
    else:
        demand["Weight Shop SUM"] += demand["Weight Shop " + str(i)].copy()

#
for i in range(1, nShops + 1):
    demand["row Normalised Weight Shop " + str(i)] = \
    demand.apply(lambda x: x["Weight Shop " + str(i)] / x["Weight Shop SUM"] if x["Weight Shop SUM"] > 0 else 0, \
        axis = 1)

#
demand
```

1.3 Find the quantity of items that suppliers can provide for the given date and London Borough (location).

For every date we apply D'hont algorithm that uses Supplier probabilities (vector of eight elements, for example, (0.118, 0.157, 0.118, 0.220, 0.078, 0.192, 0.039, 0.078)) and Supplier Total (for example, 255) given the date and supplier. In our further calculation we only need all available supply (see column "ALL" below) per London Borough.

						Supply			
N	Date	London Borough		Supplier 1		Suppli	ier 2		A11
		765	Probability	Quantity	Total	Probability	Quantity	Total	ALL
1	11/06/2022	Camden	0.118	30		0.118	30	4	60
2	11/06/2022	Ealing	0.157	40		0.157	40		80
3	11/06/2022	Greenwich	0.118	30		0.118	30		60
4	11/06/2022	Hounslow	0.220	56		0.220	56	255	112
5	11/06/2022	Richmond upon Thames	0.078	20	255	0.078	20	255	40
6	11/06/2022	Hammersmith and Fulham	0.192	49		0.192	49		98
7	11/06/2022	Kensington and Chelsea	0.039	10		0.039	10		20
8	11/06/2022	City of Westminster	0.078	20		0.078	20		40
9	12/06/2022	Camden	0.118	60		0.118	30		90
10	12/06/2022	Ealing	0.157	80		0.157	40		120
11	12/06/2022	Greenwich	0.118	60		0.118	30		90
12	12/06/2022	Hounslow	0.220	112	510	0.220	56	255	168
13	12/06/2022	Richmond upon Thames	0.078	40	510	0.078	20	255	60
14	12/06/2022	Hammersmith and Fulham	0.192	98		0.192	10 20 30 40 30 56		147
15	12/06/2022	Kensington and Chelsea	0.039	20		0.039	10		30
16	12/06/2022	City of Westminster	0.078	40		0.078	20		60
17		Total		765	765		510	510	1275

```
In [ ]: ▶ #
            nSuppliers = 2
            nDays
                       = 2
            Dates = ["11/06/2022", "12/06/2022"]
            Quantity Supplied given Supplier = {"1": [], "2": []}
            for i in range(1, nSuppliers + 1):
                for k in range(1, len(Dates) + 1):
                    Date = Dates[k - 1]
                                          = supply df[supply df["date"] == Date]["supplier " + str(i) + " prob"].values
                    prob
                    supplied daily amount = Daily Total Supplied Quantity["Day " + str(k) + \
                                                                          ", ALL Quantity, Supplier " + str(i)]
                    Quantity Supplied given Supplier Date = dhontAD(supplied daily amount, prob)
                    Quantity Supplied given Supplier[str(i)] = \
                    Quantity_Supplied_given_Supplier[str(i)] + list(Quantity_Supplied_given_Supplier_Date)
                supply_df["supplier " + str(i) + " quantity"] = Quantity_Supplied_given_Supplier[str(i)]
                supply_df["supplier " + str(i) + " quantity"] = supply_df["supplier " + str(i) + " quantity"].astype(int)
            supply_df["Supplier ALL"] = supply_df["supplier 1 quantity"] + supply_df["supplier 2 quantity"]
            supply df
```

1.4 Evaluate how many items can be supplied to the given shop

We join demand and supply_df tables and then apply DHont algorithm for every row using Row Normalised Weights (see demand table above) and Supplier ALL (see supply_df above) as following:

N	Data	Landan Bassish	Shop De	emand Ava	ilability	De	mand Wei	ight	Row No	ormalised	Weight	Sup	ply AS Den	nand
IN	Date	London Borough	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3
1	11/06/2022	Camden	1.54	8	8	0	0	0	0	0	0	0	0	0
2	11/06/2022	Ealing	2.23	- 2	+	0	0	0.5	0	0	1	0	0	80
3	11/06/2022	Greenwich	1 = 1	+	8	0	0,3	0	0	1	0	0	60	0
4	11/06/2022	Hounslow	121	+	14	0	0.3	0.5	0	0.375	0.625	0	42	70
5	11/06/2022	Richmond upon Thames	+	8	8	0.2	0	0	1	0	0	40	0	0
6	11/06/2022	Hammersmith and Fulham	+	- 2	+	0.2	0	0.5	0.285714	0	0.714286	28	0	70
7	11/06/2022	Kensington and Chelsea	+	+	18	0.2	0.3	0	0.4	0.6	0	8	12	0
8	11/06/2022	City of Westminster	+	4	14	0.2	0.3	0.5	0.2	0.3	0.5	8	12	20
9	12/06/2022	Camden	3.75	5	-51	0	0	0	0	0	0	0	0	0
10	12/06/2022	Ealing	2	- 12	+	0	0	0.5	0	0	1	0	0	120
11	12/06/2022	Greenwich	5.55	+		0	0.3	0	0	1	0	0	90	0
12	12/06/2022	Hounslow	12	+	+	0	0.3	0.5	0	0.375	0.625	0	63	105
13	12/06/2022	Richmond upon Thames	+	-	-	0.2	0	0	1	0	0	60	0	0
14	12/06/2022	Hammersmith and Fulham	+	- 12	+	0.2	0	0.5	0.285714	0	0.714286	42	0	105
15	12/06/2022	Kensington and Chelsea	+	+		0.2	0.3	0	0.4	0.6	0	12	18	0
16	12/06/2022	City of Westminster	+	+	+	0.2	0.3	0.5	0.2	0.3	0.5	12	18	30
17	Total		150	500	300				8			210	315	600

Note that, DHont algorithm in this case can be implemented in BigQuery using Keras because the number of shops given the supermarket network in the London Borough is less than 233155. this constrain comes from restriction that Keras in BigQuery process data in batches around 233155 elements in the batch.

1.5 Evaluation of Available Demand

We find the minimum between what is required and what is available for the given supermarket network:

Super Market	Demand	Supply	Available Demand
Shop 1	150	210	150
Shop 2	500	315	315
Shop 3	300	600	300

```
In []: In [
```

1.6 Summary

The only purpose of the Section 1 is to find Available Demand per supermarket or demand that can be fulfill

Available Demand: {'shop 1': 150, 'shop 2': 315, 'shop 3': 300}

and Supply AS Demand that can be used for weight calculation in the nexr Section:

Sup	ply AS Den	nand
Shop 1	Shop 2	Shop 3
0	0	0
0	0	80
0	60	0
0	42	70
40	0	0
28	0	70
8	12	0
8	12	20
0	0	0
0	0	120
0	90	0
0	63	105
60	0	0
42	0	105
12	18	0
12	18	30
210	315	600

2. Final Allocation of Items given Date, Borough and Shop

2.1 Column Normalise Weights

For every shop of Supply AS Demand win order to compute weight we divide the every value of Supply AS Demand by the corresponding column total. If we sum any column of the obtained weight we get 1.

7.60	D-4-	Foodoo waterings	Sup	ply AS Den	nand	Column	Normalise	d Weight
N	Date	London Borough	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3
1	11/06/2022	Camden	0	0	0	0	0	0
2	11/06/2022	Ealing	0	0	80	0	0	0.133333
3	11/06/2022	Greenwich	0	60	0	0	0.190476	0
4	11/06/2022	Hounslow	0	42	70	0	0.133333	0.116667
5	11/06/2022	Richmond upon Thames	40	0	0	0.190476	0	0
6	11/06/2022	Hammersmith and Fulham	28	0	70	0.133333	0	0.116667
7	11/06/2022	Kensington and Chelsea	8	12	0	0.038095	0.038095	0
8	11/06/2022	City of Westminster	8	12	20	0.038095	0.038095	0.033333
9	11/06/2022	Camden	0	0	0	0	0	0
10	12/06/2022	Ealing	0	0	120	0	0	0.2
11	12/06/2022	Greenwich	0	90	0	0	0.285714	0
12	12/06/2022	Hounslow	0	63	105	0	0.2	0.175
13	12/06/2022	Richmond upon Thames	60	0	0	0.285714	0	0
14	12/06/2022	Hammersmith and Fulham	42	0	105	0.2	0	0.175
15	12/06/2022	Kensington and Chelsea	12	18	0	0.057143	0.057143	0
15	12/06/2022	City of Westminster	12	18	30	0.057143	0.057143	0.05
17	Total	-	210	315	600	1	1	1

2.2 Final Allocations of Items to Shops

We use the column normalised weight and Available Demand as inputs to DHont algorithm. Output of Dhont algorithm is the final allocation of Items to the shop as following:

2.1	D-4-	reside estimate	Sup	ply AS Den	nand	Column	Normalise	d Weight	Fir	nal Allocati	on
N	Date	London Borough	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3	Shop 1	Shop 2	Shop 3
1	11/06/2022	Camden	0	0	0	0	0	0	0	0	0
2	11/06/2022	Ealing	0	0	80	0	0	0.133333	0	0	40
3	11/06/2022	Greenwich	0	60	0	0	0.190476	0	0	60	0
4	11/06/2022	Hounslow	0	42	70	0	0.133333	0.116667	0	42	35
5	11/06/2022	Richmond upon Thames	40	0	0	0.190476	0	0	29	0	0
6	11/06/2022	Hammersmith and Fulham	28	0	70	0.133333	0	0.116667	20	0	35
7	11/06/2022	Kensington and Chelsea	8	12	0	0.038095	0.038095	0	5	12	0
8	11/06/2022	City of Westminster	8	12	20	0.038095	0.038095	0.033333	5	12	10
9	11/06/2022	Camden	0	0	0	0	0	0	0	0	0
10	12/06/2022	Ealing	0	0	120	0	0	0.2	0	0	60
11	12/06/2022	Greenwich	0	90	0	0	0.285714	0	0	90	0
12	12/06/2022	Hounslow	0	63	105	0	0.2	0.175	0	63	53
13	12/06/2022	Richmond upon Thames	60	0	0	0.285714	0	0	44	0	0
14	12/06/2022	Hammersmith and Fulham	42	0	105	0.2	0	0.175	31	0	52
15	12/06/2022	Kensington and Chelsea	12	18	0	0.057143	0.057143	0	8	18	0
15	12/06/2022	City of Westminster	12	18	30	0.057143	0.057143	0.05	8	18	15
17	Total	8	210	315	600	1	1	1	150	315	300

Test: Available Demand has to be equal to the corresponding Final Allocation

```
In []: # Test: final Allocation should be equalt to Available_Demand.
print("Available_Demand: ", Available_Demand)
demand_supply[["Final Allocation Shop 1", "Final Allocation Shop 2", "Final Allocation Shop 3"]].sum(axis = 0)
```